# chemfp Documentation

Release 3.5

**Andrew Dalke** 

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chemfp is a set of command-line tools and a Python package for working with cheminformatics fingerprints.

This is the documentation for the commercial version of chemfp, which supports Python 2.7 and 3.6 or later. The documentation for chemfp 1.6.1, the most recent version of the no-cost/open source version of chemfp, is available from http://chemfp.readthedocs.io/en/chemfp-1.6.1/. Chemfp 1.6.1 only supports Python 2.7.

NOTE: While chemfp 1.x will support Python 2.7 for benchmarking purposes, chemfp 3.5 will be the last version of the main chemfp development track to support Python 2.7.

Most people will use the *command-line programs* to generate and search fingerprint files. *ob2fps*, *oe2fps*, *rdkit2fps*, and *cdk2fps* use respectively the Open Babel, OpenEye, RDKit and CDK chemistry toolkits to convert structure files into fingerprint files. *sdf2fps* extracts fingerprints encoded in SD tags to make the fingerprint file. *simsearch* finds targets in a fingerprint file which are sufficiently similar to the queries. *fpcat* converts between FPS and FPB formats and merges multiple fingerprint files into one.

The programs are built using the *chemfp Python library API*. The search capabilities are part of the public API, as well as a cross-toolkit API for reading and writing molecules from structure files or strings, and for computing molecular fingerprints. To get started, see the examples of how *to use the chemfp API*.

Remember: chemfp cannot generate fingerprints from a structure file without a third-party chemistry toolkit.

Chemfp 3.5 was released on 27 January 2021. See What's New for a description of the changes.

The Python 2.7 version was tested with Open Babel 2.4.0 and RDKit 2018.09.3, which are the last versions of those toolkits to support Python 2.7. The Python 3.x version should work with any recent version of OEChem/OEGraphSim, Open Babel, RDKit or CDK.

For a different, more scholarly discussion of chemfp see "The chemfp project" in the Journal of Cheminformatics. That paper covers the purpose of the project, its architecture and design, the FPS and FPB file formats, and the experience in trying to run chemfp as a self-funded open source project.

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## CHAPTER 1

Installing

Chemfp 3.5 is available as a pre-compiled package or a source distribution.

## 1.1 Installing a pre-compiled package

Pre-compiled packages for chemfp are available for Python 2.7, Python 3.6, Python 3.7, Python 3.8 and Python 3.9. They were compiled under the "manylinux1" and "manylinux2014" Docker build environment, which means they should work for most Linux-based operating systems.

These binary packages are NOT open source. By default they are distributed under the Chemfp Base License Agreement v1.1, which lets you use some of the chemfp functionality for internal purposes, including the ability to create FPS files and use the "toolkit" APIs.

However, the following features require a time-limited license key:

- generate FPB files
- create or search in-memory fingerprint arenas with more than 50,000 fingerprints
- perform Tversky searches
- perform Tanimoto searches of FPS files with more than 20 queries at a time.

These features can be enabled with a valid license key, set via the environment variable CHEMFP\_LICENSE. Email sales@dalkescientific.com to request a evaluation license or to purchase a license.

Use the following command to install a pre-compiled version of chemfp:

```
python -m pip install chemfp -i https://chemfp.com/packages/
```

If you get the message:

ERROR: Could not find a version that satisfies the requirement chemfp (from versions:  $\_$   $\_$ none)

ERROR: No matching distribution found for chemfp

then you are likely installing from a non-Linux-based operating system like macOS or Microsoft Windows. Pre-compiled installers are not yet available for those OSes. Currently macOS is supported in the source distribution and Windows is not yet supported.

### 1.2 Installing from source

The chemfp source distribution requires that Python and a C compiler be installed in your machines. Since chemfp doesn't yet run on Microsoft Windows (for tedious technical reasons), then your machine likely already has both Python and a C compiler installed. In case you don't have Python, or you want to install a newer version, you can download a copy of Python from http://www.python.org/download/. If you don't have a C compiler, .. well, do I really need to give you a pointer for that?

You may use chemfp 3.5 with either Python 2.7, or Python 3.6 or newer.

The core chemfp functionality does not depend on a third-party library but you will need a chemistry toolkit in order to generate new fingerprints from structure files. chemfp supports the free Open Babel, RDKit, and CDK toolkits and the proprietary OEChem/OEGraphSim toolkits. Make sure you install the Python libraries for the toolkit(s) you select.

The easiest way to install chemfp is with the pip installer. This comes with Python 2.7.9 or later, and with Python 3.4 and later so is almost certainly installed if you have Python. To install the source distribution tar.gz file with pip:

```
python -m pip install chemfp-3.5.tar.gz
```

Otherwise you can use Python's standard "setup.py". Read http://docs.python.org/install/index.html for details of how to use it. The short version is to do the following:

```
tar xf chemfp-3.5.tar.gz
cd chemfp-3.5
python setup.py build
python setup.py install
```

The last step may need a sudo if you otherwise cannot write to your Python site-package. A far better option is to use a virtual environment.

## 1.3 Configuration options

The setup.py file has several compile-time options which can be set either from the python setup.py build command-line or through environment variables. The environment variable solution is the easiest way to change the settings under pip.

```
--with-openmp, --without-openmp
```

4

Chemfp uses OpenMP to parallelize multi-query searches. The default is --with-openmp. If you have a very old version of gcc, or an older version of clang, or are on a Mac where the default clang-based compiler doesn't support OpenMP, then you will need to use --without-openmp to tell setup.py to compile without OpenMP:

```
python setup.py build --without-openmp
```

You can also set the environment variable CHEMFP\_OPENMP to "1" to compile with OpenMP support, or to "0" to compile without OpenMP support:

```
CHEMFP_OPENMP=0 python -m pip install chemfp-3.4.tar.gz
```

Note: you can use the environment variable CC to change the C compiler. For example, the clang compiler on Mac doesn't support OpenMP so I installed gcc-10 using *Homebrew <https://brew.sh/>* and compiled chemfp using:

```
CC=gcc-10 python -m pip install chemfp-3.5.tar.gz
```

#### --with-ssse3, --without-ssse3

Chemfp by default compiles with SSSE3 support, which was first available in 2006 so almost certainly available on your Intel-like processor. In case I'm wrong (are you compiling for ARM? If so, send me any compiler patches), you can disable SSSE3 support using the --without-ssse3, or set the environment variable CHEMFP\_SSSE3 to "0".

#### --with-avx2, --without-avx2

Chemfp 3.0 added support for the AVX2 instruction set. This can be 30% faster than the POPCNT instruction for 1024 or 2048 bit fingerprints. By default it is enabled, and chemfp checks that the chip implements AVX2 before calling the functions which are explicitly written with AVX2.

Use --without-avx2 or set the environment variable CHEMFP\_AVX2 to "0" to disable it.

#### --arch=NAME

By default the compiler generates code that works on a variety of processors. This may mean the compiler avoids using some processor-specific features which aren't available on all of the processors in the base feature set. For example, it may avoid AVX2 instructions if the compiler has been configured to also support processors without AVX2 instructions.

The --arch option configures the compiler to compile chemfp for then named architecture. For example, if you are compiling chemfp on the machine on the same machine where you will run it, you might specify -arch native so the generated code is optimized for that machine.

For gcc and clang, this is converted into -march=native.

If you are benchmarking chemfp then you should configure the compiler so it optimizes for the specific hardware architecture you are testing.

**Note:** This option is experimental and may be removed in the next version. It is probably better to set this compiler option yourself via CC or CFLAGS.

## 1.4 Installing CDK and JPype

CDK is a Java package. Chemfp is written for Python. How can chemfp call into CDK?

There are several ways for Python programs to call into Java. I tried two of them and ended up using JPype, following Noel O'Boyle's suggestion.

There are a few ways to install JPype. The easiest is likely to use conda (see the documentation for details) or, if you have the Java run-time, you can pip install it with:

```
python -m pip install JPype1
```

This installs the *jpype* module for Python.

You'll also need to put the CDK JAR on the CLASSPATH. For example, in the following I download the JAR file then set the CLASSPATH using bash syntax:

```
cd ~/ftps
curl -LO https://github.com/cdk/cdk/releases/download/cdk-2.3/cdk-2.3.jar
export CLASSPATH=/Users/dalke/ftps/cdk-2.3.jar
```

(I put my manually downloaded packages in ~/ftps/ for historic reasons.)

Use cdk2fps --version to diagnose if things are working. If it's a success it should look like:

```
% cdk2fps --version cdk2fps 3.5
```

The following message occurs if jpype isn't installed:

```
Cannot run cdk2fps: Cannot import jpype, which is required for chemfp to access the CDK jar: No module named 'jpype'
```

The following message occurs if jpype is installed (eg, via pip) but either Java isn't installed on your machine or jpype couldn't find your installation:

```
Cannot run cdk2fps: No JVM shared library file (libjvm.so) found. Try setting up the JAVA_HOME environment variable properly.
```

The following message occurs if the CDK JAR file is not on the CLASSPATH:

```
Cannot run cdk2fps: It appears that CDK is not installed: Unable to access the CDK jar via JPype. Is the jar on your CLASSPATH?: Failed to import 'org.openscience'
```

The following message occurs if you are using Python 2 (jpype and therefore chemfp does not support Python 2):

```
Cannot run cdk2fps: Unable to use cdk2fps on Python 2
```

## Working with the command-line tools

The sections in this chapter describe examples of using the command-line tools to generate fingerprint files and to do similarity searches of those files.

## 2.1 Generate fingerprint files from PubChem SD tags

In this section you'll learn how to create a fingerprint file from an SD file which contains pre-computed CACTVS fingerprints. You do not need a chemistry toolkit for this section.

PubChem is a great resource of publically available chemistry information. The data is available for ftp download. We'll use some of their SD formatted files. Each record has a PubChem/CACTVS fingerprint field, which we'll extract to generate an FPS file.

Start by downloading the files Compound\_099000001\_099500000.sdf.gz (from ftp://ftp.ncbi.nlm. nih.gov/pubchem/Compound/CURRENT-Full/SDF/Compound\_099000001\_099500000.sdf.gz ) and Compound\_048500001\_049000000.sdf.gz (from ftp://ftp.ncbi.nlm.nih.gov/pubchem/Compound/CURRENT-Full/SDF/Compound\_048500001\_049000000.sdf.gz ). At the time of writing they contain 10,826 and 14,967 records, respectively. (I chose some of the smallest files so they would be easier to open and review.)

Next, convert the files into fingerprint files. On the command line do the following two commands:

```
sdf2fps --pubchem Compound_099000001_099500000.sdf.gz -o pubchem_queries.fps sdf2fps --pubchem Compound_048500001_049000000.sdf.gz -o pubchem_targets.fps
```

Congratulations, that was it!

If you're curious about what an FPS file looks like, here are the first 10 lines of pubchem\_queries.fps, with some of the lengthy fingerprint lines replaced with an ellipsis:

```
#FPS1
#num_bits=881
#type=CACTVS-E_SCREEN/1.0 extended=2
```

(continued from previous page)

How does this work? Each PubChem record contains the precomputed CACTVS substructure keys in the PUBCHEM\_CACTVS\_SUBSKEYS tag. Here's what it looks like for record 99000039, which is the first record in Compound 099000001 099500000.sdf.gz:

The --pubchem flag tells sdf2fps to get the value of that tag and decode it to get the fingerprint. It also adds a few metadata fields to the fingerprint file header.

The order of the FPS fingerprints are the same as the order of the corresponding record in the SDF. You can see that in the output, where 99000039 is the first record in the FPS fingerprints.

If you store records in an SD file then you almost certainly don't use the same fingerprint encoding as PubChem. sdf2fps can decode from a number of encodings, like hex and base64. Use --help to see the list of available decoders.

The example uses -o to have sdf2fps write the output to a file instead of to stdout. By default, filenames ending in ".fps" are saved in FPS format. Use ".fps.gz" for the gzip-compressed FPS format and ".fps.zst" for the zstandard-compressed FPS format.

## 2.2 k-nearest neighbor search

In this section you'll learn how to search a fingerprint file to find the k-nearest neighbors. You will need the FPS fingerprint files generated in *Generate fingerprint files from PubChem SD tags* but you do not need a chemistry toolkit.

We'll use the pubchem\_queries.fps as the queries for a k=2 nearest neighor similarity search of the target file puchem\_targets.gps:

```
simsearch -k 2 -q pubchem_queries.fps pubchem_targets.fps
```

That's all! You should get output which starts:

```
#Simsearch/1
#num_bits=881
#type=Tanimoto k=2 threshold=0.0
#software=chemfp/3.4
#queries=pubchem_queries.fps
#targets=pubchem_targets.fps
```

(continued from previous page)

#query_source=Compound_099000001_099500000.sdf.gz									
#ta	#target_source=Compound_048500001_049000000.sdf.gz								
2	99000039	48503376	0.8785	48503380	0.8729				
2	99000230	48563034	0.8588	48731730	0.8523				
2	99002251	48798046	0.8110	48625236	0.8107				
2	99003537	48997075	0.9036	48997697	0.8985				

Here's how to interpret the output. The lines starting with '#' are header lines. It contains metadata information describing that this is a similarity search report. You can see the search parameters, the name of the tool which did the search, and the filenames which went into the search.

After the '#' header lines come the search results, with one result per line. There are in the same order as the query fingerprints. Each result line contains tab-delimited columns. The first column is the number of hits. The second column is the query identifier used. The remaining columns contain the hit data, with alternating target id and its score.

For example, the first result line contains the 2 hits for the query 99000039. The first hit is the target id 48503376 with score 0.8785 and the second hit is 48503380 with score 0.8729. Since this is a k-nearest neighor search, the hits are sorted by score, starting with the highest score. Do be aware that ties are broken arbitrarily. There may be additional hits with the score 0.8729 which are not reported.

#### 2.3 Threshold search

In this section you'll learn how to search a fingerprint file to find all of the neighbors at or above a given threshold. You will need the FPS fingerprint files generated in *Generate fingerprint files from PubChem SD tags* but you do not need a chemistry toolkit.

Let's do a threshold search and find all hits which are at least 0.85 similar to the queries:

```
simsearch --threshold 0.85 -q pubchem_queries.fps pubchem_targets.fps
```

The first 15 lines of output from this are:

```
#Simsearch/1
#num bits=881
#type=Tanimoto k=all threshold=0.85
#software=chemfp/3.4
#queries=pubchem_queries.fps
#targets=pubchem targets.fps
#query source=Compound 099000001 099500000.sdf.gz
#target source=Compound 048500001 049000000.sdf.gz
      99000039
                       48732162
                                        0.8596 48503380
                                                                 0.8729
                                                                         48503376
                                                                                           0.
→8785 48520532
                         0.8541
      99000230
                       48563034
                                        0.8588
                                                48731730
                                                                 0.8523
0
      99002251
                                        0.8724
                                                                 0.8535
                                                                                           0.
      99003537
                       48566113
                                                48998000
                                                                          48997697
<del>-</del>8985
       48997075
                         0.9036
      99003538
                                        0.8724 48998000
                                                                                           0.
                       48566113
                                                                 0.8535
                                                                         48997697
⇔8985 48997075
                         0.9036
0
      99005028
      99005031
```

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Take a look at the first result line, which contains the 4 hits for the query id 99000039. As before, the hit information alternates between the target ids and the target scores, but unlike the k-nearest search, the hits are not in a particular order. You can see that here where the scores are 0.8596, 0.8729, 0.8785, and 0.8541.

You might be wondering why I chose the 0.85 threshold, or decided to show only the first 15 lines of output. Quite simply, it was for presentation. With a threshold of 0.8, the first record has 41 hits, which requires 84 columns to show, which is a bit overwhelming.

#### 2.4 Combined k-nearest and threshold search

In this section you'll learn how to search a fingerprint file to find the k-nearest neighbors, where all of the hits must be at or above given threshold. You will need the fingerprint files generated in *Generate fingerprint files from PubChem SD tags* but you do not need a chemistry toolkit.

You can combine the -k and --threshold queries to find the k-nearest neighbors which are all at or above a given threshold:

```
simsearch -k 3 --threshold 0.7 -q pubchem_queries.fps pubchem_targets.fps
```

This find the nearest 3 structures, which all must be at least 0.7 similar to the query fingerprint. The output from the above starts:

#Simsearch/1							
#num_bits=881							
#type=Tanimoto k=3 threshold=0.7							
	ware=chemfp/3.						
	ries=pubchem_qu						
	gets=pubchem_ta						
#quer	y_source=Compo	und_099000001_09	99500000.sd	f.gz			
#targ	get_source=Comp	ound_048500001_0	049000000.s	df.gz			
3	99000039	48503376	0.8785	48503380	0.8729	48732162	0.
<del>-</del> 859	96						
3	99000230	48563034	0.8588	48731730	0.8523	48583483	0.
<b>→841</b>							
3	99002251	48798046	0.8110	48625236	0.8107	48500395	0.
<del></del> 792							
3	99003537	48997075	0.9036	48997697	0.8985	48566113	0.
<del>-</del> 872	=						
3	99003538	48997075	0.9036	48997697	0.8985	48566113	0.
<b>→872</b>	=						
3	99005028	48651160	0.8288	48848576	0.8167	48660867	0.
<b>→800</b>	· <del>-</del>						_
3	99005031	48651160	0.8288	48848576	0.8167	48660867	0.
<b>→800</b>		40045044		4000000		405555	
3	99006292	48945841	0.9652	48737522	0.8793	48575758	0.
<u></u> ⇔853		40045044	0.0050	40727500	0.0700	40575750	_
3	99006293	48945841	0.9652	48737522	0.8793	48575758	0.
→853	99006597						
0		406EEE00	0 0210	48662591	0.0040	406E4EE2	0.
3	99006753	48655580	0.9310	40002591	0.9249	48654553	٥.
<u>→</u> 909	99009085	48561250	0.8503	48588162	0.8027	48675288	0.
3 		40001200	0.6503	40000102	0.0027	400/0200	0.
<i>↔131</i>	J						

The output format is identical to the previous two search examples, and because this is a k-nearest search, the hits are sorted from highest score to lowest.

## 2.5 NxN (self-similar) searches

In this section you'll learn how to use the same fingerprints as both the queries and targets, that is, a self-similarity search. You will need the pubchem\_queries.fps fingerprint file generated in *Generate fingerprint files from PubChem SD tags* but you do not need a chemistry toolkit.

Use the --NxN option if you want to use the same set of fingerprints as both the queries and targets. Using the pubchem\_queries.fps from the previous sections:

```
simsearch -k 3 --threshold 0.7 --NxN pubchem_queries.fps
```

This code is very fast because there are so few fingerprints. For larger files the --NxN will be about twice as fast and use half as much memory compared to:

```
simsearch -k 3 --threshold 0.7 -q pubchem_queries.fps pubchem_queries.fps
```

In addition, the --NxN option excludes matching a fingerprint to itself (the diagonal term).

### 2.6 Using a toolkit to process the ChEBI dataset

In this section you'll learn how to create a fingerprint file from a structure file. The structure processing and fingerprint generation are done with a third-party chemisty toolkit. chemfp supports Open Babel, OpenEye, RDKit and CDK. (OpenEye users please note that you will need an OEGraphSim license to use the OpenEye-specific fingerprinters.)

We'll work with data from ChEBI, which are "Chemical Entities of Biological Interest". They distribute their structures in several formats, including as an SD file. For this section, download the "lite" version from ftp://ftp.ebi.ac.uk/pub/databases/chebi/SDF/ChEBI\_lite.sdf.gz . It contains the same structure data as the complete version but many fewer tag data fields. For ChEBI 187 this file contains 107,207 records and the compressed file is 34MB.

Unlike the PubChem data set, the ChEBI data set does not contain fingerprints so we'll need to generate them using a toolkit.

#### 2.6.1 ChEBI record titles don't contain the id

Strangely, the ChEBI dataset does not use the title line of the SD file to store the record id. A simple examination shows that 58,288 of the title lines are empty, 39,524 have the title "null", 4,345 have the title " (with a single space), 1,983 have the title "ChEBI", 57 of them are labeled "Structure #1", and the others are usually compound names like 'fluprednidene acetate', 'bkas#30-CoA(4-)', and 'Compound 92'.

(I've asked ChEBI to fix this, to no success after many years. Perhaps you have more influence?)

Instead, the record id is stored as value of the "ChEBI ID" tag, which looks like:

```
> <ChEBI ID>
CHEBI:776
```

By default the toolkit-based fingerprint generation tools use the title as the identifier, and print a warning and skip the record if the identifier is missing. Here's an example with rdkit2fps:

```
% rdkit2fps ChEBI lite.sdf.gz
ERROR: Missing title in SD record, file 'ChEBI_lite.sdf.gz', line 1, record #1. Skipping.
ERROR: Missing title in SD record, file 'ChEBI lite.sdf.gz', line 62, record #2.11
→Skipping.
ERROR: Missing title in SD record, file 'ChEBI_lite.sdf.gz', line 100, record #3.
→Skipping.
ERROR: Missing title in SD record, file 'ChEBI_lite.sdf.gz', line 135, record #4.
→Skipping.
          ... skipping many lines ...
ERROR: Empty title in SD record after cleanup, file 'ChEBI_lite.sdf.gz', line 2019,
→record #32: first line is ' '. Skipping.
          ... skipping a lot more lines ...
#FPS1
#num bits=2048
#type=RDKit-Fingerprint/2 minPath=1 maxPath=7 fpSize=2048 nBitsPerHash=2 useHs=1
#software=RDKit/2020.03.1 chemfp/3.4
#source=ChEBI_lite.sdf.gz
#date=2020-05-12T09:36:52
031087 be 231150242 e714400920000 a 193c 1080 c 02858 a 1116 a 68100 a 588063428404052 a 193c 1080 c 193c 1080 c
53004080c8cc3c48114101b25081a10c025e634c08a1c00088102c0400121040a2080505
188a9c0a150000028211219c1001000981c4804417180aca0401408500180182210716db
1580708a0b8a0802820532854411200c1101040404001118600d0a518402385dc0001129
94d8d120020150b3d00043a24370000201042881d15018c0e0901442881d68604c4a8380
8110c772a824051948003c801360600221040010e20418381668404b0424ec130f05a090
                    ChEBI
c94960e0
00000000
                    ChEBI
210809600d11180010010200820108302804406016040100a4019100001204a12800000c
200093020522088a9005040028100000890048004af130e280000445000526496044c228
000a020a
                    null
           .... more lines omitted ...
```

That output shown contains three fingerprint records; the first two with the id "ChEBI" and the third with the id "ChEBI". The other records had no title and were skipped, with a message sent to stderr describing the problem and the location of the record containing the problem. (The "Empty title after cleanup" is because chemfp removes trailing whitespace on the title line. If nothing is left after cleanup then chemfp will report the problem.)

(If the first 100 records have no identifiers then the command-line tools will exit even if **--errors** is ignore. This is a safety mechanism. Let me know if it's a problem.)

Instead, use the --id-tag option to specify of the name of the data tag containing the id. For this data set

you'll need to write it as:

```
--id-tag "ChEBI ID"
```

The quotes are important because of the space in the tag name.

Here's what that looks like:

```
% rdkit2fps ChEBI_lite.sdf.gz --id-tag "ChEBI ID" | head -8 | fold
#FPS1
#num_bits=2048
#type=RDKit-Fingerprint/2 minPath=1 maxPath=7 fpSize=2048 nBitsPerHash=2 useHs=1
#software=RDKit/2020.03.1 chemfp/3.4
#source=ChEBI_lite.sdf.gz
#date=2020-05-12T09:44:29
30ad542718468104d521a214227b29ba3822fbf20e15491802a051532cd10d902c39b02b51648981
9 c87 eb41142811026 d510 a890 a711 cb02 f2090 ddacd 990 c5240 cc282090 640103 d0 a0a8b460184 f510 a0a8b460
11114e2a8060200804529804532313bb03912d5e2857a6028960189e370100052c63474748a1c000
a598741c014e9210bc30ab180f0162029d4c446aa01c34850071e4ff037a60e732fd85014344f82a
344aa98398654481b003a84f201f518f
                                                                                   CHEBI:90
0100010008000100001000010000022020000220000008000000400002100000000080000004401000\\
0008020002012004020300100080201010002421100000440000000100200003000001000100\\
2000010022000800002000020001400020800100025040000000200a080244000060008000000802
8100c801108000000041c00200800002
                                                                                    CHEBI: 165
```

In addition to "ChEBI ID" there's also a "ChEBI Name" tag which includes data values like "tropic acid" and "(+)-guaia-6,9-diene". Every ChEBI record has a unique name so the names could also be used as the primary identifier instead of its id.

To use the ChEBI Name as the primary chemfp identifier, specify:

```
--id-tag "ChEBI Name"
```

The FPS fingerprint file format allows identifiers with a space, or comma, or anything other tab, newline, and a couple of other bytes, so it's no problem using those names directly.

#### 2.6.2 Generate fingerprints with Open Babel

If you have the Open Babel Python library installed then you can use ob2fps to generate fingerprints:

```
ob2fps --id-tag "ChEBI ID" ChEBI_lite.sdf.gz -o ob_chebi.fps
```

This takes about 2m45s on my 2019-era laptop to process all of the records, and generates messages like:

(continued from previous page)

The default generates FP2 fingerprints, so the above is the same as:

```
ob2fps --FP2 --id-tag "ChEBI ID" ChEBI_lite.sdf.gz -o ob_chebi.fps
```

ob2fps can generate several other types of fingerprints. (Use --help for a list.) For example, to generate the Open Babel implementation of the MACCS definition specify:

```
ob2fps --MACCS --id-tag "ChEBI ID" ChEBI_lite.sdf.gz -o chebi_maccs.fps
```

#### 2.6.3 Generate fingerprints with OpenEye

If you have the OEChem Python library installed, with licenses for OEChem and OEGraphSim, then you can use oe2fps to generate fingerprints:

```
oe2fps --id-tag "ChEBI ID" ChEBI_lite.sdf.gz -o oe_chebi.fps
```

This takes about 33 seconds on my laptop and generates a number of warnings like "Stereochemistry corrected on atom number 17 of", "Unsupported Sgroup information ignored", and "Invalid stereochemistry specified for atom number 9 of". Normally the record title comes after the "... of", but the title is blank for most of the records.

OEChem could not parse 2 of the 107,207 records. I looked at the failing records (CHEBI:147324 and CHEBI:147325) and noticed that they have 0 atoms and 0 bonds. By default OEChem's SDF reader skips empty records. If you really need those records, add the SuppressEmptyMolSkip flag to the default 'flavor' reader argument, like this:

```
oe2fps --id-tag "ChEBI ID" ChEBI_lite.sdf.gz -o oe_chebi.fps \
-R flavor=Default,SuppressEmptyMolSkip
```

The default settings generate OEGraphSim path fingerprint with the values:

```
numbits=4096 minbonds=0 maxbonds=5 atype=Arom|AtmNum|Chiral|EqHalo|FCharge|HvyDeg|Hyb btype=Order|Chiral
```

Each of these can be changed through command-line options. Use --help for details.

oe2fps can generate several other types of fingerprints. For example, to generate the OpenEye implementation of the MACCS definition specify:

```
oe2fps --maccs166 --id-tag "ChEBI ID" ChEBI_lite.sdf.gz -o chebi_maccs.fps
```

Use --help for a list of available oe2fps fingerprints or to see more configuration details.

#### 2.6.4 Generate fingerprints with RDKit

If you have the RDKit Python library installed then you can use *rdkit2fps* to generate fingerprints. Based on the previous examples you probably guessed that the command-line is:

```
rdkit2fps --id-tag "ChEBI ID" ChEBI_lite.sdf.gz -o rdkit_chebi.fps
```

This takes about 5 minutes and 20 seconds on my laptop, and RDKit did not generate fingerprints for 242 of the 106,965 records. RDKit logs warning and error messages to stderr. They look like:

```
[11:48:30] WARNING: not removing hydrogen atom without neighbors
[11:48:30] Explicit valence for atom # 12 N, 4, is greater than permitted
[11:48:30]

****

Post-condition Violation
Element 'X' not found
Violation occurred on line 91 in file /Users/dalke/ftps/rdkit-Release_2020_03_1/Code/
GraphMol/PeriodicTable.h
Failed Expression: anum > -1

****

[11:48:30] Element 'X' not found
```

For example, RDKit is careful to check that structures make chemical sense. It rejects 4-valent nitrogen and refuses to process that those structures, which is the reason for the first line of that output.

The default generates RDKit's path fingerprints with parameters:

```
minPath=1 maxPath=7 fpSize=2048 nBitsPerHash=2 useHs=1
```

Each of those can be changed through command-line options. See rdkit2fps --help for details, where you'll also see a list of the other available fingerprint types.

For example, to generate the RDKit implementation of the MACCS definition use:

```
rdkit2fps --maccs166 --id-tag "ChEBI ID" ChEBI_lite.sdf.gz -o chebi_maccs.fps
```

while the following generates the Morgan/circular fingerprint with radius 3:

```
rdkit2fps --morgan --radius 3 --id-tag "ChEBI ID" ChEBI_lite.sdf.gz
```

### 2.6.5 Generate fingerprints with CDK

If you have the CDK Java JAR file on your CLASSPATH and you have installed the JPype1 package (see the [installation guide for help]) then you can use cdk2fps to generate fingerprints. Based on the previous examples you can probably guess that the command-line is:

```
cdk2fps --id-tag "ChEBI ID" ChEBI_lite.sdf.gz -o cdk_chebi.fps
```

This takes about 1 minute and 20 seconds on my laptop, and CDK did not generate fingerprints for 16 of the 107,207 structures. (This section of the documentation was written in just before the chemfp 3.5 release, with a different ChEBI download than the rest of this document.) CDK generated two warnings:

```
org.openscience.cdk.config.IsotopeFactory ERROR: Could not find major isotope for: 88 org.openscience.cdk.config.IsotopeFactory ERROR: Could not find major isotope for: 88
```

Chemfp lets you choose an *alternate error handler* (see the next section), which can help you figure out what happened. I'll enable the **report** error handler:

```
cdk2fps --id-tag "ChEBI ID" ChEBI_lite.sdf.gz -o cdk_chebi.fps --errors report
```

This generates 16 lines of the form:

```
ERROR: Cannot generate fingerprint: java.lang.NullPointerException, file 'ChEBI_lite.sdf.gz', record #8513. Skipping.
```

That means the record caused the CDK fingerprinter function to fail, by raising a Java NullPointerException, which chemfp catches and reports. For reference, that record is ChEBI ID CHEBI:5015.

(There is experimental support for letting chemfp's text toolkit parse the SD records and passing the text to CDK. This is enabled with the cdk.sdf.implementation value "chemfp", like this:

```
... --errors report -R implementation=chemfp
```

This adds line number information to the report:

```
ERROR: Cannot generate fingerprint: java.lang.NullPointerException, file 'ChEBI_lite.sdf.gz', line 539706, record #8513. Skipping.
```

This variant implementation took 1 minute and 30 seconds, so adds some overhead. Let me know if you find it useful.)

The default cdk2fps fingerprint type is CDK-Daylight with parameters:

```
size=1024 searchDepth=7 pathLimit=42000 hashPseudoAtoms=0
```

Each of those can be changed through command-line options. See cdk2fps --help for details, where you'll also see a list of the other available fingerprint types.

For example, to generate the CDK implementation of the MACCS definition use:

```
cdk2fps --MACCS --id-tag "ChEBI ID" ChEBI_lite.sdf.gz -o chebi_maccs.fps --errors report
```

This generates 22 report lines of the form:

```
ERROR: Cannot generate fingerprint: java.lang.NullPointerException:
Aromaticity model requires implicit hydrogen count is set., file
'ChEBI_lite.sdf.gz', record #2918. Skipping.
```

#### 2.7 Alternate error handlers

In this section you'll learn how to change the error handler for rdkit2fps using the --errors option.

By default the "<toolkit>2fps" programs "ignore" structures which could not be parsed into a molecule option. There are two other options. They can "report" more information about the failure case and keep on processing, or they can be "strict" and exit after reporting the error.

This is configured with the --errors option.

Here's the rdkit2fps output using --errors report:

```
[12:21:03] WARNING: not removing hydrogen atom without neighbors
[12:21:03] Explicit valence for atom # 12 N, 4, is greater than permitted
ERROR: Could not parse molecule block, file 'ChEBI_lite.sdf.gz', line 24228, record #380.

Skipping.
[12:21:03] Explicit valence for atom # 12 N, 4, is greater than permitted
ERROR: Could not parse molecule block, file 'ChEBI_lite.sdf.gz', line 24338, record #381.

Skipping.
```

The first two lines come from RDKit. The third line is from chemfp, reporting which record could not be parsed. (The record starts at line 24228 of the file.) The fourth line is another RDKit error message, and the last line is another chemfp error message.

Here's the rdkit2fps output using --errors strict:

```
[12:24:24] WARNING: not removing hydrogen atom without neighbors
[12:24:24] Explicit valence for atom # 12 N, 4, is greater than permitted
ERROR: Could not parse molecule block, file 'ChEBI_lite.sdf.gz', line 24228, record #380.

Exiting.
```

Because this is strict mode, processing exits at the first failure.

The ob2fps and oe2fps tools implement the **--errors** option, but they aren't as useful as rdkit2fps because the underlying APIs don't give useful feedback to chemfp about which records failed. For example, the standard OEChem file reader automatically skips records that it cannot parse. Chemfp can't report anything when it doesn't know there was a failure.

The default error handler in chemfp 1.1 was "strict". In practice this proved more annoying than useful because most people want to skip the records which could not be processed. They would then contact me asking what was wrong, or doing some pre-processing to remove the failure cases.

One of the few times when it is useful is for records which contain no identifier. When I changed the default from "strict" to "ignore" and tried to process ChEBI, I was confused at first about why the output file was so small. Then I realized that it's because the many records without a title were skipped, and there was no feedback about skipping those records.

I changed the code so missing identifiers are always reported, even if the error setting is "ignore". Missing identifiers will still stop processing if the error setting is "strict".

## 2.8 chemfp's two cross-toolkit substructure fingerprints

In this section you'll learn how to generate the two substructure-based fingerprints which come as part of chemfp. These are based on cross-toolkit SMARTS pattern definitions and can be used with Open Babel, OpenEye, and RDKit. (For OpenEye users, these fingerprints use the base OEChem library but do not use the separately licensed OEGraphSim library.)

chemfp implements two platform-independent fingerprints where were originally designed for substructure filters but which are also used for similarity searches. One is based on the 166-bit MACCS implementation in RDKit and the other comes from the 881-bit PubChem/CACTVS substructure fingerprints.

The chemfp MACCS definition is called "rdmaccs" because it closely derives from the MACCS SMARTS patterns used in RDKit. (These pattern definitions are also used in Open Babel and the CDK, while OpenEye has a completely independent implementation.)

Here are example of the respective rdmaccs fingerprint for phenol using each of the toolkits.

#### Open Babel:

```
% echo "c1ccccc10 phenol" | ob2fps --in smi --rdmaccs
#FPS1
#num_bits=166
#type=RDMACCS-OpenBabel/2
#software=OpenBabel/3.0.0 chemfp/3.5
#date=2021-01-27T14:45:40
0000000000000000000000000000140004480101e phenol
```

#### OpenEye:

```
% echo "c1ccccc10 phenol" | oe2fps --in smi --rdmaccs
#FPS1
#num_bits=166
#type=RDMACCS-OpenEye/2
#software=0EChem/2.3.0 (20191016) chemfp/3.5
#date=2021-01-27T14:46:03
0000000000000000000000000000140004480101e phenol
```

#### RDKit:

```
% echo "c1ccccc10 phenol" | rdkit2fps --in smi --rdmaccs
#FPS1
#num_bits=166
#type=RDMACCS-RDKit/2
#software=RDKit/2020.03.1 chemfp/3.5
#date=2021-01-27T14:46:22
0000000000000000000000000000140004480101e phenol
```

#### CDK:

For more complex molecules it's possible that different toolkits produce different fingerprint rdmaccs, even though the toolkits use the same SMARTS definitions. Each toolkit has a different understanding of chemistry. The most notable is the different definition of aromaticity, so the bit for "two or more aromatic rings" will be toolkit dependent.

#### 2.8.1 substruct fingerprints

chemp also includes a "substruct" substructure fingerprint. This is an 881 bit fingerprint derived from the PubChem/CACTVS substructure keys. They do not match the CACTVS fingerprints exactly, in part due

to differences in ring perception. Some of the substruct bits will always be 0. With that caution in mind, if you want to try them out, use the --substruct option.

The term "substruct" is a horribly generic name. If you can think of a better one then let me know. Until chemfp 3.0 I said these fingerprints were "experimental", in that I hadn't fully validated them against PubChem/CACTVS and could not tell you the error rate. I still haven't done that.

What's changed is that I've found out over the years that people are using the substruct fingerprints, even without full validatation. That surprised me, but use is its own form of validation. I still would like to validate the fingerprints, but it's slow, tedious work which I am not really interested in doing. Nor does it earn me any money. Plus, if the validation does lead to any changes, it's easy to simply change the version number.

## 2.9 Generate binary FPB files from a structure file

In this section you'll learn how to generate an FPB file instead of an FPS file. You will need the the ChEBI file from *Using a toolkit to process the ChEBI dataset* and a chemistry toolkit. The FPB format was introduced with chemfp-2.0.

**Note:** Several chemfp features, like creating FPB files, require a valid license key. If you are using chemfp under the Base License Agreement then contact sales@dalkescientific.com to purchase a license key or request an evaluation license.

The FPB format was designed so the fingerprints can be memory-mapped directly to chemfp's internal data structures. This makes it very fast to load, but unlike the FPS format, it's not so easy to write with your own code. You should think of the FPB format as an binary application format, for chemfp-based tools, while the FPS format is a text-based format for data exchange between diverse programs.

The easiest way to generate an FPB file from the command line is to use the ".fpb" extension instead of ".fps" or ".fps.gz". Here are examples using each of the toolkits.

Open Babel:

```
% ob2fps --id-tag "ChEBI ID" ChEBI_lite.sdf.gz -o ob_chebi.fpb
```

OpenEve:

```
% oe2fps --id-tag "ChEBI ID" ChEBI_lite.sdf.gz -o oe_chebi.fpb
```

RDKit:

```
% rdkit2fps --id-tag "ChEBI ID" ChEBI_lite.sdf.gz -o rdkit_chebi.fpb
```

CDK:

```
% cdk2fps --id-tag "ChEBI ID" ChEBI_lite.sdf.gz -o cdk_chebi.fpb
```

The binary format isn't human-readable. Use fpcat command-line options to see what's inside:

(continued from previous page)

```
#software=OEGraphSim/2.4.3 (20191016) chemfp/3.4
0000000 ... many zeros ...0000000000000 CHEBI:15378
0000000 ... many zeros ...000000000000 CHEBI:16042
0000000 ... many zeros ...0000000000000 CHEBI:17792
....
182b528 ... many hex values ... a8c10c0c CHEBI:60493
```

By default the fingerprints are ordered from smallest popcount to largest, which you can see in the output. A pre-ordered index is faster to search because the target popcounts are pre-computed and because it often reduces the search space.

If you want to preserve the input order then you'll need to pipe the FPS output to *fpcat* and use its --preserve-order flag. See the next section for an example.

#### 2.10 Convert between FPS and FPB formats

In this section you'll learn how to convert an FPS file into an FPB file and back, and you'll learn how to control the fingerprint ordering. You will need the FPS files generated in *Generate fingerprint files from PubChem SD tags* but you do not need a chemistry toolkit. The FPB format was introduced with chemfp-2.0.

If you already have an FPS file then you can convert it directly into an FPB file, and without using a chemistry toolkit. The *fpcat* program converts from one format to the other.

In an earlier section I generated the files pubchem\_queries.fps and pubchem\_targets.fps . I'll convert each to FPB format:

```
% fpcat pubchem_targets.fps -o pubchem_targets.fpb
% fpcat pubchem_queries.fps -o pubchem_queries.fpb
```

The FPB format is a binary format which is difficult to read directly. The easiest way to see what's inside is to use fpcat. If you don't specify an output filename then it sends the results to stdout in FPS format:

The keen-eyed reader might have noticed that the conversion does not have a "source" or "date" field. I haven't figured out if this is a bug. Should I keep the original date and structure file source, or use the current date and FPS file source? Let me know if this is important to you.

By default when fpcat generates an FPB file it reorders the fingerprints by population count and creates a popcount index. This improves the similarity search performance, but it means that the order of the FPB file is likely different than the original FPS format. You can get a sense of this by looking at the first fingerprint in the original pubchem\_queries.fps file:

(continued from previous page)

and confirming that it isn't the same as the first fingerpritn in pubchem queries.fpb.

If you want the FPB file to store the fingerprints in input order instead of the popcount order needed for optimized similarity search, then use the --preserve-order flag:

On the flip side, fpcat by default preserves the input order when it creates FPS output. If you instead want to the output FPS file to be in popcount order then use the --reorder flag:

## 2.11 Specify the fpcat output format

In this section you'll learn how to specify the output format for fpcat using a command-line option instead of the filename extension. You will need the pubchem\_queries.fpb file from *Generate fingerprint files from PubChem SD tags*.

If you do not specify an output filename then fpcat will output the fingerprints in FPS format to stdout. If you specify a filename then by default it will look at the extension to determine if the output should be an FPB (".fpb"), FPS (".fps"), or gzip or Zstandard compressed FPS (".fps.gz" or ".fps.zst") file. The FPS format is used for unrecognized extensions.

In a few rare cases you may want to use a format which doesn't match the default. To be honest, the examples I can think of aren't that realistic, but let's suppose you want to output the contents of an FPB file to stdout in gzip'ed FPS format, and count the number of bytes in compressed output. I'll use the use the –out flag to change the format to 'fps.gz' from the default of 'fps', then compare the resulting size with the uncompressed form:

```
% fpcat pubchem_queries.fpb --out fps | wc -c
2511714
% fpcat pubchem_queries.fpb --out fps.gz | wc -c
314393
```

It's not that useful because you could pipe the uncompressed output to gzip, which is also likely faster:

```
% fpcat pubchem_queries.fpb --out fps | gzip -c -9 | wc -c 11921
```

In case you're wondering, chemfp 3.4 added support for zstandard compression, if the "zstandard" Python module is available.

% fpcat pubchem queries.fpb –out fps.zst | wc -c 293806

Chemfp cannot write an FPB file to stdout. In fact, the output file must be seek-able, which means it can't be a named pipe either.

### 2.12 Alternate fingerprint file formats

In this section you'll learn about chemfp's support for other fingerprint file formats.

Chemfp started as a way to promote the FPS file format for fingerprint exchange. Chemfp 2.0 added the FPB format, which is a binary format designed around chemfp's internal search data structure so it can be loaded quickly.

There are many other fingerprint formats. Perhaps the best known is the Open Babel FastSearch format. Two others are Dave Cosgrove's flush format, and OpenEye's "fpbin" format.

The chemfp\_converters package contains utilities to convert between the chemfp formats and these other formats.:

```
# Convert from/to Dave Cosgrove Flush format
flush2fps drugs.flush
fps2flush drugs.fps -o drugs.flush

# Convert from/to OpenEye's fpbin format
fpbin2fps drugs.fpbin --moldb drugs.sdf
fps2fpbin drugs_openeye_path.fps --moldb drugs.sdf -o drugs.fpbin

# Convert from/to Open Babel's FastSearch format
fs2fps drugs.fs --datafile drugs.sdf
fps2fs drugs_openbabel_FP2.fps --datafile drugs.sdf -o drugs.fs
```

Of the three formats, the flush format is closest to the FPS data model. That is, it stores fingerprint records as an identifier and the fingerprint bytes. By comparison, the FastSearch and fpbin formats store the fingerprint bytes and an index into another file containing the structure and identifier. It's impossible for chemfp to get the data it needs without reading both files.

Chemfp has special support for the flush format. If chemfp\_converters is installed, chemfp will use it to read and write flush files nearly everywhere that it accepts FPS files. You can use it at the output to oe2fps, rdkit2fps, and ob2fps, and as the input queries to simsearch, and as both input and output to fpcat. (You cannot use it as the simsearch targets because that code has been optimized for FPS and FPB search, and I haven't spent the time to optimize flush file support.)

This means that if chemfp\_converters is installed then you can use *fpcat* to convert between FPS, FPB, and and flush file formats. For examples:

```
fpcat drugs.flush -o drugs.fps
fpcat drugs.fps -o drugs.flush
```

In addition, you can use it at the API level in chemfp.open(), chemfp.load\_fingerprints(), chemfp.open\_fingerprint\_writer(), and FingerprintArena.save().

Note that the flush format does not support the FPS metadata fields, like the fingerprint type, and it only support fingerprints which are a multiple of 32 bits long. Also, compressed flush files are not supported.

### 2.13 Similarity search with the FPB format

In this section you'll learn how to do a similarity search using an FPB file as the target. You will need the fingerprint files from Generate fingerprint files from PubChem SD tags but you do not need a chemistry toolkit.

NOTE: The Chemfp Base License does not let you generate FPB files. Contact sales@dalkescientific.com to learn about other licensing options.

Simsearch, like all of the tools starting with chemfp-2.0, understands both FPS and FPB files:

```
% simsearch -k 3 --threshold 0.85 -q pubchem_queries.fps pubchem_targets.fpb | head
#Simsearch/1
#num_bits=881
#type=Tanimoto k=3 threshold=0.85
#software=chemfp/3.4
#queries=pubchem_queries.fps
#targets=pubchem targets.fpb
#query_source=Compound_099000001_099500000.sdf.gz
      99000039
                       48503376
                                        0.8785
                                                48503380
                                                                          48732162
                                                                                           0.
                                                                 0.8729
<del>-</del>8596
      99000230
                       48563034
                                        0.8588
                                                48731730
                                                                 0.8523
0
      99002251
```

You can also use an FPB file as the queries. The pubchem\_queries.fpb file are indexed, which means the queries with the fewest bits set come first. These will likely be less similar to the targets, so I've lowered the threshold quite considerably:

```
% simsearch -k 3 --threshold 0.15 -q pubchem_queries.fpb pubchem_targets.fpb | head
#Simsearch/1
#num_bits=881
#type=Tanimoto k=3 threshold=0.15
#software=chemfp/3.4
#queries=pubchem_queries.fpb
#targets=pubchem targets.fpb
      99116624
                       48637532
                                         0.1607
1
      99116625
                       48637532
                                         0.1607
                                                                                             0.
3
      99116667
                       48656359
                                         0.2727
                                                                   0.2667
                                                                           48839868
                                                 48656867
→2642
                                         0.2727
      99116668
                       48656359
                                                 48656867
                                                                   0.2667
                                                                           48839868
                                                                                             0.
<del>--</del>2642
```

By default simsearch uses the query and target filename extensions to figure out if the file is in FPS, FPB, or flush format

If you don't want it to auto-detect the format then use the --query-format and --target-format options to tell it the format to use. The values can be one of "fps", "fps.gz", "fps.zst", "fpb", "fpb.gz", "fpb.zst", or "flush".

## 2.14 Converting large data sets to FPB format

In this section you'll learn how to generate an FPB file on computers with relatively limited memory. To be realistic, this example uses the complete PubChem data set, and extracts the CACTVS/PubChem fingerprints which are in each record. You do not need a chemistry toolkit for this section.

The most direct way to extract the PubChem fingerprints from a PubChem distribution is to use sdf2fps:

```
sdf2fps --pubchem pubchem/Compound_*.sdf.gz -o pubchem.fpb
```

This uses the default FPB writer options, which stores all of the fingerprints in memory, sorts them, and saves the result to the output file. This may use about 2-3 times as much memory as the final FPB output size, which is a bit unfortunate if you want to generate a 7 GB FPB file on a 12 GB machine.

When I updated this section in June 2020, it took around 25GB of memory to create an FPB file with 102,768,482 PubChem fingerprints, and the final file was about 14GB.

(Note: see the next section for a two-stage solution that lets you parallelize fingerprint generation.)

The "\*2fps" command-line tools do not have a way to change the default writer options, although *fpcat* does. The --max-spool-size option sets a rough upper bound to the amount of memory to use. When enabled, the writer breaks the input into parts and creates a temporary FPB file for each part. At the end, it merges the sorted data from the temporary FPB files to get the final FPB file. Be aware that the specified spool size is only approximate and is not a hard limit on the maximum amount of memory to use. You may need to experiment a bit if you have tight constraints, and this option might not be as useful as I thought it was.

The value must be a size in bytes, though suffixes like M or MB for megabyte and T or TB for terabyte are also allowed. These are in base-10 units, so 1 MB = 1,000,000 bytes. Spaces are not allowed between the number and the suffix, so "200MB" is okay but "200 MB" is not. The size must be at least 20 MB.

Here is an example of how to convert the CACTVS fingerprints from all of PubChem to an FPB file, using a relatively small limit of 200 MB:

```
\verb|sdf2fps --pubchem pubchem/Compound_*.sdf.gz | fpcat --max-spool-size 200MB --o pubchem.fpb|\\
```

This will take a while! The sdf2fps alone takes almost 45 minutes on a ca. 2017-era Haswell machine.

If I save the intermediate results to an FPS file then the in-memory fpcat conversion from FPS to FPB takes  $5\frac{1}{2}$  minutes and requires 25GB of memory.

With spool of 200MB, the conversion takes nearly 10 minutes. According to htop, the spooled conversion required, near the peak, 13.3G of virtual memory, a resident set size of 12G, and 10.6G of shared shared pages. The shared pages are from memory-mapping the intermediate FPB files, so this probably required only 2GB of real memory.

If I use a 1GB spool size, the conversion time decreases from 10 to 8 minutes, and uses about the same amount of peak memory.

The temporary files will be placed under the appropriate temporary directory for your operating system. If that disk isn't large enough for the intermediate files then use the --tmpdir option of fpcat to specify an alternate directory:

```
fpcat --max-spool-size 1GB pubchem.fps -o pubchem.fpb --tmpdir /usr/tmp
```

Another option is to specify the directory location using the TMPDIR, TEMP, or TMP environment variables, which are resolved in that order. The details are described in the Python documentation for temp-file.tempdir.

## 2.15 Generate fingerprints in parallel and merge to FPB format

In this section you'll learn how to merge multiple sorted fingerprints into a single FPB file.

The previous section used a single shell command to extract the PubChem/CACTVS fingerprints from PubChem and generate an FPB file. This is easy to write and understand, but more complex versions may be more appropriate.

For one, I have four cores on my desktop computer, and I want to use them to process the PubChem files in parallel. The previous section was only single threaded.

I have all my PubChem files in ~/pubchem/. For each "Compound\_\*.sdf.gz" file in that directory I want to extract the CACTVS/PubChem fingerprints and create an intermediate FPS file in the local directory. That's equivalent to running the following commands:

```
sdf2fps --pubchem ~/pubchem/Compound_000000001_000500000.sdf.gz \\
    -o Compound_000000001_000500000.fps
sdf2fps --pubchem ~/pubchem/Compound_000500001_001000000.sdf.gz \\
    -o Compound_000500001_001000000.fps
... 291 more lines ...
```

except that I want to run four at a time.

This is what GNU Parallel was designed for. It's a command-line tool which can parallelize the execution of other command-lines.

I'll start by explaining the core command-line substitution pattern:

```
sdf2fps --pubchem {} -o {/..}.fps'
```

The {} will be replaced with a filename, and {/..} will be replaced with the base filename, without the directory path prefix or the two suffixes. That is, when {} is "/Users/dalke/pubchem/Compound\_000000001\_000500000.sdf.gz" then {/..} will be "Compound\_000000001\_000500000.fps".

Since I want to generate an FPS file, I added the ".fps" as a suffix to the second substitution parameter.

I then tell GNU parallel which command-line to use, along with a few other parameters. Here's the full line, which I split over two lines to make it more readable:

```
parallel --plus --no-notice --bar 'sdf2fps --pubchem {}
    -o {/..}.fps' ::: ~/pubchem/Compound_*.sdf.gz
```

The --plus tells GNU parallel to recognize an expanded set of replacement strings. (" $\{/..\}$ " is not part of the standard set of patterns.)

The --no-notice tells it to not display the message about citing GNU parallel in scientific papers.

The --bar enables a progress bar, which looks like this:

```
30% 88:205=11m17s /Users/dalke/pubchem/Compound_045500001_046000000.sdf.gz
```

This status line shows that processing is 30% complete, which is file 88 out of 205, and there's an estimated 11 minutes and 17 seconds remaining.

Finally, the ":::" indicates that the remaining options are the list of parameters to pass to the command-line template for parallelization.

After about 21 minutes, using 4 CPUs on my laptop (with an effective scaling of 2.8), I now have a large number of FPS files, which I want to merge into a single FPB file. I'll use *fpcat*:

```
fpcat --max-spool-size 1GB Compound*.fps -o pubchem.fpb
```

Unfortunately my laptop ran out of disk space, so I'll just leave it a that; re-doing the same command on a server machine won't provide you any new information.

## CHAPTER 3

## Help for the command-line tools

The chemfp command-line tools are:

- fpcat merge multiple fingerprint files into one
- ob2fps use Open Babel to generate fingerprints
- oe2fps use OEChem/OEGraphSim to generate fingerprints
- rdkit2fps use RDKit to generate fingerprints
- cdk2fps use CDK to generate fingerprints
- sdf2fps extract fingerprints from an SD file
- simsearch search a fingerprint file for similar fingerprints

## 3.1 fpcat command-line options

The following comes from fpcat --help:

(continued from previous page)

--in FORMAT input fingerprint format. One of fps or fpb (with optional gz or zst compression), or flush. (default guesses from filename or is fps) assume the input fingerprint files are in popcount --merge order and do a merge sort -o FILENAME, --output FILENAME save the fingerprints to FILENAME (default=stdout) --out FORMAT output fingerprint format. One of fps, fps.gz, fps.zst, fpb, or flush. (default guesses from output filename, or is 'fps') --level LEVEL compression level. Must be a positive integer or one of 'min', 'default', or 'max'. --reorder reorder the output fingerprints by popcount (default for FPB output) --preserve-order save the output fingerprints in the same order as the input (default for FPS output) --alignment N alignment size when saving a FPB file (default=8) --show-progress show progress --max-spool-size SIZE use temporary files for extra storage space for huge FPB files (default uses RAM) --tmpdir DIRNAME directory for the temporary files (default uses the system temp directory) show program's version number and exit --version --license-check Check the license and report results to stdout.

#### Examples:

fpcat can be used to convert between FPS and FPB formats. This is handy if you want to see what's inside of an FPB file:

fpcat fingerprints.fpb

You can use also use fpcat to make an FPB file from an FPS file:

fpcat fingerprints.fps -o fingerprints.fpb

You might have generated a set of FPS file which you want to merge into a single FPB. (For example, you might have used GNU parallel to generate FPS files for each of the PubChem files, which you want to merge into a single file.):

fpcat Compound\_\*.fps -o pubchem.fpb

By default the FPB format sorts the fingerprints by popcount. (Use --preserve-order if you really want to preserve the input order.) The sort overhead for PubChem uses about 10 GB of RAM. If you don't have that much memory then ask fpcat to use less memory:

fpcat --max-spool-size 1GB Compound\_\*.fps -o pubchem.fpb

This will use about 2 GB of RAM and the --tmpdir for the rest. (Yes,

```
it would be nice if I could get those two memory size numbers to match.)

The --merge option is experimental. Use it if the input fingerprints are in popcount order, because sorted output is a simple merge sort of the individual sorted inputs. However, this option opens all input files at the same time, which may exceed your resource limit on file descriptors. The current implementation also requires a lot of disk seeks so is slow for many files.
```

The flush format is only available if the chemfp\_converter package was installed.

#### 3.2 ob2fps command-line options

The following comes from ob2fps --help:

```
usage: ob2fps [-h] [--FP2 | --FP3 | --FP4 | --MACCS | --ECFP0 | --ECFP2
                        | --substruct | --rdmaccs | --rdmaccs/1]
                 [--nBits INT] [--id-tag NAME] [--in FORMAT] [-o FILENAME]
                 [--out FORMAT] [--errors {strict,report,ignore}]
                 [--help-formats] [-R NAME=VALUE]
                 [--delimiter {tab, whitespace, to-eol, space}] [--has-header]
                 [--version] [--license-check]
                 [filenames ...]
Generate FPS or FPB fingerprints from a structure file using Open Babel
positional arguments:
 filenames
                       input structure files (default is stdin)
optional arguments:
 -h, --help
                       show this help message and exit
 --FP2
                       linear fragments up to 7 atoms
 --FP3
                       SMARTS patterns specified in the file patterns.txt
 --FP4
                       SMARTS patterns specified in the file
                       SMARTS InteLigand.txt
 --MACCS
                       Open Babel's implementation of the MACCS 166 keys
                       ECFP (circular) fingerprints with diameter 0
 --ECFPO
 --ECFP2
                       ECFP (circular) fingerprints with diameter 2
 --ECFP4
                       ECFP (circular) fingerprints with diameter 4
 --ECFP6
                       ECFP (circular) fingerprints with diameter 6
 --ECFP8
                       ECFP (circular) fingerprints with diameter 8
 --ECFP10
                       ECFP (circular) fingerprints with diameter 10
  --substruct
                       ChemFP substructure fingerprints
 --rdmaccs, --rdmaccs/2
                       166 bit RDKit/MACCS fingerprints (version 2)
                       use the version 1 definition for --rdmaccs
 --rdmaccs/1
 --id-tag NAME
                       tag name containing the record id (SD files only)
```

```
--in FORMAT
                        input structure format (default autodetects from the
                        filename extension)
  -o FILENAME, --output FILENAME
                        save the fingerprints to FILENAME (default=stdout)
  --out FORMAT
                        output structure format (default guesses from output
                        filename, or is 'fps')
  --errors {strict,report,ignore}
                        how should structure parse errors be handled?
                        (default=ignore)
                        list the available formats and reader arguments
  --help-formats
  -R NAME=VALUE
                        specify a reader argument
  --delimiter {tab, whitespace, to-eol, space}
                        delimiter style for SMILES and InChI files. Alias for
                        '-R delimiter=VALUE'.
  --has-header
                        Skip the first line of a SMILES or InChI file Alias
                        for '-R has_header=1'
  --version
                        show program's version number and exit
  --license-check
                        Check the license and report results to stdout.
ECFP argument:
  --nBits INT
                        number of bits in the fingerprint (default=4096)
By default the Open Babel structure reader determines the file format
and compression type based on the filename extension. Unknown
filename extensions are treated as a uncompressed SMILES files.
If the data comes from stdin, or the guess based on extension name is
wrong, then use "--in FORMAT" option to change the default input format.
For examples:
  --in smi
  --in sdf.gz
Use `-R` to specify format-specific reader arguments.
Use `--help-formats` for a list of available formats and reader arguments.
```

The following comes from ob2fps --help-formats, though I've removed most of the Open Babel formats from the list.

chemfp has special support for the SMILES, InChI, and SDF formats when using the Open Babel toolkit.

For these formats, by default, chemfp uses the filename extension to determine the format type. If the filename ends with ".gz" or ".zst" then it is intepreted as a gzip or Zstandard compressed file, and the second-to-last extension is used to determine the format type. Unknown or unsupported extensions are then tested against Open Babel format names (see below), and if still unknown, interpreted as a SMILES file.

Note: To enable Zstandard compression, please install the "zstandard" Python package from https://pypi.org/project/zstandard/ .

You will need to use "-R implementation=chemfp" to enable zst support for the SDF format.

You may instead specify the file format by name (see below), which is especially important when reading from stdin, which has no associated filename extension.

These specially supported filename extensions are:

The format can also be specified by name using the '--in' option:

```
File Type Format name (append .gz or .zst if compressed)

=========

SMILES smi, can, usm

SDF sdf
InChI inchi
```

The input format parsers can be configured with the "-R" option. For examples, the following reader arguments tell the SMILES readers that the fields are whitespace delimited and the first line is a header.

-R delimiter=whitespace -R has\_header=true

All of the readers support the 'options' reader argument, which is a string passed directly to OBConversion(). This is a compact way to encode all of the Open Babel parameters used in the conversion. For example, 'ab"text"', would set option 'a' to True, and option 'b' to the string "text".

The SMILES format parsers use two additional reader arguments:

- \* 'delimiter' specifies the delimiter type. The default is 'to-eol'.

  The other values are 'tab', 'whitespace', 'space' and 'native'.

  Use "-R delimiter=native" to match Open Babel's native delimiter style, which is 'to-eol'.
- \* 'has\_header', if false will skip the first line of the SMILES file (because it is a header line).

The SDF format parser supports one additional reader argument:

\* 'implementation': if "openbabel" or "native", use Open Babel's native SDF parser. If "chemfp" use chemfp's own implementation to find SDF records, which are then passed to Open Babel for parsing. This gives more fine-grained error reporting, and supports zst compression, and with similar performance.

(Note: Open Babel supports additional options.)

```
The InChI format parser supports one additional reader argument:
  * 'delimiter' works the same as it does for the SMILES formats
In addition, you may specify an Open Babel formats, either by one of
the following format names, or by reading a filename ending with one
of the format names, optionally with a .gz suffix. Zstandard
compression is not supported by the native Open Babel reader.
 Format Description and options
_____
 CONFIG DL-POLY CONFIG
CONTCAR VASP format
           s Output single bonds only
           b Disable bonding entirely
 CONTFF MDFF format
HISTORY DL-POLY HISTORY
          .... many lines removed from the chemfp documentation ...
      XYZ cartesian coordinates format
xyz
          s Output single bonds only
          b Disable bonding entirely
      YASARA.org YOB format
yob
You will need to consult the Open Babel documentation
(see http://openbabel.org/wiki/List_of_extensions ) and
implementation for full details about how these options work.
```

### 3.3 oe2fps command-line options

The following comes from oe2fps --help:

```
usage: oe2fps [-h] [--path] [--circular] [--tree] [--numbits INT]
                 [--minbonds INT] [--maxbonds INT] [--minradius INT]
                 [--maxradius INT] [--atype ATYPE] [--btype BTYPE]
                 [--maccs166] [--substruct] [--rdmaccs] [--rdmaccs/1]
                 [--aromaticity NAME] [--id-tag NAME] [--in FORMAT]
                 [-o FILENAME] [--out FORMAT]
                 [--errors {strict,report,ignore}] [--help-formats]
                 [-R NAME=VALUE] [--delimiter {tab, whitespace, to-eol, space}]
                 [--has-header] [--version] [--license-check]
                 [filenames ...]
Generate FPS or FPB fingerprints from a structure file using OEChem
positional arguments:
  filenames
                        input structure files (default is stdin)
optional arguments:
  -h, --help
                        show this help message and exit
  --aromaticity NAME
                        use the named aromaticity model (same as '-R
```

```
aromaticity=NAME')
                        tag name containing the record id (SD files only)
  --id-tag NAME
  --in FORMAT
                        input structure format (default guesses from filename)
  -o FILENAME, --output FILENAME
                        save the fingerprints to FILENAME (default=stdout)
  --out FORMAT
                        output structure format (default guesses from output
                        filename, or is 'fps')
  --errors {strict,report,ignore}
                        how should structure parse errors be handled?
                        (default=ignore)
  --help-formats
                        list the available formats and reader arguments
  -R NAME=VALUE
                        specify a reader argument
  --delimiter {tab, whitespace, to-eol, space}
                        delimiter style for SMILES and InChI files. Alias for
                        '-R delimiter=VALUE'.
  --has-header
                        Skip the first line of a SMILES or InChI file Alias
                        for '-R has header=1'
  --version
                        show program's version number and exit
  --license-check
                        Check the license and report results to stdout.
path, circular, and tree fingerprints:
  --path
                        generate path fingerprints (default)
                        generate circular fingerprints
  --circular
  --tree
                        generate tree fingerprints
  --numbits INT
                        number of bits in the fingerprint (default=4096)
  --minbonds INT
                        minimum number of bonds in the path or tree
                        fingerprint (default=0)
  --maxbonds INT
                        maximum number of bonds in the path or tree
                        fingerprint (path default=5, tree default=4)
  --minradius INT
                        minimum radius for the circular fingerprint
                        (default=0)
  --maxradius INT
                        maximum radius for the circular fingerprint
                        (default=5)
  --atype ATYPE
                        atom type flags, described below (default=Default)
                        bond type flags, described below (default=Default)
  --btype BTYPE
166 bit MACCS substructure keys:
  --maccs166
                        generate MACCS fingerprints
881 bit ChemFP substructure keys:
  --substruct
                        generate ChemFP substructure fingerprints
ChemFP version of the 166 bit RDKit/MACCS keys:
  --rdmaccs, --rdmaccs/2
                        generate 166 bit RDKit/MACCS fingerprints (version 2)
                        use the version 1 definition for --rdmaccs
  --rdmaccs/1
ATYPE is one or more of the following, separated by the '|' character
  Arom AtmNum Chiral EqArom EqHBAcc EqHBDon EqHalo FCharge HCount HvyDeg
 Hyb InRing
```

The following shorthand terms and expansions are also available:

(continued from previous page)

```
DefaultPathAtom = AtmNum|Arom|Chiral|FCharge|HvyDeg|Hyb|EqHalo
DefaultCircularAtom = AtmNum|Arom|Chiral|FCharge|HCount|EqHalo
DefaultTreeAtom = AtmNum|Arom|Chiral|FCharge|HvyDeg|Hyb
and 'Default' selects the correct value for the specified fingerprint.
Examples:
  --atype Default
  --atype "Arom | AtmNum | FCharge | HCount"
  --atype Arom, AtmNum, FCharge, HCount
BTYPE is one or more of the following, separated by the '|' character
 Chiral InRing Order
The following shorthand terms and expansions are also available:
DefaultPathBond = Order|Chiral
DefaultCircularBond = Order
DefaultTreeBond = Order
and 'Default' selects the correct value for the specified fingerprint.
Examples:
  --btype Default
  --btype Order|InRing
To simplify command-line use, a comma may be used instead of a '|' to
separate different fields. Example:
  --atype AtmNum, HvyDegree
By default, chemfp will use the filename extension to determine the
structure file format type and possible compression. Most of the file
readers support configuration parameters. Use the '-R' option to
specify those parameters.
Use '--help-formats' to list available formats and reader parameters.
```

The following comes from oe2fps --help-formats

These are the structure file formats that chemfp can read when using the OEChem toolkit.

By default, chemfp uses the filename extension to determine the format type. If the filename ends with ".gz" then it is intepreted as a gzip compressed file, and the second-to-last extension is used to determine the format type. Unknown or unsupported extensions are interpreted as a SMILES file.

(The OEChem structure file readers do not support Zstandard compression.)

You may instead specify the file format by name (see below), which is especially important when reading from stdin, which has no associated

filename extension.

The supported filename extensions are:

```
File Type
             Extension(s)
 ========
              =========
   SMILES
            can, ism, isosmi, smi, usm
    SDF
            mdl, rxn, sd, sdf
   InChI
             inchi
 Tripos Mol2 mol2, mol2h
    PDB
             ent, pdb
    XYZ
             xyz
    SKC
             skc
 Macromodel mmd, mmod
 ChemDraw CDX cdx
 OE binary
             oeb
OEB compressed oez
    CIF
            cif
   mmCIF
            mmcif
   FASTA
            fasta
    CSV
```

Append a '.gz' to the filename to indicate that the contents are gzip-compressed.

The format can also be specified by name using the '--in' option:

File Type	Format name
======================================	
SMILES	smi, can, usm
SDF	sdf
InChI	inchi
Tripos Mol2	mol2, mol2h
PDB	pdb
XYZ	xyz
SKC	skc
Macromodel	mmod
ChemDraw CDX	cdx
OE binary	oeb
${\tt OEB}$ compressed	oez
CIF	cif
mmCIF	mmcif
FASTA	fasta
CSV	csv

Append a '.gz' to the format name to indicate that the contents are gzip-compressed.

The input format parsers can be configured with the "-R" option. For example, the following reader arguments tell the SMILES readers that the fields are whitespace delimited and the first line is a header.

```
-R delimiter=whitespace -R has_header=true
All formats handle the following two reader arguments:
  aromaticity - one of 'openeye', 'daylight', 'tripos', 'mdl', or 'mmff'
      (this can also be set via the older '--aromaticity' command-line option)
 flavor - a '|' or ',' separated list of flavor names, or a numeric value.
       A leading '-' means to remove the given flavor. Examples include:
       o Canon, Strict -- the bitwise merger of the format's Canon and Strict values
       o Default,-Kekule -- the format's Default flavor but without the Kekule bits
                      (every flavor has a Default)
       o 42 -- the specific OEChem flavor value 42
The SMILES and InChI formats also handle reader arguments for the
delimiter style and the presence of an initial header line using the
following:
  delimiter - one of 'to-eol' (Daylight/OEChem style), 'tab',
        'whitespace', 'space', or 'native' (for the native toolkit style)
  has_header - '1' if the first line contains a header, else '0'.
The supported format, default reader arguments, and input flavors are:
Format: can
   aromaticity: openeye
   delimiter: to-eol
   flavor: Default
       default flags: <none>
       available flags: Canon, Strict
   has header: 0
Format: cdx
   aromaticity: openeye
   flavor: Default
       default flags: SuperAtom
       available flags: SuperAtom
Format: cif
   aromaticity: openeye
   flavor: Default
        default flags: BondHydToClosest, BondOrder, FormalCrg, ImplicitH,
            NormalizeHydPos, OccFilterOneHalf, RemovePBCImages,
            RemoveQuestionMarkInLabel, Rings
        available flags: BondHydToClosest, BondOrder, FormalCrg, ImplicitH,
            NormalizeHydPos, OccFilterOneHalf, RemovePBCImages,
            RemoveQuestionMarkInLabel, Rings
Format: csv
   aromaticity: openeye
```

```
flavor: Default
       default flags: Header
       available flags: Header
Format: fasta
   aromaticity: openeye
   flavor: Default
        default flags: <none>
        available flags: CustomResidues, EmbeddedSMILES
Format: inchi
   aromaticity: <N/A>
   delimiter: to-eol
   flavor: Default
     no flavor flags available
   has_header: 0
Format: mmcif
   aromaticity: openeye
   flavor: Default
        default flags: <none>
        available flags: NoAltLoc
Format: mmod
   aromaticity: openeye
   flavor: Default
        default flags: <none>
        available flags: FormalCrg
Format: mol2
   aromaticity: openeye
   flavor: Default
       default flags: <none>
        available flags: Forcefield, M2H
Format: mol2h
   aromaticity: openeye
   flavor: Default
        default flags: M2H
        available flags: M2H
Format: oeb
   aromaticity: <N/A>
   flavor: Default
      no flavor flags available
Format: oez
   aromaticity: <N/A>
   flavor: Default
     no flavor flags available
Format: pdb
```

```
aromaticity: openeye
   flavor: Default
       default flags: BondOrder, Connect, END, ENDM, FormalCrg, ImplicitH,
            Rings, SecStruct
        available flags: ALL, ALTLOC, BondOrder, CHARGE, Connect, DATA, END,
            ENDM, FORMALCHARGE, FormalCrg, ImplicitH, RADIUS, Rings,
            SecStruct, TER
Format: sdf
   aromaticity: openeye
   flavor: Default
        default flags: <none>
        available flags: FixBondMarks, SuppressEmptyMolSkip,
            SuppressImp2ExpENHSTE
Format: skc
   aromaticity: openeye
   flavor: Default
     no flavor flags available
Format: smi
   aromaticity: openeye
   delimiter: to-eol
   flavor: Default
        default flags: <none>
        available flags: Canon, Strict
   has_header: 0
Format: usm
   aromaticity: openeye
   delimiter: to-eol
   flavor: Default
       default flags: <none>
       available flags: Canon, Strict
   has_header: 0
Format: xyz
   aromaticity: openeye
   flavor: Default
        default flags: BondOrder, Connect, FormalCrg, ImplicitH, Rings
        available flags: BondOrder, Connect, FormalCrg, ImplicitH, Rings
See https://docs.eyesopen.com/toolkits/cpp/oechemtk/molreadwrite.html#flavored-input-and-
\hookrightarrowoutput
for documentation about the flavors for each format.
```

# 3.4 rdkit2fps command-line options

The following comes from rdkit2fps --help:

```
usage: rdkit2fps [-h] [--fpSize INT] [--radius INT] [--nBitsPerEntry INT]
                    [--includeChirality 0|1] [--from-atoms INT,INT,...]
                    [--RDK] [--minPath INT] [--maxPath INT]
                    [--nBitsPerHash INT] [--useHs 0|1] [--branchedPaths 0|1]
                    [--useBondOrder 0|1] [--morgan] [--useFeatures 0|1]
                    [--useChirality 0|1] [--useBondTypes 0|1]
                    [--includeRedundantEnvironments 0|1] [--torsions]
                    [--targetSize INT] [--pairs] [--minLength INT]
                    [--maxLength INT] [--use2D 0|1] [--maccs166] [--avalon]
                    [--isQuery 0_or_1] [--bitFlags INT] [--secfp]
                    [--rings 0|1] [--isomeric 0|1] [--kekulize 0|1]
                    [--min_radius INT] [--pattern] [--substruct] [--rdmaccs]
                    [--rdmaccs/1] [--id-tag NAME] [--in FORMAT] [-o FILENAME]
                    [--out FORMAT] [--errors {strict,report,ignore}]
                    [--help-formats] [-R NAME=VALUE]
                    [--delimiter {tab, whitespace, to-eol, space}] [--has-header]
                    [--version]
                    [filenames ...]
Generate FPS or FPB fingerprints from a structure file using RDKit
positional arguments:
  filenames
                        input structure files (default is stdin)
optional arguments:
  -h, --help
                        show this help message and exit
  --id-tag NAME
                        tag name containing the record id (SD files only)
  --in FORMAT
                        input structure format (default guesses from filename)
  -o FILENAME, --output FILENAME
                        save the fingerprints to FILENAME (default=stdout)
  --out FORMAT
                        output structure format (default guesses from output
                        filename, or is 'fps')
  --errors {strict,report,ignore}
                        how should structure parse errors be handled?
                        (default=ignore)
                        list the available formats and reader arguments
  --help-formats
  -R NAME=VALUE
                        specify a reader argument
  --delimiter {tab, whitespace, to-eol, space}
                        delimiter style for SMILES and InChI files. Alias for
                        '-R delimiter=VALUE'.
                        Skip the first line of a SMILES or InChI file Alias
  --has-header
                        for '-R has_header=1'
  --version
                        show program's version number and exit
Common Parameters (used by more than one fingerprint type):
  --fpSize INT
                        number of bits in the fingerprint. Default of 2048 for
                        RDK, Morgan, topological torsion, atom pair, pattern
                        and SECFP fingerprints, and 512 for Avalon
                        fingerprints
  --radius INT
                        radius for the Morgan or SECFP fingerprints. Default
                        of 2 for Morgan, 3 for SECFP
  --nBitsPerEntry INT
                        number of bits per entry
```

```
--includeChirality 0|1
                        include chirality information in the atom invariants
  --from-atoms INT, INT, ...
                        fingerprint generation must use these atom indices
                        (out of range indices are ignored)
RDKit topological fingerprints:
  Branched or linear hash fingerprint.
  Uses --fpSize and --fromAtoms plus:
  --RDK
                        generate RDK fingerprints (default)
  --minPath INT
                        minimum number of bonds to include in the subgraph
                        (default=1)
  --maxPath INT
                        maximum number of bonds to include in the subgraph
                        (default=7)
  --nBitsPerHash INT
                        number of bits to set per path (default=2)
  --useHs 0|1
                        include information about the number of hydrogens on
                        each atom (default=1)
  --branchedPaths 0|1
                        if set both branched and unbranched paths will be used
                        in the fingerprint (default=1)
  --useBondOrder 0|1
                        if set both bond orders will be used in the path
                        hashes (default=1)
RDKit Morgan fingerprints:
  Circular fingerprints similar to ECFP or FCFP fingerprints.
  Uses --fpSize, --radius, and --fromAtoms plus:
                        generate Morgan fingerprints
  --morgan
                        use chemical-feature invariants (default=0)
  --useFeatures 0|1
  --useChirality 0|1
                        include chirality information (default=0)
  --useBondTypes 0|1
                        include bond type information (default=1)
  --includeRedundantEnvironments 0|1
                        if set, the check for redundant atom environments will
                        not be done (default=0)
RDKit Topological Torsion fingerprints:
  See Nilakantan et al., JCICS 27, 82-85 (1987).
  Uses --fpSize, --nBitsPerEntry, --includeChirality, and --fromAtoms plus:
  --torsions
                        generate Topological Torsion fingerprints
                        number of bonds per torsion (default=4)
  --targetSize INT
RDKit Atom Pair fingerprints:
  See Carhart et al., JCICS 25, 64-73 (1985).
  Uses --fpSize, --nBitsPerEntry, --includeChirality, and --fromAtoms plus:
  --pairs
                        generate Atom Pair fingerprints
  --minLength INT
                        minimum bond count for a pair (default=1)
  --maxLength INT
                        maximum bond count for a pair (default=30)
                        use 2D instead of 3D distance matrix (default=1)
  --use2D 0|1
166 bit MACCS substructure keys:
```

```
generate MACCS fingerprints
  --maccs166
Avalon fingerprints:
 Fingerprints from the Avalon toolkit.
  Uses --fpSize plus:
                        generate Avalon fingerprints
  --avalon
  --isQuery 0_or_1
                        is the fingerprint for a query structure? (1 if yes, 0
                        if no) (default=0)
  --bitFlags INT
                        bit flags, SSSBits are 32767 and similarity bits are
                        15761407 (default=15761407)
SECFP fingerprints:
  A circular fingerprint based on fragment SMILES instead of hashing.
 Uses --fpSize and --radius plus:
  --secfp
                        generate SECFP fingerprints
  --rings 0|1
                        if 1, add SSSR ring to the fingerprint (default=1)
  --isomeric 0|1
                        if 1, use isomeric SMILES instead of non-isomeric
                        SMILES (default=0)
  --kekulize 0|1
                        if 1, use Kekule SMILES instead of aromatic SMILES
                        (default=1)
                        minimum radius used to extract n-grams (default=1)
  --min_radius INT
RDKit Pattern fingerprints:
  Fingerprints for substructure search screening.
                        generate (substructure) pattern fingerprints
chemfp's version of the 881 bit PubChem substructure keys:
  --substruct
                        generate ChemFP substructure fingerprints
chemfp's version of the 166 bit RDKit/MACCS keys:
  --rdmaccs, --rdmaccs/2
                        generate 166 bit RDKit/MACCS fingerprints (version 2)
  --rdmaccs/1
                        use the version 1 definition for --rdmaccs
This program guesses the input structure format and the compression
based on the filename extension. If the guess fails then it assumes
the input is an uncompressed SMILES file.
If the data comes from stdin, or the guess based on extension name is
wrong, then use "--in" to change the default input format.
Use the '-R' reader arguments option to pass in format-specific structure
reader arguments. The details depend on the specific format.
Use the command-line option `--help-formats` to display a list of
available formats and reader arguments.
```

The following comes from rdkit2fps --help-formats

These are the structure file formats that chemfp can read when using the  $RDKit\ toolkit$ .

By default, chemfp uses the filename extension to determine the format type. If the filename ends with ".gz" or ".zst" then it is intepreted as a gzip or Zstandard compressed file, and the second-to-last extension is used to determine the format type. Unknown or unsupported extensions are interpreted as a SMILES file.

You may instead specify the file format by name (see below), which is especially important when reading from stdin, which has no associated filename extension.

The supported filename extensions are:

```
File Type
          Extension(s)
SMILES
         can, ism, isosmi, smi, usm
          mdl, sd, sdf
  SDF
  InChI
          inchi
Tripos Mol2 mol2
  PDB
          ent, pdb
 Maestro
          mae, maegz
  FASTA
          faa, fasta
```

The format can also be specified by name using the '--in' option:

```
File Type
          Format name (append .gz or .zst if compressed)
          _____
========
  SMILES
          smi, can, usm
  SDF
          sdf
  InChI
          inchi
Tripos Mol2 mol2
  PDB
          pdb
 Maestro
          mae
  FASTA
          fasta
```

The input format parsers can be configured with the "-R" option. For example, the following reader arguments tell the SMILES readers that the fields are whitespace delimited and the first line is a header.

-R delimiter=whitespace -R has\_header=true

All of the input formats implement the 'sanitize' option, which is enabled by default. Use "-R sanitize=false" to disable sanitization.

The SMILES format parsers use two additional reader arguments:

- \* 'delimiter' specifies the delimiter type. The default is 'to-eol'. The other values are 'tab', 'whitespace', 'space' and 'native'. Use "-R delimiter=native" to match RDKit's native delimiter style, which is 'whitespace'.
- \* 'has header', if false will skip the first line

```
of the SMILES file (because it is a header line).
The SDF format parser supports two additional reader arguments:
  * 'strictParsing', if false will disable strict parsing
   * 'removeHs', if false will keep all of the hydrogens
The InChI format parser supports four additional reader arguments:
  * 'delimiter' works the same as it does for the SMILES formats
  * 'removeHs' works the same as it does for the SDF format
  * 'treatWarningAsError', if true treats all warnings as errors
   * 'logLevel' specifies the RDKit/InChI library log level, as an integer
The Tripos Mol2 format parser supports two additional reader arguments:
   * 'removeHs' works the same as it does for the SDF format
   * 'cleanupSubstructures' if false disables standardizing
      some substructures found in Mol2 files
The PDB format parser supports three additional reader arguments:
  * 'removeHs' works the same as it does for the SDF format
  * 'flavor', an input parameter with no documented meaning
   * 'proximityBonding', if false will disable automatic
       automatic proximity bonding
The Maestro format parser supports one additional reader argument:
   * 'removeHs' works the same as it does for the SDF format
The FASTA format parser supports one additional reader argument:
   * 'flavor', an integer from 0 to 9. The values mean:
       0 - the sequence contains L-amino acids
      1 - allow lowercase for D-amino acids
                              6 - DNA with no cap
      2 - RNA with no cap
                             7 - DNA with 5' cap
8 - DNA with 3' cap
      3 - RNA with 5' cap
       4 - RNA with 3' cap
       5 - RNA with both caps 9 - DNA with both caps
```

### 3.5 cdk2fps command-line options

The following comes from cdk2fps --help:

{strict,report,ignore}] [--help-formats] [-R NAME=VALUE] [--delimiter {tab, whitespace, to-eol, space}] [--has-header] [--version] [--license-check] [filenames ...] Generate FPS or FPB fingerprints from a structure file using CDK via JPype positional arguments: filenames input structure files (default is stdin) optional arguments: -h, --help show this help message and exit --type TYPE\_STRING Specify a chemfp type string --using FILENAME Get the fingerprint type from the metadata of a fingerprint file --Daylight Make Daylight-like fingerprints using cdk.fingerprinter.Fingerprinter (default) Make Daylight-like fingerprints (ignoring bond types) --GraphOnly using GraphOnlyFingerprinter Make 166-bit MACCS keys using MACCSFingerprinter --MACCS --EState Make 79-bit EState fingerprints using EStateFingerprinter --Extended Make Daylight-like fingerprints extended with ring feature bits, using ExtendedFingerprinter Make Daylight-like fingerprints based on SP2 --Hybridization hybridization instead of aromaticity, using HybridizationFingerprinter --KlekotaRoth Make 4860-bit Klekota-Roth fingerprint, using KlekotaRothFingerprinter --Pubchem Make 881-bit PubChem fingerprint, using PubchemFingerprinter --Substructure Make 307-bit substructure fingerprint, using SubstructureFingerprinter --ShortestPath Make fingerprints based on the shortest path between atoms, ring systems, and more, using ShortestPathFingerprinter --ECFPO Make ECFPO-like circular fingerprints, using CircularFingerprinter(CLASS\_ECFP0) --ECFP2 Make ECFP2-like circular fingerprints, using CircularFingerprinter(CLASS\_ECFP2) Make ECFP4-like circular fingerprints, using --ECFP4 CircularFingerprinter(CLASS\_ECFP4) --ECFP6 Make ECFP6-like circular fingerprints, using CircularFingerprinter(CLASS\_ECFP6) --FCFP0 Make FCFPO-like circular feature fingerprints, using CircularFingerprinter(CLASS\_FCFP0) Make FCFP2-like circular feature fingerprints, using --FCFP2 CircularFingerprinter(CLASS\_FCFP2) --FCFP4 Make FCFP4-like circular feature fingerprints, using CircularFingerprinter(CLASS\_FCFP4) --FCFP6 Make FCFP6-like circular feature fingerprints, using CircularFingerprinter(CLASS\_FCFP6)

```
Make 780-bit atom-pair fingerprints adapted from Yap
  --AtomPairs2D
                        Chun Wei's PaDEL, using AtomPairs2DFingerprinter
                        fingerprint size (default=1024)
  --size INT
                        search depth (default=7)
  --searchDepth INT
  --pathLimit INT
                        path limit (default=42000)
  --hashPseudoAtoms 0|1
                        include pseudo-atoms in path enumeration (default=0)
  --perceiveStereochemistry 0|1
                        re-perceive stereochemistry from 2D/3D coordinates
                        (default=0)
  --id-tag NAME
                        tag name containing the record id (SD files only)
  --in FORMAT
                        input structure format (default autodetects from the
                        filename extension)
  -o FILENAME, --output FILENAME
                        save the fingerprints to FILENAME (default=stdout)
  --out FORMAT
                        output structure format (default guesses from output
                        filename, or is 'fps')
  --errors {strict,report,ignore}
                        how should structure parse errors be handled?
                        (default=ignore)
  --help-formats
                        list the available formats and reader arguments
  -R NAME=VALUE
                        specify a reader argument
  --delimiter {tab, whitespace, to-eol, space}
                        delimiter style for SMILES and InChI files. Alias for
                        '-R delimiter=VALUE'.
  --has-header
                        Skip the first line of a SMILES or InChI file Alias
                        for '-R has_header=1'
  --version
                        show program's version number and exit
  --license-check
                        Check the license and report results to stdout.
By default the CDK structure reader determines the file format
and compression type based on the filename extension. Unknown
filename extensions are treated as a uncompressed SMILES files.
If the data comes from stdin, or the guess based on extension name is
wrong, then use "--in FORMAT" option to change the default input format.
For examples:
  --in smi
   --in sdf.gz
Use `-R` to specify format-specific reader arguments.
Use `--help-formats` for a list of available formats and reader arguments.
```

The following comes from cdk2fps --help-formats

These are the structure file formats that chemfp and read when using the CDK toolkit.

By default, chemfp uses the filename extension to determine the format type. If the filename ends with ".gz" or ".zst" then it is intepreted

as a gzip or Zstandard compressed file, and the second-to-last extension is used to determine the format type. Unknown or unsupported extensions are interpreted as a SMILES file.

Note: Zstandard support may depend the "zstandard" Python package and/or the "zstd-jni" Java package. To install the Python package see https://pypi.org/project/zstandard/. To get the Java jar file, see https://github.com/luben/zstd-jni and place it in your CLASSPATH.

You may instead specify the file format by name (see below), which is especially important when reading from stdin, which has no associated filename extension.

The supported filename extensions are:

The format can also be specified by name using the '--in' option:

```
File Type Format name (append .gz or .zst if compressed)

========

SMILES smi, can, usm

SDF sdf
InChI inchi
```

The input format parsers can be configured with the "-R" option. For example, the following reader arguments tell the SMILES readers that the fields are whitespace delimited and the first line is a header.

-R delimiter=whitespace -R has\_header=true

The SMILES format parsers use two additional reader arguments:

- \* 'delimiter' specifies the delimiter type. The default is 'to-eol'.

  The other values are 'tab', 'whitespace', 'space' and 'native'.

  Use "-R delimiter=native" to match RDKit's native delimiter style, which is 'whitespace'.
- \* 'has\_header', if false will skip the first line of the SMILES file (because it is a header line).
- \* 'kekulise': The default of '1' will Kekulize the SMILES. Use '0' to skip this step.
- \* 'implementation': The default 'cdk' uses CDK's IteratingSMILESReader() to parse the SMILES file. The 'chemfp' implementation uses chemfp's Python-based SMILES file parser and CDK's SmilesParser() to parse parse each SMILES string. The chemfp implementation is slower but may have better error-handling and/or reporting.

The SDF format parser supports five reader arguments:

 $\ast$  'mode' can be one of 'RELAXED' or 'STRICT'. The default relaxed

mode supports some records with recoverable errors. The strict mode fails to parse those records.

- \* 'ForceReadAs3DCoordinates', with the default of '0' interprets V2000 records where all z-coordinates == 0.0 as 2D records. The value '1' tells CDK to interpret all records as 3D.
- \* 'AddStereoElements' with the default of '1' adds OD stereochemistry to V2000 records. The value of '0' skips that step.
- \* 'InterpretHydrogenIsotopes with the default of '1' interprets the atom symbols 'D' and 'T' as [2H] and [3H], respectively. Use '0' to disable this interpretation.
- \* 'implementation': The default 'cdk' uses CDK's SDFReaderFactory() to parse the SD file. The 'chemfp' implementation uses chemfp's SD file parser to parse records, and CDK's MDLReader(), MDLV2000Reader(), or MDLV3000Reader() to parse each record. The chemfp implementation is about 50% slower than the cdk parser but may have better error-handling and/or reporting.

The InChI format parser supports one reader argument:

\* 'delimiter' works the same as it does for the SMILES formats

#### 3.6 sdf2fps command-line options

The following comes from sdf2fps --help:

```
usage: sdf2fps [-h] [--id-tag TAG] [--fp-tag TAG] [--in FORMAT]
                  [--num-bits INT] [--errors {strict,report,ignore}]
                  [-o FILENAME] [--out FORMAT] [--software TEXT] [--type TEXT]
                  [--version] [--license-check] [--binary] [--binary-msb]
                  [--hex] [--hex-lsb] [--hex-msb] [--base64] [--cactvs]
                  [--daylight] [--decoder DECODER] [--pubchem]
                  [filenames ...]
Extract a fingerprint tag from an SD file and generate FPS or FPB fingerprints
positional arguments:
  filenames
                        input SD files (default is stdin)
optional arguments:
  -h, --help
                        show this help message and exit
                        get the record id from TAG instead of the first line
  --id-tag TAG
                        of the record
  --fp-tag TAG
                        get the fingerprint from tag TAG (required)
  --in FORMAT
                        Specify the input format (one of "sdf", "sdf.gz", or
                        "sdf.zst")
  --num-bits INT
                        use the first INT bits of the input. Use only when the
                        last 1-7 bits of the last byte are not part of the
                        fingerprint. Unexpected errors will occur if these
                        bits are not all zero.
  --errors {strict,report,ignore}
                        how should structure parse errors be handled?
```

```
(default=strict)
  -o FILENAME, --output FILENAME
                        save the fingerprints to FILENAME (default=stdout)
                        output format, one of 'fps', 'fps.gz', 'fps.zst',
  --out FORMAT
                        'fpb', or 'flush' (default guesses from output
                        filename, or is 'fps')
                        use TEXT as the software description
  --software TEXT
  --type TEXT
                        use TEXT as the fingerprint type description
  --version
                        show program's version number and exit
  --license-check
                        Check the license and report results to stdout.
Fingerprint decoding options:
                        Encoded with the characters '0' and '1'. Bit #0 comes
  --binary
                        first. Example: 00100000 encodes the value 4
  --binary-msb
                        Encoded with the characters '0' and '1'. Bit #0 comes
                        last. Example: 00000100 encodes the value 4
  --hex
                        Hex encoded. Bit #0 is the first bit (1<<0) of the
                        first byte. Example: 01f2 encodes the value \x01\xf2 =
  --hex-lsb
                        Hex encoded. Bit #0 is the eight bit (1<<7) of the
                        first byte. Example: 804f encodes the value \x01\xf2 =
                        498
                        Hex encoded. Bit #0 is the first bit (1<<0) of the
  --hex-msb
                        last byte. Example: f201 encodes the value \x01\xf2 =
  --base64
                        Base-64 encoded. Bit #0 is first bit (1<<0) of first
                        byte. Example: AfI= encodes value \x01\xf2 = 498
  --cactvs
                        CACTVS encoding, based on base64 and includes a
                        version and bit length
  --daylight
                        Daylight encoding, which is a base64 variant
  --decoder DECODER
                        import and use the DECODER function to decode the
                        fingerprint
shortcuts:
  --pubchem
                        decode CACTVS substructure keys used in PubChem. Same as
                        --software=CACTVS/unknown --type 'CACTVS-E_SCREEN/1.0
                        extended=2' --fp-tag=PUBCHEM_CACTVS_SUBSKEYS --cactvs
```

### 3.7 simsearch command-line options

The following comes from simsearch --help:

```
[--no-mmap] [--times] [--version] [--license-check]
                    target filename
Search an FPS or FPB file for similar fingerprints
positional arguments:
  target_filename
                        target filename
optional arguments:
  -h, --help
                        show this help message and exit
  -k K_NEAREST, --k-nearest K_NEAREST
                        select the k nearest neighbors (use 'all' for all
                        neighbors)
  -t THRESHOLD, --threshold THRESHOLD
                        minimum similarity score threshold
  --alpha ALPHA
                        Tversky alpha parameter (default: 1.0)
  --beta BETA
                        Tversky beta parameter (default: the value of --alpha)
  --queries QUERIES, -q QUERIES
                        filename containing the query fingerprints
 --NxN
                        use the targets as the queries, and exclude the self-
                        similarity term
  --query QUERY
                        query as a structure record (default format: 'smi')
  --hex-query HEX_QUERY
                        query in hex
  --query-id QUERY_ID
                        id for the query or hex-query (default: 'Query1'
  --query-format FORMAT, --in FORMAT
                        input query format (default uses the file extension,
                        else 'fps')
  --target-format FORMAT
                        input target format (default uses the file extension,
                        else 'fps')
  --query-type STRING
                        fingerprint type string if the queries are structures
                        (default: use the target fingerprint type)
  --id-tag NAME
                        tag containing the record id if --query-format is an
                        SD file)
  --errors {strict,report,ignore}
                        how should structure parse errors be handled?
                        (default=ignore)
                        specify a reader argument
  -R NAME=VALUE
  --delimiter {tab, whitespace, to-eol, space}
                        delimiter style for SMILES and InChI files. Alias for
                        '-R delimiter=VALUE'.
  --has-header
                        Skip the first line of a SMILES or InChI file Alias
                        for '-R has_header=1'
  -o FILENAME, --output FILENAME
                        output filename (default is stdout)
  -c, --count
                        report counts
  -b BATCH_SIZE, --batch-size BATCH_SIZE
                        batch size
                        scan the file to find matches (low memory overhead)
  --scan
                        build and search an in-memory data structure
  --memory
                        (faster for multiple queries)
```

no-mmap	don't use mmap to read uncompressed FPB
	files. May give better performance on
	networked file systems, at the expense
	of higher memory use.
times	report load and execution times to stderr
version	show program's version number and exit
license-check	Check the license and report results to stdout.

### Fingerprints and fingerprint search examples

The chemfp command-line programs use a Python library called chemfp. Portions of the API are in flux and subject to change. The stable portions of the API which are open for general use are documented in *chemfp API*.

#### The API includes:

- low-level Tanimoto, Tversky, and popcount operations
- Tanimoto and Tversky search algorithms based on threshold and/or k-nearest neighbors
- routines for reading and writing fingerprints
- a cross-toolkit molecule I/O API
- a cross-toolkit fingerprint type API

The following chapters give examples of how to use the API, starting with fingerprints, fingerprint I/O, and fingerprint search.

## 4.1 Python 2 vs. Python 3

Python 2.7 support by the core Python developers ended at the start of 2020. The Python 2 series has reached its effective end-of-life. It's time for you to migrate code to Python 3.

If you are writing new code which uses chemfp then you really should start using Python 3. OpenEye stopped shipping a Python 2.7 version of OEChem by the end of 2017, and Open Babel and RDKit stopped Python 2.7 support by 2019. Chemfp 3.5 is the last version of the commercial chemfp development track which will support Python 2.

If you have code which works under Python 2 and you want it to work on Python 3, then there are two main options. In some cases you can re-write all the incompatible code, so the result works under Python 3 but not Python 2. However, that can be too big of a step.

Another option is to port your code to the subset of Python which works under both Python 2 and Python 3. While this is more work overall, the steps are smaller, and it's possible to develop new features while gradually doing the port.

A goal of the chemfp 3 series is to help with that migration. It supports both Python 2.7 and Python 3.6 or later, with the same API.

This documentation is written with that second option in mind. The examples are shown in Python 3, but the same code will work under Python 2.7. The only differences are in the output, which I'll detail in the next section.

#### 4.2 Unicode and byte strings

In chemfp 3.x, the record identifier is a Unicode string while the fingerprint is a byte string. Earlier versions of chemfp treated both identifiers and fingerprints as byte strings. To make things more confusing, Python 2 and Python 3 use different ways to input and denote Unicode and binary strings.

Under Python 2, normal strings are byte strings, while Unicode strings are represented with the u"" syntax:

```
>>> "This is a byte string" # Python 2
'This is a byte string'
>>> u"This is a Unicode string"
u'This is a Unicode string'
```

Under Python 3, normal strings are Unicode strings, while byte strings are represented with the b"" syntax:

```
>>> b"This is a byte string" # Python 3
b'This is a byte string'
>>> "This is a Unicode string"
'This is a Unicode string'
```

Python 2.7 understands the b"" notation, and Python 3 understands the u"" notation, so the portable way to represent a Unicode identifier and binary fingerprint is to be explicit about the string type:

```
>>> id = u"España"  # Works in Python 2.7 and Python 3
>>> fp = b"\x00A!\xff"
```

While the data types are the same, the output representations are different on the two versions of Python:

```
>>> (id, fp)  # Python 2.7
(u'Espa\xf1a', '\x00A!\xff')
>>> (id, fp)  # Python 3
('España', b'\x00A!\xff')
```

The output in these examples will be from Python 3. Unless otherwise stated, the equivalent output in Python 2.7 differs only in the prefix.

### 4.3 Hex representation of a binary fingerprint

In Python 2 it is easy to turn a byte string into a hex-encoded string:

```
>>> fp = b"\x00A!\xff" # Python 2.7
>>> fp.encode("hex")
'004121ff'
```

The more direct route (and faster) is to use the binascii.hexlify function:

```
>>> import binascii # Python 2.7
>>> binascii.hexlify(fp)
'004121ff'
```

In Python 3 it's even easier to turn a byte string into a hex-encoded string:

```
>>> fp = b"\x00A!\xff" # Python 3
>>> fp.hex()
'004121ff'
```

but that is not portable. Nor does fp.encode("hex") work, because in Python 3 byte strings do not have an encode() method:

```
>>> fp.encode("hex") # Python 3
Traceback (most recent call last):
   File "<stdin>", line 1, in <module>
AttributeError: 'bytes' object has no attribute 'encode'
```

If you want a byte string as output then the portable solution is to use hexlify:

```
>>> import binascii # Python 3
>>> binascii.hexlify(fp)
b'004121ff'
```

However, on Python 2.7 I often want the hex-encoded version as a byte ("normal") string, while on Python 3 I want it as a ("normal") Unicode string, because I use hex strings for text output.

Python does not offer a portable solution, but chemfp does, in the chemfp.bitops module, named  $hex\_encode$ 

```
>>> from chemfp import bitops # Python 2 and Python 3
>>> bitops.hex_encode(b"\x00A!\xff")
'004121ff'
```

The variant hex\_encode\_as\_bytes returns a byte string, and I think is easier to remember than binascii. hexlify:

```
>>> bitops.hex_encode_as_bytes(b"\x00A!\xff")
b'004121ff'
```

### 4.4 Byte and hex fingerprints

In this section you'll learn how chemfp stores fingerprints and some of the low-level bit operations on those fingerprints.

chemfp stores fingerprints as byte strings. Here are two 8 bit fingerprints:

```
>>> fp1 = b"A"
>>> fp2 = b"B"
```

The *chemfp.bitops* module contains functions which work on byte fingerprints. Here's the *byte Tanimoto* of those two fingerprints:

```
>>> from chemfp import bitops
>>> bitops.byte_tanimoto(fp1, fp2)
0.33333333333333333
```

To understand why, you have to know that ASCII character "A" has the value 65, and "B" has the value 66. The bit representation is:

```
"A" = 01000001 and "B" = 01000010
```

You can compute the Tanimoto between any two byte strings with the same length, as in:

```
>>> bitops.byte_tanimoto(b"apples&", b"oranges")
0.5833333333333334
```

You'll get a ValueError if they have different lengths:

```
>>> bitops.byte_tanimoto(b"ABC", b"A")
Traceback (most recent call last):
   File "<stdin>", line 1, in <module>
   ValueError: byte fingerprints must have the same length
```

The Tversky index is also available. The default values for alpha and beta are 1.0, which is identical to the Tanimoto:

```
>>> bitops.byte_tversky(b"apples&", b"oranges")
0.58333333333334
>>> bitops.byte_tversky(b"apples&", b"oranges", 1.0, 1.0)
0.5833333333333334
```

Using alpha = beta = 0.5 gives the Dice index:

```
>>> bitops.byte_tversky(b"apples&", b"oranges", 0.5, 0.5)
0.7368421052631579
```

In chemfp, the alpha and beta may be between 0.0 and 100.0, inclusive. Values outside that range will raise a ValueError:

```
>>> bitops.byte_tversky(b"A", b"B", 0.2, 101)
Traceback (most recent call last):
   File "<stdin>", line 1, in <module>
ValueError: beta must be between 0.0 and 100.0, inclusive
```

Most fingerprints are not as easy to read as the English ones I showed above. They tend to look more like:

```
P1@\x84K\x1aN\x00\n\x01\xa6\x10\x98\\\x11
```

which is hard to read. I usually show hex-encoded fingerprints. The above fingerprint in hex is:

#### 503140844b1a4e000a01a610985c1011

which is simpler to read. I'll use *hex\_encode* as the portable way to convert a byte fingerprint to a string under Python 2 and Python 3:

```
>>> bitops.hex_encode(b"apples&") # Portable (returns a native string)
'6170706c657326'
>>> bitops.hex_encode(b"oranges")
'6f72616e676573'
>>> bitops.hex_decode(b"416e64726577") # (returns a byte string)
b'Andrew'
```

If you do not need to support Python 2.7 then it's easier to use the Python3 specific ".hex()" and "fromhex()" methods of byte strings:

```
>>> b"apples&".hex()  # Python 3 only!
'6170706c657326'
>>> b"oranges".hex()  # Python 3 only!
'6f72616e676573'
>>> bytes.fromhex("416e64726577")  # Python 3 only!
b'Andrew'
```

Most of the byte functions in the bitops module have an equivalent hex version, like bitops.hex\_tanimoto() which is the hex equivalent for bitops.byte tanimoto():

```
>>> bitops.hex_tanimoto("6170706c657326", "6f72616e676573")
0.583333333333334
>>> bitops.hex_tanimoto(u"6170706c657326", u"6f72616e676573")
0.58333333333333334
>>> bitops.hex_tanimoto(b"6170706c657326", b"6f72616e676573")
0.5833333333333333334
```

These functions accept both byte strings and Unicode strings.

Even though hex-encoded fingerprints are easier to read than raw bytes, it can still be hard to figure out that which bit is set in the hex fingerprint "00001000" (which is the byte fingerprint " $x00\x00\x10\x00$ "). For what it's worth, bit number 20 is set, where bit 0 is the first bit.

You can get the list of "on" bits with the bitops.byte\_to\_bitlist() function:

```
>>> bitops.byte_to_bitlist(b"P1@\x84K\x1aN\x00\n\x01\xa6\x10\x98\\x10\x11")
[4, 6, 8, 12, 13, 22, 26, 31, 32, 33, 35, 38, 41, 43, 44, 49, 50,
51, 54, 65, 67, 72, 81, 82, 85, 87, 92, 99, 100, 103, 106, 107,
108, 110, 116, 120, 124]
```

That's a lot of overhead if you only want to tell if, say, bit 41 is set. For that case use bitops. byte\_contains\_bit():

```
>>> bitops.byte_contains_bit(b"P1@\x84K\x1aN\x00\n\x01", 41)
True
>>> bitops.byte_contains_bit(b"P1@\x84K\x1aN\x00\n\x01", 42)
False
```

The bitops.byte\_from\_bitlist() function creates a fingerprint given a list of 'on' bits. By default it generates a 1024 bit fingerprint, which is a bit too long for this documentation. I'll use 64 bits instead:

```
>>> bitops.byte_from_bitlist([0], 64)
b'\x01\x00\x00\x00\x00\x00\x00'
```

The bit positions folded based on the modulo of the fingerprint size, so bit 65 is mapped to bit 1, as in the following:

```
>>> bitops.byte_from_bitlist([0, 65], 64)
b'\x03\x00\x00\x00\x00\x00\x00'
>>> bitops.byte_to_bitlist(bitops.byte_from_bitlist([0, 65], 64))
[0, 1]
```

The bitops module includes other low-level functions which work on byte fingerprints, as well as corresponding functions which work on hex fingerprints. (Hex-encoded fingerprints are decidedly second-class citizens in chemfp, but they are citizens.) The byte-based functions are:

- byte\_contains test if the first fingerprint is contained in the second
- $byte\_contains\_bit$  test if a specified fingerprint bit is on
- byte\_difference return a fingerprint which is the difference (xor) of two fingerprints
- byte\_from\_bitlist create a fingerprint given 'on' bit positions
- byte\_intersect return a fingerprint which is the intersection of two fingerprints
- byte\_intersect\_popcount intersection popcount between two fingerprints
- byte\_popcount fingerprint popcount
- byte\_tanimoto Tanimoto similarity between two fingerprints
- byte\_tversky Tversky index between two fingerprints
- byte\_to\_bitlist get a list of the 'on' bit positions
- byte\_union return a fingerprint which is the union of two fingerprints
- hex\_encode hex encode a byte string, returns the native string type
- hex\_encode\_as\_bytes hex encode a byte string, returns a byte string

The hex-based functions are:

- hex\_contains test if the first hex fingerprint is contained in the second
- hex\_contains\_bit test if a specified hex fingerprint bit is on
- hex\_difference return a fingerprint which is the difference (xor) of two hex fingerprints
- hex\_from\_bitlist create a fingerprint given 'on' bit positions in a hex fingerprint
- $\bullet$   $hex\_intersect$  return a fingerprint which is the intersection of two hex fingerprints
- hex\_intersect\_popcount intersection popcount between two hex fingerprints
- hex\_isvalid test if the string is a hex-encoded fingerprint
- hex\_popcount hex fingerprint popcount
- hex\_tanimoto Tanimoto similarity between two hex fingerprints
- hex\_tversky Tversky index between two hex fingerprints
- hex\_to\_bitlist get a list of the 'on' bit positions in a hex fingerprint
- hex\_union return a fingerprint which is the union of two hex fingerprints

• hex\_decode - convert a hex-encoded string into a byte string

There are two functions which compare a byte fingerprint to a hex fingerprint. These are somewhat faster than the pure hex version because they don't need to verify that the query fingerprint contain only hex characters:

- byte\_hex\_tanimoto Tanimoto similarity between a byte and a hex fingerprint
- byte\_hex\_tversky Tversky index between a byte and a hex fingerprint

#### 4.5 Fingerprint reader and metadata

In this section you'll learn the basics of the fingerprint reader classes and fingerprint metadata.

A fingerprint record is the fingerprint plus an identifier. In chemfp, a *fingerprint reader* is an object which supports iteration through fingerprint records. There some fingerprint readers, like the *FingerprintArena* also support direct record lookup.

That's rather abstract, so let's work with a few real examples. You'll need to create a copy of the "pubchem\_targets.fps" file generated in *Generate fingerprint files from PubChem SD tags* in order to follow along.

Here's how to open an FPS file:

```
>>> import chemfp
>>> reader = chemfp.open("pubchem_targets.fps")
```

Every fingerprint collection has a metadata attribute with details about the fingerprints. It comes from the header of the FPS file. You can view the metadata in Python repr format:

```
>>> reader.metadata
Metadata(num_bits=881, num_bytes=111, type='CACTVS-E_SCREEN/1.0 extended=2',
aromaticity=None, sources=['Compound_048500001_049000000.sdf.gz'],
software='CACTVS/unknown', date='2020-05-11T14:35:11')
```

In chemfp 3.x the type, software, date and the source filenames are Unicode strings. In earlier versions of chemfp these were byte strings.

I added a few newlines to make that easier to read, but I think it's easier still to view it in string format, which matches the format of the FPS header:

```
>>> from __future__ import print_function # Only needed in Python 2
>>> print(reader.metadata)
#num_bits=881
#type=CACTVS-E_SCREEN/1.0 extended=2
#software=CACTVS/unknown
#source=Compound_048500001_049000000.sdf.gz
#date=2020-05-11T14:35:11
```

(The print statement in Python 2 was replaced with a print function in Python 3. The special future statement tells Python 2 to use the new print function syntax of Python 3.)

All fingerprint collections support iteration. Each step of the iteration returns the fingerprint identifier and the fingerprint byte string. Since I know the 6th record has the id 14550010, I can write a simple loop which stops with that record:

Fingerprint collections also support iterating via arenas, and several support Tanimoto search methods.

### 4.6 Working with a FingerprintArena

In this section you'll learn about the FingerprintArena fingerprint collection and how to iterate through subarenas in a collection.

Chemfp supports two format types. The FPS format is designed to be easy to read and write, but searching through it requires a linear scan of the disk, which can only be done once. If you want to do many queries then it's best to load the FPS data into memory as a *FingerprintArena*.

Use chemfp. load\_fingerprints() to load fingerprints into an arena:

```
>>> from __future__ import print_function # Only needed for Python 2
>>> import chemfp
>>> arena = chemfp.load_fingerprints("pubchem_targets.fps")
>>> print(arena.metadata)
#num_bits=881
#type=CACTVS-E_SCREEN/1.0 extended=2
#software=CACTVS/unknown
#source=Compound_048500001_049000000.sdf.gz
#date=2020-05-11T14:35:11
```

The fingerprints can come from an FPS file, as in this example, or from an FPB file. The FPB format is much more complex internally, but can be loaded directly and quickly into a FingerprintArena, also with the same function:

```
>>> arena = chemfp.load_fingerprints("pubchem_targets.fpb")
```

An arena implements the fingerprint collection API, so you can do things like iterate over an arena and get the id/fingerprint pairs:

```
>>> from chemfp import bitops
>>> for id, fp in arena:
... print(id, "with popcount", bitops.byte_popcount(fp))
... if id == u"48656867":
... break
```

```
48942244 with popcount 33
48941399 with popcount 39
48940284 with popcount 40
48943050 with popcount 40
48656359 with popcount 41
48656867 with popcount 42
```

If you look closely you'll notice that the fingerprint record order has changed from the previous section, and that the population counts are suspiciously non-decreasing. By default <code>load\_fingerprints()</code> on an FPS file reorders the fingerprints into a data structure which is faster to search, though you can disable that with the <code>reorder</code> parameter if you want the fingerprints to be the same as the input order.

The *FingerprintArena* has new capabilities. You can ask it how many fingerprints it contains, get the list of identifiers, and look up a fingerprint record given an index:

```
>>> len(arena)
14967
>>> list(arena.ids[:5])
['48942244', '48941399', '48940284', '48943050', '48656359']
>>> id, fp = arena[6]
>>> id
'48839855'
>>> arena[-1][0] # the identifier of the last record in the arena
'48985180'
>>> bitops.byte_popcount(arena[-1][1]) # its fingerprint
253
```

An arena supports iterating through subarenas. This is like having a long list and being able to iterate over sublists. Here's an example of iterating over the arena to get subarenas of size 2000 (excepting the last), and print information about each subarena:

To help demonstrate what's going on, I showed the first id of each record along with the main arena ids for records 0 and 2000, so you can verify that they are the same.

Arenas are a core part of chemfp. Processing one fingerprint at a time is slow, so the main search routines expect to iterate over query arenas, rather than query fingerprints.

That's why the FPSReaders – and all chemfp fingerprint collections – also support the chemfp.

FingerprintReader.iter\_arenas() method. Here's an example of reading 25 records at a time from the targets file:

Those add up to 10826, which you can verify is the number of structures in the original source file.

If you have a FingerprintArena then you can also use Python's slice notation to make a subarena:

```
>>> queries = chemfp.load_fingerprints("pubchem_queries.fps")
>>> queries[10:15]
<chemfp.arena.FingerprintArena object at 0x552c10>
>>> queries[10:15].ids
['99110546', '99110547', '99123452', '99123453', '99133437']
>>> queries.ids[10:15] # a different way to get the same list
['99110546', '99110547', '99123452', '99123453', '99133437']
```

The big restriction is that slices can only have a step size of 1. Slices like [10:20:2] and [::-1] aren't supported. If you want something like that then you'll need to make a new arena instead of using a subarena slice. (Hint: pass the list of indices to the arena's copy method.)

In case you were wondering, yes, you can use iter\_arenas and the the other FingerprintArena methods on a subarena:

```
>>> queries[10:15][1:3].ids
['99110547', '99123452']
>>> queries.ids[11:13]
['99110547', '99123452']
```

### 4.7 Create an arena with user-specified fingerprints

In this section you'll learn how to create an arena containing user-specified fingerprint data.

Most of the examples in this manual use fingerprints created by a cheminformatics toolkit or extracted from an SD file. Chemfp accepts any byte string as a fingerprint, which includes, for example, novel fingerprint types which you have created for your own research.

The first parameter of the <code>load\_fingerprints()</code> function can be any iterator which returns a sequence of Unicode identifier and byte string fingerprint. For example, if you have three fingerprint records where each fingerprint contains 32-bits of data, like this:

```
>>> data = [(u"ID1", b"\xc4\xa7\xd2\x1e"),
... (u"ID2", b"\x04\x82\xd6\x08"),
... (u"ID3", b"\xc1\xa3\xd2\x1e")]
```

then you can pass the list directly to *load\_fingerprints*, along with a Metadata instance to tell chemfp the fingerprint size and type:

```
>>> import chemfp
>>> arena = chemfp.load_fingerprints(data,
... chemfp.Metadata(num_bytes=4, type="Example/19"))
>>> len(arena)
3
```

What if the fingerprint data comes from a file which isn't in FPS format? The *chemfp.bitops* and *chemfp.* encodings modules contains functions which can help with the conversion. Suppose each line in the file contains an id followed by a list of bit indices for the on bits:

```
>>> lines = ["ID1 0 1 9 10 11 14 15 16 18 19 43\n",
... "ID2 0 1 2 9 10 11 12 14 18 19 20 43\n"]
```

The following function reads the lines, parses the id and bit list, converts the bitlist into a 64-bit byte string, and yields the id/fingerprint pairs:

```
>>> def get_id_and_fp(lines):
...    for line in lines:
...    fields = line.split()
...    bitlist = [int(bit) for bit in fields[1:]]
...    yield fields[0], bitops.byte_from_bitlist(bitlist, 64)
...
>>> for id, fp in get_id_and_fp(lines):
...    print(id, repr(fp))
...
ID1 b'\x03\xce\r\x00\x00\x00\x08\x00\x00'
ID2 b'\x07^\x1c\x00\x00\x00\x08\x00\x00'
```

Here's one way to use the function to create an arena:

```
>>> arena = chemfp.load_fingerprints(get_id_and_fp(lines),
... metadata=chemfp.Metadata(num_bits=64))
>>>
>>> len(arena)
n2
>>> arena.get_fingerprint(0)
b'\x03\xce\r\x00\x00\x00\x00\x00'
```

It's a bit cumbersome to pass the metadata into *load\_fingerprints* when the parser already knows that information, but there's a better way. If no metadata is passed to the *load\_fingerprints* function then the function will try to get it from the *metadata* attribute of the first function. That's why you get an exception if you omit the metadata:

```
>>> arena = chemfp.load_fingerprints(get_id_and_fp(lines))
Traceback (most recent call last):
   File "<stdin>", line 1, in <module>
   File "chemfp/__init__.py", line 550, in load_fingerprints
      alignment=alignment)
   File "chemfp/arena.py", line 849, in fps_to_arena
      metadata = fps_reader.metadata
AttributeError: 'generator' object has no attribute 'metadata'
```

Instead, wrap the metadata and id/fingerprint iterator inside of a FingerprintIterator utility class:

The result can be passed directly to *load\_fingerprints*:

```
>>> arena = chemfp.load_fingerprints(read_bitlist_format(lines))
>>> len(arena)
2
>>> arena[1]
('ID2', b'\x07^\x1c\x00\x00\x00\x00\x00')
```

The FingerprintIterator also implements the *FingerprintReader.save()* method, which can be used to save the fingerprints to an FPS or FPB file. See the next section for more details.

#### 4.8 Save a fingerprint arena

In this section you'll learn how to save an arena in FPS and FPB formats.

This is probably the easiest section. If you have an arena (or any FingerprintReader), like:

```
>>> import chemfp
>>> queries = chemfp.load_fingerprints("pubchem_queries.fps")
```

then you can save it to an FPS file using the *FingerprintReader.save()* method and a filename ending with ".fps". (You'll also get an FPS file if you specify an unknown extension.):

```
>>> queries.save("example.fps")
```

If the filename ends with ".fps.gz" then the file will be saved as a gzip-compressed FPS file, and if the filename ends with ".fpb.zst" and the zstandard Python package is installed, then the file will be saved as a zstandard-compressed FPS file.

Finally, if the name ends with ".fpb", as in:

```
>>> queries.save("example.fpb")
```

then the result will be in FPB format. The save() method can also save gzip- and zstandard-compressed FPB files.

The save method supports a second option, *format*, should you for some odd reason want the format to be different than what's implied by the filename extension:

```
>>> queries.save("example.fpb", "fps") # save in FPS format
```

The save method supports a third option, *level*, which specifies the compression level. This should be an integer appropriate for the compression library. The string aliases "min", "default", and "max" are mapped to the appropriate compression level for the given format: "min" is 1; "default" is 9 for gzip and 3 for zstandard; "max" is 9 for gzip and 19 for zstandard.

#### 4.9 How to use query fingerprints to search for similar target fingerprints

In this section you'll learn how to do a Tanimoto search using the previously created PubChem fingerprint files for the queries and the targets from Generate fingerprint files from PubChem SD tags.

It's faster to search an arena, so I'll load the target fingerprints:

```
>>> from __future__ import print_function # Only for Python 2.7
>>> import chemfp
>>> targets = chemfp.load_fingerprints("pubchem_targets.fps")
>>> len(targets)
14967
```

and open the queries as an FPSReader.

```
>>> queries = chemfp.open("pubchem_queries.fps")
```

I'll use *chemfp.threshold\_tanimoto\_search()* to find, for each query, all hits which are at least 0.7 similar to the query.

I'm only showing the first two hits for the sake of space. It seems rather pointless to show all 641 hits of query id 99000039.

However, there's a subtle problem here. The "list(hits)" returns a list of (index, score) tuples when the targets are an arena, and (id, score) tuples when the targets are a FPS reader. (I'll talk about that more in the next section for how that works.) It's best to always specify how you want the results. In my case I always want the identifiers and the scores so I'll use <code>hits.get\_ids\_and\_scores()</code>, like this:

which gives as output:

```
99000039 641 [('48528698', 0.7085714285714285), ('48529189', 0.7371428571428571)]
99000230 373 [('48737535', 0.703030303030303), ('48502523', 0.7041420118343196)]
99002251 270 [('48857943', 0.7006369426751592), ('48846196', 0.7088607594936709)]
99003537 523 [('48542237', 0.7230769230769231), ('48739065', 0.7085427135678392)]
99003538 523 [('48542237', 0.7230769230769231), ('48739065', 0.7085427135678392)]
99005028 131 [('48659090', 0.7589285714285714), ('48657042', 0.7522123893805309)]
99005031 131 [('48659090', 0.7589285714285714), ('48657042', 0.7522123893805309)]
99006292 308 [('48976796', 0.7058823529411765), ('48542022', 0.7)]
99006293 308 [('48976796', 0.7058823529411765), ('48542022', 0.7)]
99006597 0 []
# ... many lines omitted ...
```

What you don't see in either case is that the implementation uses the *chemfp.FingerprintReader*. *iter\_arenas()* interface on the queries so that it processes one subarena at a time. There's a tradeoff between a large arena, which is faster because it doesn't often go back to Python code, or a small arena, which uses less memory and is more responsive. You can change the tradeoff using the *arena\_size* parameter.

If all you need is the count of the hits at or above a given threshold then use chemfp.  $count\_tanimoto\_hits()$ :

```
>>> queries = chemfp.open("pubchem_queries.fps")
>>> for (query_id, count) in chemfp.count_tanimoto_hits(queries, targets, threshold=0.7):
...     print(query_id, count)
...
99000039 641
99000230 373
99002251 270
99003537 523
99003538 523
99005028 131
99005031 131
99006292 308
99006293 308
99006597 0
# ... many lines omitted ...
```

Or, if you only want the k=2 nearest neighbors to each target within that same threshold of 0.7 then use  $chemfp.knearest\_tanimoto\_search()$ :

```
>>> queries = chemfp.open("pubchem_queries.fps")
>>> for (query_id, hits) in chemfp.knearest_tanimoto_search(queries, targets, k=2,u threshold=0.7):
... print(query_id, hits.get_ids_and_scores())
...
99000039 [('48503376', 0.8784530386740331), ('48503380', 0.8729281767955801)]
99000230 [('48563034', 0.8588235294117647), ('48731730', 0.8522727272727273)]
99002251 [('48798046', 0.8109756097560976), ('48625236', 0.8106508875739645)]
99003537 [('48997075', 0.9035532994923858), ('48997697', 0.8984771573604061)]
99003538 [('48997075', 0.9035532994923858), ('48997697', 0.8984771573604061)]
99005028 [('48651160', 0.8288288288288288), ('48848576', 0.81666666666666666)]
99005031 [('48651160', 0.8288288288288288), ('48848576', 0.8166666666666666)]
99006292 [('48945841', 0.9652173913043478), ('48737522', 0.8793103448275862)]
99006293 [('48945841', 0.9652173913043478), ('48737522', 0.8793103448275862)]
```

```
99006597 [] # ... many lines omitted ...
```

#### 4.10 How to search an FPS file

In this section you'll learn how to search an FPS file directly, without loading it into a FingerprintArena. You'll need the previously created PubChem fingerprint files for the queries and the targets from *Generate fingerprint files from PubChem SD tags*.

The previous example loaded the fingerprints into a *FingerprintArena*. That's the fastest way to do multiple searches. Sometimes you only want to do one or a couple of queries. It seems rather excessive to read the entire targets file into an in-memory data structure before doing the search when you could search while processing the file.

For that case, use an FPSReader as the targets file. Here I'll get the first two records from the queries file and use it to search the targets file:

```
>>> from __future__ import print_function # Only for Python 2
>>> import chemfp
>>> query_arena = next(chemfp.open("pubchem_queries.fps").iter_arenas(2))
>>> query_arena
<chemfp.arena.FingerprintArena object at 0x11039c850>
>>> len(query_arena)
2
```

That first line is complicated. It opens the file and iterates over its fingerprint records two at a time as arenas. The next() returns the first of these arenas, so that line is a way of saying "get the first two records as an arena".

Here are the k=5 closest hits against the targets file:

```
>>> targets = chemfp.open("pubchem_targets.fps")
>>> for query_id, hits in chemfp.knearest_tanimoto_search(query_arena, targets, k=5,_
⇔threshold=0.0):
      print("** Hits for", query_id, "**")
      for hit in hits.get_ids_and_scores():
       print("", hit)
** Hits for 99000039 **
 ('48503376', 0.8784530386740331)
 ('48503380', 0.8729281767955801)
 ('48732162', 0.8595505617977528)
 ('48520532', 0.8540540540540541)
 ('48985130', 0.8449197860962567)
** Hits for 99000230 **
 ('48563034', 0.8588235294117647)
 ('48731730', 0.8522727272727273)
 ('48583483', 0.8411764705882353)
 ('48563042', 0.8352941176470589)
 ('48935653', 0.83333333333333333)
```

To make it easier to see, here's the code in a single chunk:

Remember that the FPSReader reads an FPS file. Once you've done a search, the file is read, and you can't do another search. (Well, you *can*; but it will return empty results.) You'll need to reopen the file to reuse the file, or reseek the file handle to the start position and pass the handle to a new FPSReader.

Each search processes arena\_size query fingerprints at a time. You will need to increase that value if you want to search more than that number of fingerprints with this method.

#### 4.11 How do to a Tversky search using the Dice weights

In this section you'll learn how to search a set of fingerprints using the more general Tversky parameters, without loading it into a FingerprintArena. You'll need the previously created PubChem fingerprint files for the queries and the targets from *Generate fingerprint files from PubChem SD tags*.

Chemfp-2.1 added support for Tversky searches. The Tversky index supports weights for the superstructure and substructure terms to the similarity. Some people like the Dice index, which is the Tversky index with alpha = beta = 0.5, so here are a couple of ways to search the targets based on the Dice index.

The previous two sections did a Tanimoto search by using <code>chemfp.knearest\_tanimoto\_search()</code>. The Tversky search uses <code>chemfp.knearest\_tversky\_search()</code>, which shouldn't be much of a surprise. Just like the Tanimoto search code, it can take a fingerprint arena or an FPS reader as the targets.

The first example loads all of the targets into an arena, then searches using each of the queries:

The first two output records are:

```
**Hits for 99000039 **
('48503376', 0.9352941176470588)
('48503380', 0.9321533923303835)
('48732162', 0.9244712990936556)
('48520532', 0.9212827988338192)
('48985130', 0.9159420289855073)
**Hits for 99000230 **
('48563034', 0.9240506329113924)
```

```
('48731730', 0.9202453987730062)
('48583483', 0.9137380191693291)
('48563042', 0.9102564102564102)
('48935653', 0.90909090909091)
```

On the other hand, the following reads the first two queries into an arena, then searches the targets as an FPS file, without loading all of the targets into memory at once:

Not surprisingly, this gives the same output as before:

```
** Hits for 99000039 **

('48503376', 0.9352941176470588)

('48732162', 0.9244712990936556)

('48520532', 0.9212827988338192)

('48985130', 0.9159420289855073)

** Hits for 99000230 **

('48563034', 0.9240506329113924)

('48731730', 0.9202453987730062)

('48583483', 0.9137380191693291)

('48563042', 0.9102564102564102)

('48935653', 0.90909090909091)
```

## 4.12 FingerprintArena searches returning indices instead of ids

In this section you'll learn how to search a *FingerprintArena* and use hits based on integer indices rather than string ids.

The previous sections used a high-level interface to the Tanimoto and Tversky search code. Those are designed for the common case where you just want the query id and the hits, where each hit includes the target id.

Working with strings is actually rather inefficient in both speed and memory. It's usually better to work with indices if you can, and in the next section I'll show how to make a distance matrix using this interface.

The index-based search functions are in the *chemfp.search* module. They can be categorized into three groups, with Tanimoto and Tversky versions for each group:

- 1. Count the number of hits:
- $chemfp.search.count\_tanimoto\_hits\_fp()$  search an arena using a single fingerprint (Tanimoto)
- chemfp.search.count\_tanimoto\_hits\_arena() search an arena using another arena (Tanimoto)

- $chemfp.search.count\_tanimoto\_hits\_symmetric()$  search an arena using itself (Tanimoto)
- $chemfp.search.count\_tversky\_hits\_fp()$  search an arena using a single fingerprint (Tversky)
- chemfp.search.count\_tversky\_hits\_arena() search an arena using another arena (Tversky)
- chemfp.search.count tversky hits symmetric() search an arena using itself (Tversky)
- 2. Find all hits at or above a given threshold, sorted arbitrarily:
- chemfp.search.threshold\_tanimoto\_search\_fp() search an arena using a single finger-print (Tanimoto)
- chemfp.search.threshold\_tanimoto\_search\_arena() search an arena using another arena (Tanimoto)
- chemfp.search.threshold\_tanimoto\_search\_symmetric() search an arena using itself (Tanimoto)
- $chemfp.search.threshold\_tversky\_search\_fp()$  search an arena using a single finger-print (Tversky)
- chemfp.search.threshold\_tversky\_search\_arena() search an arena using another arena (Tversky)
- chemfp.search.threshold\_tversky\_search\_symmetric() search an arena using itself (Tversky)
- 3. Find the k-nearest hits at or above a given threshold, sorted by decreasing similarity:
- $chemfp.search.knearest\_tanimoto\_search\_fp()$  search an arena using a single finger-print (Tanimoto)
- chemfp.search.knearest\_tanimoto\_search\_arena() search an arena using another arena (Tanimoto)
- chemfp.search.knearest\_tanimoto\_search\_symmetric() search an arena using itself (Tanimoto)
- $chemfp.search.knearest\_tversky\_search\_fp()$  search an arena using a single finger-print (Tversky)
- $chemfp.search.knearest\_tversky\_search\_arena()$  search an arena using another arena (Tversky)
- chemfp.search.knearest\_tversky\_search\_symmetric() search an arena using itself (Tversky)

The functions ending "\_fp" take a query fingerprint and a target arena. The functions ending "\_arena" take a query arena and a target arena. The functions ending "\_symmetric" use the same arena as both the query and target.

In the following example, I'll use the first 5 fingerprints of a data set to search the entire data set. To do this, I load the data set as an arena, extract the first 5 records as a sub-arena, and do the search.

```
>>> from __future__ import print_function # Only for Python 2
>>> import chemfp
>>> from chemfp import search
>>> queries = next(chemfp.open("pubchem_queries.fps").iter_arenas(5))
```

```
>>> targets = chemfp.load_fingerprints("pubchem_targets.fps")
>>> results = search.threshold_tanimoto_search_arena(queries, targets, threshold=0.7)
```

The search. threshold\_tanimoto\_search\_arena() call finds the target fingerprints which have a similarity score of at least 0.7 compared to the query.

You can iterate over the results (which is a *SearchResults*) to get the list of hits for each of the queries. The order of the results is the same as the order of the records in the query:

```
>>> for hits in results:
... print(len(hits), hits.get_ids_and_scores()[:3])
...
641 [('48528698', 0.7085714285714285), ('48529189', 0.7371428571428571), ('48937990', 0.
$\times 7039106145251397)]
373 [('48737535', 0.703030303030303), ('48502523', 0.7041420118343196), ('48560268', 0.
$\times 7)]
270 [('48857943', 0.7006369426751592), ('48846196', 0.7088607594936709), ('48855282', 0.
$\times 710691823899371)]
523 [('48542237', 0.7230769230769231), ('48739065', 0.7085427135678392), ('48529584', 0.
$\times 705)]
523 [('48542237', 0.7230769230769231), ('48739065', 0.7085427135678392), ('48529584', 0.
$\times 705)]
```

The results object don't store the query id. Instead, you have to know that the results are in the same order as the input as the query arena, so you can match the query arena's id attribute, which contains the list of fingerprint identifiers, to each result:

```
>>> for query_id, hits in zip(queries.ids, results):
     print("Hits for", query_id)
      for hit in hits.get_ids_and_scores()[:3]:
       print("", hit)
. . .
Hits for 99000039
('48528698', 0.7085714285714285)
('48529189', 0.7371428571428571)
 ('48937990', 0.7039106145251397)
Hits for 99000230
('48737535', 0.703030303030303)
 ('48502523', 0.7041420118343196)
('48560268', 0.7)
Hits for 99002251
 ('48857943', 0.7006369426751592)
 ('48846196', 0.7088607594936709)
 ('48855282', 0.710691823899371)
Hits for 99003537
 ('48542237', 0.7230769230769231)
 ('48739065', 0.7085427135678392)
 ('48529584', 0.705)
Hits for 99003538
 ('48542237', 0.7230769230769231)
 ('48739065', 0.7085427135678392)
 ('48529584', 0.705)
```

What I really want to show is that you can get the same data only using the offset index for the target record

instead of its id. The result from a Tanimoto search with a query arena is a SearchResults. Iterating over the results gives a SearchResult object, with methods like SearchResult.get\_indices\_and\_scores(), SearchResult.get\_ids(), and SearchResult.get\_scores():

```
>>> for hits in results:
      print(len(hits), hits.get_indices_and_scores()[:3])
641 [(3619, 0.7085714285714285), (4302, 0.7371428571428571), (4576, 0.7039106145251397)]
373 [(2747, 0.703030303030303), (3608, 0.7041420118343196), (3777, 0.7)]
270 [(2512, 0.7006369426751592), (2873, 0.7088607594936709), (3185, 0.710691823899371)]
523 [(6697, 0.7230769230769231), (7478, 0.7085427135678392), (7554, 0.705)]
523 [(6697, 0.7230769230769231), (7478, 0.7085427135678392), (7554, 0.705)]
>>>
>>> targets.ids[0]
'48942244'
>>> targets.ids[1]
'48941399'
>>> targets.ids[3619]
'48528698'
>>> targets.ids[4302]
'48529189'
```

I did a few id lookups given the target dataset to show you that the index corresponds to the identifiers from the previous code.

These examples iterated over each individual <code>SearchResult</code> to fetch the ids and scores, or indices and scores. Another possibility is to ask the <code>SearchResults</code> collection to iterate directly over the list of fields you want. <code>SearchResults.iter\_indices\_and\_scores()</code>, for example, iterates through the <code>get\_indices\_and\_score</code> of each <code>SearchResults.iter\_indices\_and\_score</code> of each <code>SearchResults.iter\_indices\_and\_score\_</code>

```
>>> for row in results.iter_indices_and_scores():
... print(len(row), row[:3])
...
641 [(3619, 0.7085714285714285), (4302, 0.7371428571428571), (4576, 0.7039106145251397)]
373 [(2747, 0.7030303030303), (3608, 0.7041420118343196), (3777, 0.7)]
270 [(2512, 0.7006369426751592), (2873, 0.7088607594936709), (3185, 0.710691823899371)]
523 [(6697, 0.7230769230769231), (7478, 0.7085427135678392), (7554, 0.705)]
523 [(6697, 0.7230769230769231), (7478, 0.7085427135678392), (7554, 0.705)]
```

This was added to get a bit more performance out of chemfp and because the API is sometimes cleaner one way and sometimes cleaner the other. Yes, I know that the Zen of Python recommends that "there should be one—and preferably only one—obvious way to do it." Oh well.

## 4.13 Access the SearchResult scores and indices as a NumPy array

In this section you'll learn how to access the scores and indices for the search result hits as a NumPy array. This returns a structured array view of the underlying search result hits. You will need to install NumPy for the following to work. See the next section if you want to use ctypes or Python's buffer API.

The following reads the targets file created in *Generate fingerprint files from PubChem SD tags*, randomly selects a query fingerprint (using the seed 123), then finds the Tanimoto score between that query and all of the fingerprints in the targets file:

```
>>> from __future__ import print_function # Only for Python 2
>>> import chemfp
>>> targets = chemfp.load_fingerprints ("pubchem_targets.fps")
>>> query_fp = targets.fingerprints.random_choice(rng=123)
>>> result = targets.threshold_tanimoto_search_fp(query_fp, threshold=0.0)
```

The SearchResult.get\_scores() method returns the result's scores as a Python array object, which gives a compact way to store a list of doubles using a stock Python installation:

```
>>> result.get_scores()[:5]
array('d', [0.2277227722773, 0.3, 0.31, 0.24761904761904763, 0.45054945054945056])
```

However, this array is a copy of the underlying scores. Making the copy doubles the amont of memory used, and reduces the performance somewhat as it must create the new array and copy the values over to it.

Most people who use chemfp also use NumPy, which has its own array type, along with a large number of functions which work on NumPy arrays. The <code>SearchResult.as\_numpy\_array()</code> method returns a NumPy array <code>view</code> of the underlying search result hits. The term "view" means that the NumPy array doesn't have its own storage space but uses the same storage space as the search result object.

Warning: Do not use the NumPy view of a search result after the search result has been cleared or freed up as that will likely cause your program to segfault. IN ADDITION, do not modify the contents of the array as it may cause chemfp's optimized sort algorithms to fail.

The view is implemented as a structured array with access to the *index* and *score* arrays:

I'll reorder by decreasing score and show that the NumPy array values also change:

```
>>> result.reorder("decreasing-score")
>>> arr["score"][:5]
array([1. , 1. , 0.97849462, 0.96808511, 0.96808511])
```

This can be further similified using the short-cut method SearchResult. qet\_scores\_as\_numpy\_array():

These scores can be passed directly to something like matplotlib for plotting, which in this case shows the distribution of similarity scores for the given query:

```
>>> from matplotlib import pyplot
>>> pyplot.plot(result.get_scores_as_numpy_array())
[<matplotlib.lines.Line2D object at 0x122c0b190>]
>>> pyplot.show()
```

# 4.14 Access the SearchResult scores and indices as buffer or ctypes structure

In this section you'll learn how to access the scores and indices for the search result hits as a ctypes structure. This returns an array-like view of the underlying search result hits using built-in Python methods, which may be useful if NumPy isn't available or if NumPy's startup overhead is too high. See the previous section if you want to use NumPy.

The following reads the targets file created in *Generate fingerprint files from PubChem SD tags*, randomly selects a query fingerprint (using the seed 123), then finds the Tanimoto score between that query and all of the fingerprints in the targets file:

```
>>> from __future__ import print_function # Only for Python 2
>>> import chemfp
>>> targets = chemfp.load_fingerprints ("pubchem_targets.fps")
>>> query_fp = targets.fingerprints.random_choice(rng=123)
>>> result = targets.threshold_tanimoto_search_fp(query_fp, threshold=0.0)
```

The previous section showed how to access the scores and identifiers as NumPy arrays. Chemfp does not depend on NumPy, but several part of the chemfp API are sped up by having a way to get a low-overhead view of the underlying hits from Python. The <code>SearchResult.as\_ctypes()</code> method returns a ctypes view of that data:

```
>>> hits = result.as_ctypes()
>>> hits
<chemfp.search.Hit_Array_14967 object at 0x10cf9fac0>
>>> len(hits)
14967
>>> hits[0]
Hit(index=856, score=1.000000)
>>> hits[len(hits)//4]
Hit(index=6071, score=0.557047)
>>> hits[len(hits)//4].score
0.5570469798657718
>>> result.reorder("increasing-score")
>>> hits[0]
Hit(index=217, score=0.129771)
```

The raw bytes of the search result hits are available via Python's buffer protocol via the <code>SearchResult</code>. <code>as\_buffer()</code> method. The following show that each hit takes up 12 bytes of space.:

```
>>> buf = result.as_buffer()
>>> buf
<memory at 0x123597f40>
>>> len(buf)
179604
```

```
>>> len(buf) / len(result)
12.0
```

Warning: Do not use the ctypes or buffer views of a search result after the search result has been cleared or freed up as that will likely cause your program to segfault. IN ADDITION, do not modify the contents of those views as it may cause chemfp's optimized sort algorithms to fail.

I'll be surprised if anyone uses this function directly. If you do, let me know why!

## 4.15 Access the fingerprint arena bytes as a NumPy array

In this section you'll learn how to access the arena's fingerprint data as a NumPy array. This returns a byte view of the underlying arena data structure. If you want the fingerprint bits as 0 or 1 values, see the next section. You will need to install NumPy for the following to work.

A *FingerprintArena* stores the fingerprints in a contiguous block of memory. Each fingerprint is stored as the first arena.num\_bytes bytes of a field containing arena.storage\_size bytes of memory. If num\_bytes is smaller than storage\_size then the field is 0-padded, that is, the remaining bytes are set to 0.

If you work with Python code then you can use chemfp's Python API to access the fingerprints. But what if you want to access the fingerprints from a C extension? More specifically, what if you want to access the fingerprints from NumPy, which contains a lot of optimized routines for analyzing matrix-like data?

The FingerprintArena.to\_numpy\_array() method returns a read-only view of the fingerprint data as a 2D NumPy array with len(arena) rows and arena.storage\_size columns. Each element of the matrix is an unsigned 8 bit integer, that is, a byte.

The matrix is a "view" of the data, meaning that it uses the same contiguous block of memory that the arena uses.

Warning: Do not use the NumPy view of an arena from an FPB file after the file has been closed as that will likely cause your program to segfault.

Here is an example using MACCS fingerprints for ChEBI 187 generated by RDKit:

```
>>> import chemfp
>>> arena = chemfp.load_fingerprints("chebi_maccs.fps")
>>> arr = arena.to_numpy_array()
>>> arr
                     0, ...,
                                          0],
array([[ 0,
               0,
                               0,
                                     0,
               Ο,
                     0, ...,
                                     0,
                                          0],
       [ 0,
                               0,
       [ 0,
               0,
                     0, ...,
                                          0],
                                     0,
       [ 0,
              16, 128, ...,
                               0,
                                     0,
                                          0],
                               Ο,
       [ 0,
              16, 128, ...,
                                    0,
                                          07.
       [ 0,
               0, 128, ...,
                                          0]], dtype=uint8)
                                    0,
>>> arr.shape
(107207, 24)
```

While it isn't chemically meaningful, I'll sum the bytes down the rows:

The last three values are 0 because of the 0-padding. By default chemfp uses 64-bit alignment, which means 192 bits or 24 bytes for the 166-bit MACCS key fingerprints, even though only 21 bytes are needed.

If the 0 padding is a problem then you can use NumPy indexing to make a new NumPy array which only contains the actual fingerprint bytes:

```
>>> unpadded_arr = arr[:,:arena.num_bytes]
>>> unpadded_arr
                             0,
array([[ 0,
                   0, ...,
                                  0,
                                       0],
       [ 0,
              0,
                   0, ...,
                                   0,
                                       0],
                             0,
                                       07.
       [ 0,
              0,
                   0, ...,
                             0,
                                  0.
       [ 0, 16, 128, ..., 255, 255,
                                      31],
       [ 0, 16, 128, ..., 255, 255,
              0, 128, ..., 255, 255, 31]], dtype=uint8)
       [ 0,
>>> unpadded arr.shape
(107207, 21)
>>> unpadded_arr.sum(axis=0)
array([ 490116,
                  204316,
                            601303, 1485108,
                                                968167, 2407708,
        2464853, 2392025, 6600791, 5761640, 5880625, 10715664,
       8568501, 12248444, 11166730, 13371871, 12146087, 13559574,
       17746237, 20894627, 2761788], dtype=uint64)
```

## 4.16 Access the fingerprint bits as a NumPy array

In this section you'll learn how to access the arena's fingerprint bit values as a NumPy array. This returns a new array containing the values 0 or 1. If you want a view of the underlying arena bytes, see the previous section. You will need to install NumPy for the following to work.

Some people use fingerprint bit values as descriptors for clustering or other machine learning algorithm. The <code>FingerprintArena.to\_numpy\_array()</code> method returns a 2D array containing bit values. The array contains <code>len(arena)</code> rows. By default it returns one column for each fingerprint bit.

Here is an example using MACCS fingerprints for ChEBI 187 generated by RDKit:

```
>>> import chemfp
>>> arena = chemfp.load_fingerprints("chebi_maccs.fps")
>>> bitarr = arena.to_numpy_bitarray()
>>> bitarr.shape
(107207, 166)
```

This is a normal NumPy array, so the usual NumPy methods work. For example, here are the bits for the fingerprint at index 1000:

and here are the number of occurrences of each bit:

```
>>> bitarr.sum(axis=0)
array([
                                     31,
            0,
                     2.
                           514,
                                              22,
                                                      53.
                                                              264.
                                                                      3663.
          452,
                   254,
                          4309,
                                    215,
                                             405,
                                                     326,
                                                              147,
                                                                      1235,
         2239,
                   256,
                          3632,
                                    177,
                                             407,
                                                    4063,
                                                             1112,
                                                                      2929,
         2780,
                  3946,
                           423,
                                   2597,
                                          11284,
                                                              481,
                                                                      8993,
                                                    2798,
         9241,
                  3179,
                           720,
                                   6701,
                                            9993,
                                                    8846,
                                                             2306,
                                                                      2387,
                  9607,
                                            2605,
                                                    1655,
                                                             6263,
         2426,
                         10337,
                                  11172,
                                                                    13749,
                                   7077,
                                          29244,
                                                            11422,
        18487,
                 12349,
                         10391,
                                                   28915,
                                                                      1557,
        50525,
                 11758,
                         10016,
                                  11804,
                                          11876,
                                                   20436,
                                                             1786,
                                                                      9572,
        29439,
                16754,
                         12719,
                                    843,
                                          15222,
                                                    4294,
                                                             4281,
                                                                    45510,
                20715,
                                                            26283,
        13238,
                         36963,
                                  14132,
                                          24909,
                                                    5101,
                                                                    25017,
                47630,
                         33626,
                                  13009,
                                          41392,
        18533,
                                                   33512,
                                                            13809,
                                                                    22733,
        56840,
                50194,
                         58465,
                                  50896,
                                          36946,
                                                   20788,
                                                            57521,
                                                                    38904,
        51137,
                48868,
                         26627,
                                  46736,
                                          49780,
                                                   28319,
                                                             7660,
                                                                    44893,
        51824,
                41062,
                         16770,
                                  41733,
                                          59879,
                                                   54221,
                                                            56176,
                                                                    42384,
                19636,
                                                             6965,
        39082,
                         44832,
                                  45619,
                                          56784,
                                                   54437,
                                                                    58186,
        50183,
                46442,
                         45119,
                                  36041,
                                               0,
                                                   48938,
                                                            64600,
                                                                    55153,
        58571,
                28754,
                         62726,
                                 71980,
                                          41656,
                                                   18204,
                                                            31671,
                                                                    61932,
                         69568,
                                  68414,
                                                            64600,
        72978, 56210,
                                          40483,
                                                   60826,
                                                                    45469,
        62761,
                81488,
                         55865,
                                  56584,
                                          57693,
                                                   69504,
                                                            57550,
                                                                    78234,
                83824,
                                                   73571,
                                                            93265,
        75151,
                         79623, 71747,
                                          89966,
                                                                    78099,
                 66637,
                         83354, 100861,
                                                       0], dtype=uint64)
        77122,
                                          88193,
```

While the default returns the bits for each fingerprint, you can use the transpose to get which fingerprints indices contain a given bit.

For example, there are only 5 fingerprints which set the fifth bit. Key 5 is defined as "Lanthanide" and implemented as the SMARTS pattern: [La,Ce,Pr,Nd,Pm,Sm,Eu,Gd,Tb,Dy,Ho,Er,Tm,Yb,Lu]. Which fingerprints contain a lanthanide?

To make that useful I need the compound ids, so I'll use the indices to get the ids from the arena:

```
>>> [arena.ids[idx] for idx in bitarr.T[4].nonzero()[0]]
['CHEBI:33330', 'CHEBI:33331', 'CHEBI:33341', 'CHEBI:33342',
'CHEBI:33343', 'CHEBI:52622', 'CHEBI:52635', 'CHEBI:49962',
'CHEBI:49978', 'CHEBI:63020', 'CHEBI:134455', 'CHEBI:139502',
'CHEBI:32234', 'CHEBI:77566', 'CHEBI:134436', 'CHEBI:134440',
'CHEBI:53479', 'CHEBI:139496', 'CHEBI:50950', 'CHEBI:51000',
```

```
'CHEBI:59824', 'CHEBI:139501']
```

Picking out a few of these:

- CHEBI:33330 scandium atom
- CHEBI:33331 yttrium atom
- CHEBI:139502 calcium titanate
- CHEBI: 139501 titanium(IV) bis(ammonium lactato)dihydroxide

so at least I wasn't able to find a false positive!

The above example created the entire bit array but only used the third column. If you only want the third column then it's faster to pass an explicit list of the bit columns you want to to\_numpy\_bitarray:

You can ask for more than one bit column. The following computes the Pearson product-moment correlation coefficients between columns 163 and 158 (column 163 has the most often set bit, and 158 has the second most often):

```
>>> bitarr = arena.to_numpy_bitarray([163, 158])
>>> bitarr
array([[0, 0],
       [0, 0],
       [0, 0],
       . . . ,
       [1, 1],
       [1, 1],
       [1, 1]], dtype=uint8)
>>> import numpy
>>> numpy.corrcoef(bitarr, rowvar=0)
array([[ 1.
                       0.64876171],
       [ 0.64876171,
                                  ]])
                       1.
```

When this section was originally written, extracting 1 column with to\_numpy\_bitarray was about 20x faster than extracting all of the columns and selecting just the desired column. The break-even point for 166 bits was around 45 columns.

## 4.17 Computing a distance matrix for clustering

In this section you'll learn how to compute a distance matrix using the chemfp API. The next section shows an alternative way to get the similarity matrix.

chemfp does not do clustering. There's a huge number of tools which already do that. A goal of chemfp in the future is to provide some core components which clustering algorithms can use.

That's in the future, because I know little about how people want to cluster with chemfp. Right now you can use the following to build a distance matrix and pass that to one of those tools. (I'll use a distance matrix of 1 - the similarity matrix.)

Since we're using the same fingerprint arena for both queries and targets, we know the distance matrix will be symmetric along the diagonal, and the diagonal terms will be 1.0. The *chemfp.search.threshold\_tanimoto\_search\_symmetric()* functions can take advantage of the symmetry for a factor of two performance gain. There's also a way to limit it to just the upper triangle, which cuts the memory use in half.

Most of those tools use NumPy, which is a popular third-party package for numerical computing. You will need to have it installed for the following to work.

```
import numpy # NumPy must be installed
from chemfp import search
# Compute distance[i][j] = 1-Tanimoto(fp[i], fp[j])
def distance matrix(arena):
   n = len(arena)
    # Start off a similarity matrix with 1.0s along the diagonal
   similarities = numpy.identity(n, "d")
    ## Compute the full similarity matrix.
    # The implementation computes the upper-triangle then copies
    # the upper-triangle into lower-triangle. It does not include
    # terms for the diagonal.
   results = search.threshold_tanimoto_search_symmetric(arena, threshold=0.0)
    # Copy the results into the NumPy array.
    # NOTE: see below for an implementation which is much faster.
   for row_index, row in enumerate(results.iter_indices_and_scores()):
       for target index, target score in row:
            similarities[row_index, target_index] = target_score
    # Return the distance matrix using the similarity matrix
    return 1.0 - similarities
```

With the distance matrix in hand, it's easy to cluster. The SciPy package contains many clustering algorithms, as well as an adapter to generate a matplotlib graph. I'll use it to compute a single linkage clustering using 100 randomly selected fingerprints:

```
from __future__ import print_function # Only for Python 2
import chemfp
from scipy.cluster.hierarchy import linkage, dendrogram

# ... insert the 'distance_matrix' function definition here ...

dataset = chemfp.load_fingerprints("pubchem_queries.fps")
dataset = dataset.sample(100) # select 100
distances = distance_matrix(dataset)
```

NOTE: The above code created an empty NumPy array then filled it in with the scores. This is slow because much of the work is in Python.

Another possibility is to convert the results into a SciPy compressed sparse row matrix (see the next section), then turn that sparse array into a NumPy array. The following *distance\_matrix* version is about 5x faster than the earlier one, even though it makes an intermediate csr matrix, because more of the work is done at the C level:

```
def distance_matrix(arena):
    n = len(arena)

## Compute the full similarity matrix.
# The implementation computes the upper-triangle then copies
# the upper-triangle into lower-triangle. It does not include
# terms for the diagonal.
results = search.threshold_tanimoto_search_symmetric(arena, threshold=0.0)

# Extract the results as a SciPy compressed sparse row matrix
csr = results.to_csr()
# Convert it to a NumPy array
similarities = csr.toarray()
# Fill in the diagonal
numpy.fill_diagonal(similarities, 1)

# Return the distance matrix using the similarity matrix
return 1.0 - similarities
```

## 4.18 Convert SearchResults to a SciPy csr matrix

In this section you'll learn how to convert a SearchResults object into a SciPy compressed sparse row matrix.

In the previous section you learned how to use the chemfp API to create a NumPy similarity matrix, and convert that into a distance matrix. The result is a dense matrix, and the amount of memory goes as the square of the number of structures.

If you have a reasonably high similarity threshold, like 0.7, then most of the similarity scores will be zero. Internally the <code>SearchResults</code> object only stores the non-zero values for each row, along with an index to specify the column. This is a common way to compress sparse data.

SciPy has its own compressed sparse row ("csr") matrix data type, which can be used as input to many of the scikit-learn clustering algorithms.

If you want to use those algorithms, call the <code>SearchResults.to\_csr()</code> method to convert the SearchResults scores (and only the scores) into a csr matrix. The rows will be in the same order as the SearchResult (and

the original queries), and the columns will be in the same order as the target arena, including its ids.

I don't know enough about scikit-learn to give a useful example. (If you do, let me know!) Instead, I'll start by doing an NxM search of two sets of fingerprints:

```
from __future__ import print_function # Only for Python 2
import chemfp
from chemfp import search

queries = chemfp.load_fingerprints("pubchem_queries.fps")
targets = chemfp.load_fingerprints("pubchem_targets.fps")
results = search.threshold_tanimoto_search_arena(queries, targets, threshold = 0.8)
```

The SearchResults attribute *shape* describes the number of rows and columns:

```
>>> results.shape
(10826, 14967)
>>> len(queries)
10826
>>> len(targets)
14967
>>> >>> results[426].get_indices_and_scores()
[(133, 0.85), (153, 0.8064516129032258)]
```

I'll turn it into a SciPy csr:

```
>>> csr = results.to_csr()
>>> csr
<10826x14967 sparse matrix of type '<class 'numpy.float64'>'
    with 369471 stored elements in Compressed Sparse Row format>
>>> csr.shape
(10826, 14967)
```

and look at the same row to show it has the same indices and scores:

## 4.19 Taylor-Butina clustering

For the last clustering example, here's my (non-validated) variation of the Butina algorithm from JCICS 1999, 39, 747-750. See also http://www.redbrick.dcu.ie/~noel/R\_clustering.html . You might know it as Leader clustering.

First, for each fingerprint find all other fingerprints with a threshold of 0.8:

```
from __future__ import print_function # Only for Python 2
import chemfp
```

```
from chemfp import search

arena = chemfp.load_fingerprints("pubchem_targets.fps")
results = search.threshold_tanimoto_search_symmetric(arena, threshold = 0.8)
```

Sort the results so that fingerprints with more hits come first. This is more likely to be a cluster centroid. Break ties arbitrarily by the fingerprint id; since fingerprints are ordered by the number of bits this likely makes larger structures appear first:

Apply the leader algorithm to determine the cluster centroids and the singletons:

```
# Determine the true/false singletons and the clusters
true singletons = []
false_singletons = []
clusters = []
seen = set()
for (size, fp_idx, members) in results:
   if fp_idx in seen:
        \# Can't use a centroid which is already assigned
        continue
   seen.add(fp_idx)
    # True singletons have no neighbors within the threshold
    if not members:
        true_singletons.append(fp_idx)
        continue
    # Figure out which ones haven't yet been assigned
   unassigned = set(members) - seen
    if not unassigned:
        false_singletons.append(fp_idx)
        continue
      # this is a new cluster
      clusters.append( (fp_idx, unassigned) )
      seen.update(unassigned)
```

Once done, report the results:

```
print(len(true_singletons), "true singletons")
print("=>", " ".join(sorted(arena.ids[idx] for idx in true_singletons)))
print()
```

```
print(len(false_singletons), "false singletons")
print("=>", " ".join(sorted(arena.ids[idx] for idx in false_singletons)))
print()

# Sort so the cluster with the most compounds comes first,
# then by alphabetically smallest id
def cluster_sort_key(cluster):
    centroid_idx, members = cluster
    return -len(members), arena.ids[centroid_idx]

clusters.sort(key=cluster_sort_key)

print(len(clusters), "clusters")
for centroid_idx, members in clusters:
    print(arena.ids[centroid_idx], "has", len(members), "other members")
    print("=>", " ".join(arena.ids[idx] for idx in members))
```

The algorithm is quick for this small data set.

Out of curiosity, I tried this on 100,000 compounds selected arbitrarily from PubChem. It took 35 seconds on my desktop (a 3.2 GHZ Intel Core i3) with a threshold of 0.8. In the Butina paper, it took 24 hours to do the same, although that was with a 1024 bit fingerprint instead of 881. It's hard to judge the absolute speed differences of a MIPS R4000 from 1998 to a desktop from 2011, but it's less than the factor of about 2000 you see here.

More relevent is the comparison between these numbers for the 1.1 release compared to the original numbers for the 1.0 release. On my old laptop, may it rest it peace, it took 7 minutes to compute the same benchmark. Where did the roughly 16-fold performance boost come from? Money. After 1.0 was released, Roche funded various optimizations, including taking advantage of the symmetery (2x) and using hardware POPCNT if available (4x). Roche and another company helped fund the OpenMP support, and when my desktop reran this benchmark it used 4 cores instead of 1.

The wary among you might notice that 2\*4\*4 = 32x faster, while I said the overall code was only 16x faster. Where's the factor of 2x slowdown? It's in the Python code! The *chemfp.search*. threshold\_tanimoto\_search\_symmetric() step took only 13 seconds. The remaining 22 seconds was in the leader code written in Python. To make the analysis more complicated, improvements to the chemfp API sped up the clustering step by about 40%.

With chemfp 1.0 version, the clustering performance overhead was minor compared to the full similarity search, so I didn't keep track of it. With chemfp 1.1, those roles have reversed!

The most recent version now is chemfp 3.4, which is about 20% faster than chemfp 1.4 for this benchmark. And of course the hardware is faster still.

## 4.20 MinMax Diversity Selection using RDKit

In this section you'll learn how to do diversity selection using RDKit's MaxMin picker. You will also learn how to convert chemfp fingerprints into RDKit fingerprints. You will need to install RDKit for the following to work. You will also need to download a dataset of benzodiazepine structures.

Diversity selection finds elements which are unlike each other. One way to implement diversity selection is to cluster all of the compounds then pick a compound from each cluster, but this requires quadratic time to compute the similarity/distance matrix.

Chemfp does not implement diversity selection, though it may be added in the future if there is enough demand. I recommend people use the optimized version of the MaxMin from RDKit, which does diversity selection without needing to compute the full matrix.

While it is possible to have RDKit's MaxMinPicker use native chemfp fingerprints, there is a huge performance overhead (about 100x!) because every fingerprint distance requires a Python function call. It is far faster to convert chemfp fingerprints to RDKit fingerprints so that all of the processing can be done in C.

I'll start with an example of selecting 100 diverse fingerprints from the benzodiazepine data set. The first step is to generate fingerprints. I'll use rdkit2fps to generate RDKit Morgan fingerprints.

```
% rdkit2fps --morgan benzodiazepine.sdf.gz -o benzodiazepine_morgan2.fps.gz
```

and then use the chemfp Python API to load the fingerprints. I'll use reorder=False so the arena fingerprints are in the same order as the input file. (The order isn't important for this case, but may be important if you, say, merge two data sets together where you know you want to keep the first data set and select diverse compounds from the second.)

```
>>> import chemfp
>>> arena = chemfp.load_fingerprints("benzodiazepine_morgan2.fps.gz",
... reorder=False)
```

The next step is to read the FPS file and convert the chemfp fingerprints into RDKit fingerprints. This is easy because RDKit function CreateFromBinaryText converts a chemfp fingerprint, which is just a byte string, into the equivalent ExplicitBitVect fingerprint.

```
>>> from rdkit import DataStructs
>>> rdkit_fps = [DataStructs.CreateFromBinaryText(fp) for fp in arena.fingerprints]
```

The fingerprints attribute was added in chemfp 3.4. For older chemfp versions use:

```
>>> rdkit_fps = [DataStructs.CreateFromBinaryText(fp) for id, fp in arena]
```

Finally, use RDKit to pick 100 diverse record indices:

```
>>> from rdkit import SimDivFilters
>>> picker = SimDivFilters.MaxMinPicker()
>>> picks = picker.LazyBitVectorPick(rdkit fps, len(rdkit fps), 100)
>>> len(picks)
100
>>> list(picks)
[10879, 8375, 2390, 4683, 3549, 6257, 9194, 9953, 96, 6860, 8016,
6034, 3197, 4213, 5762, 2323, 7531, 9894, 12279, 3398, 4607, 4827,
2874, 1608, 3234, 6128, 8710, 7691, 3006, 4898, 4372, 11609, 11401,
10614, 3861, 1295, 6936, 6192, 7121, 11577, 5092, 2523, 4926, 4614,
4956, 8762, 2261, 9184, 11666, 2828, 7767, 12027, 5000, 6126, 6266,
6097, 7966, 9208, 8064, 1327, 6241, 3392, 5730, 7744, 8485, 9299,
358, 5332, 4434, 2935, 8405, 5480, 4648, 1665, 5848, 9053, 5735,
6583, 8407, 1706, 5347, 11779, 12022, 2598, 8378, 3565, 7394, 4888,
10454, 6611, 11472, 2146, 6101, 295, 6632, 6717, 2442, 5638, 5372,
8279]
```

The indices match the arena order, so you can use arena.ids to get the corresponding id for each index; in this case, PubChem ids:

```
>>> arena.ids[10879]
'22984485'
```

The RDKit MaxMinPicker also lets you initialize the pick list with a set of indicies. This is useful if you have a in-house compound data set X and want to select N diverse fingerprints from a vendor data set Y. That algorithm might look like:

```
import chemfp
from rdkit import DataStructs, SimDivFilters
have_arena = chemfp.load_fingerprints("X.fps", reorder=False)
want_arena = chemfp.load_fingerprints("Y.fps", reorder=False)
# Merge the two fingerprint sets together, but keep track
# of which came from X.
fps = [DataStructs.CreateFromBinaryText(fp) for fp in have arena.fingerprints]
num have = len(fps)
fps.extend(DataStructs.CreateFromBinaryText(fp) for fp in want_arena.fingerprints)
# Do the picking
num to pick = 100
picker = SimDivFilters.MaxMinPicker()
have ids = list(range(num have))
picks = picker.LazyBitVectorPick(fps, len(fps), num_have+num_to_pick, have_ids)
newly_picked = picks[-num_to_pick:]
want_indices = [idx-num_have for idx in newly_picked]
# Report the picked compounds
print("Compound to evaluate:")
for idx in want_indices:
  print(want_arena.ids[idx])
```

To learn more about the RDKit MaxMin picker and how to use it, see Roger Sayle's slides from the 2017 RDKit User Group meeting and Tim Dudgeon's commentary.

## 4.21 Configuring OpenMP threads

In this section you'll learn about chemfp and OpenMP threads, including how to set the number of threads to use.

OpenMP is an API for shared memory multiprocessing programming. Chemfp uses it to parallelize the similarity search algorithms. Support for OpenMP is a compile-time option for chemfp, and can be disabled with --without-openmp in setup.py. Versions 4.2 of gcc (released in 2007) and later support it, as do other compilers, though chemfp has only been tested with gcc.

Chemfp uses one thread per query fingerprint. This means that single fingerprint queries are not parallelized. There is no performance gain even if four cores are available.

(A note about nomenclature: a CPU can have one core, or it can have several cores. A single processor computer has one CPU while a multiprocessor computer has several CPUs. I think some cores can even run multiple threads. So it's possible to have many more hardware threads than CPUs.)

Chemfp uses multiple threads when there are many queries, which occurs when using a query arena against a target arena. These search methods include the high-level API in the top-level chemfp module (like

'knearest tanimoto search'), and the arena search function in chemfp.search.

By default, OpenMP and therefore chemfp will use four threads:

```
>>> import chemfp
>>> chemfp.get_num_threads()
4
```

You can change this through the standard OpenMP environment variable OMP\_NUM\_THREADS in the shell:

```
% env OMP_NUM_THREADS=2 python
Python 3.7.4 (default, Aug 13 2019, 15:17:50)
[Clang 4.0.1 (tags/RELEASE_401/final)] :: Anaconda, Inc. on darwin
Type "help", "copyright", "credits" or "license" for more information.
>>> import chemfp
>>> chemfp.get_num_threads()
2
```

or you can specify the number of threads directly using set num threads():

```
>>> chemfp.set_num_threads(3)
>>> chemfp.get_num_threads()
3
```

If you specify 0 or 1 thread then chemfp will not use OpenMP at all and stick with a single-threaded implementation. (You probably want to disable OpenMP in multi-threaded programs like web servers. See the next section for details.)

Throwing more threads at a task doesn't always make it faster. My old desktop has one CPU with two cores, so it's pointless to have more than two OpenMP threads running, as you can see from some timings:

On the other hand, my old laptop has 1 CPU with four cores, and while my desktop beats my laptop with single threaded performance, once I have three cores going, my laptop is faster:

How many cores/hardware threads are available? That's a really good question. chemfp implements chemp. get\_max\_threads(), but that doesn't seem to do what I want. So don't use it, and I'll figure out a real solution in a future release.

#### 4.22 OpenMP and multi-threaded applications

In this section you'll learn some of the problems of mixing OpenMP and multi-threaded code.

Do not use OpenMP and POSIX threads on a Mac. It will crash. This includes Django, which is a multi-threaded web server. In multi-threaded code on a Mac you must either tell chemfp to be single-threaded, using:

```
chemfp.set_num_threads(1)
```

or figure out some way to put the chemfp search code into its own process space, which is a much harder solution.

Other OSes will let you mix POSIX and OpenMP threads, but life gets confusing. Might your web server handle three search requests at the same time? If so, should all of those get four OpenMP threads, so that 12 threads are running in total? Can your hardware handle that many threads?

It may be better to have chemfp not use OpenMP threads when under a multi-threaded system, or have some way to limit the number of chemfp search tasks running at the same time. Figuring out the right solution will depend on your hardware and requirements.

## 4.23 Fingerprint Substructure Screening (experimental)

In this section you'll learn how to find target fingerprints which contain the query fingerprint bit patterns as a subset. Bear in mind that this is an experimental API.

Substructure search often uses a screening step to remove obvious mismatches before doing the subgraph isomorphism. One way is to generate a binary fingerprint such that if a query molecule is a substructure of a target molecule then the corresponding query fingerprint is completely contained in the target fingerprint, that is, the target fingerprint must have 'on' bits for all of the query fingerprints which have 'on' bits.

I'll start by loading a fingerprint arena with four fingerprints, where the identifiers are Unicode strings and the fingerprint are byte strings of length 1, with the binary form shown to the right:

```
>>> from __future__ import print_function # Only for Python 2
>>> import chemfp
>>> from chemfp import bitops
   arena = chemfp.load fingerprints([
       (u"A1", b"\x44"), # 0b01000100
       (u"B2", b"\x6c"),
                           # 0b01101100
       (u"C3", b"\x95"),
                           # 0b10010101
       (u"D4", b"\xea"),
                           # 0b11101010
      ], chemfp.Metadata(num_bits=8))
>>> for id, fp in arena:
      print(bitops.hex_encode(fp), id)
44 A1
6c B2
95 C3
ea D4
```

I could use  $bitops.byte\_contains()$  to search for fingerprints in a loop, in this case with a query fingerprint which requires that the 7th bit be set (they must fit the pattern 0b\*1\*\*\*\*\*):

```
>>> query_fingerprint = b"\x40" # 0b01000000
>>> bitops.hex_encode(query_fingerprint)
'40'
>>> for id, target_fingerprint in arena:
... if bitops.byte_contains(query_fingerprint, target_fingerprint):
... print(id)
...
A1
B2
D4
```

This is slow because it uses Python to do almost all of the work. Instead, use *contains\_fp()* from the *chemfp.search* module, which is faster because it's all implemented in C:

```
>>> from chemfp import search
>>> result = search.contains_fp(query_fingerprint, arena)
>>> result
<chemfp.search.SearchResult object at 0x10195e090>
>>> print(result.get_ids())
['A1', 'B2', 'D4']
```

This is the same SearchResult instance that the similarity search code returns, though the scores are all 0.0:

```
>>> result.get_ids_and_scores()
[('A1', 0.0), ('B2', 0.0), ('D4', 0.0)]
```

This API is experimental and likely to change. Please provide feedback. While I don't think the current call parameters will change, I might have it return the Tanimoto score (or Hamming distance?) instead of 0.0. Or I might have a way to compute new scores given a SearchResult.

I also plan to support start/end parameters, to search only a subset of the arena.

There's also a search.contains\_arena() function which takes a query arena instead of only a query fingerprint as the query, and returns a SearchResults:

```
>>> results = search.contains_arena(arena, arena)
>>> results
<chemfp.search.SearchResults object at 0x10195c2b8>
>>> for result in results:
... print(result.get_ids_and_scores())
...
[('A1', 0.0), ('B2', 0.0)]
[('B2', 0.0)]
[('C3', 0.0)]
[('D4', 0.0)]
```

I don't think the NxN version of the "contains" search is all that useful, so there's no function for that case.

The implementation doesn't yet support OpenMP, contains\_arena() is only slightly faster than multiple calls to contains\_fp().

#### 4.24 Substructure screening with RDKit

In this section you'll learn how to use RDKit's pattern fingerprint for substructure screening.

RDKit has a fingerprint tuned for substructure search, though it's marked as 'experimental' and subject to change. This is the "pattern" fingerprint.

I'll use it to make a screen for one of the PubChem files. Normally you would start with something like:

```
% rdkit2fps --pattern Compound_048500001_049000000.sdf.gz -o pubchem_screen.fpb
```

but that only gives me the identifiers and fingerprints. I want to show some of the struture as well, so I'll do a bit of a cheat - I'll have an augmented identifier which is the PubChem id, followed by a space, followed by the SMILES string.

I can do this because chemfp supports almost anything as the "identifier", except newline, tab, and the NUL character, and because I don't need to support id lookup.

However, I have to write Python code to generate the augmented identifiers:

Now that I have the screen, I'll write some code to actually do the screen. I'll make this be an interactive prompt, which asks for the query SMILES string (or "quit" or "exit" to quit), parses the SMILES to a molecule, generates the fingerprint, does the screen, and displays the first 10 results:

```
from __future__ import print_function # Only for Python 2
import itertools
import chemfp
import chemfp.search

fptype = chemfp.get_fingerprint_type("RDKit-Pattern fpSize=1024")
T = fptype.toolkit

screen = chemfp.load_fingerprints("pubchem_screen.fpb")
print("Loaded", len(screen), "screen fingerprints")

while 1:
    # Ask for the query SMILES string
    query = input("Query? ") # use "raw_input()" for Python 2.7
    if query in ("quit", "exit"):
        break
```

```
# See if it's a valid SMILES
mol = T.parse_molecule(query, "smistring", errors="ignore")
if mol is None:
 print("Could not parse query")
 continue
# Compute the fingerprint and do the substructure screeening
fp = fptype.compute_fingerprint(mol)
result = chemfp.search.contains_fp(fp, screen)
# Print the results, up to 10.
n = len(result)
if n > 10:
 print(len(result), "matches. First 10 displayed")
else.
 print(len(result), "matches.")
for augmented_id in itertools.islice(result.iter_ids(), 0, n):
  id, smiles = augmented id.split()
 print(id, "=>", smiles)
print()
```

(In case you haven't seen it before, the "itertools.islice()" gives me an easy way to get up to the first N items from an iterator.)

I'll try out the above code:

```
Loaded 5208 screen fingerprints
Query? c1cccc1
12376 matches. First 10 displayed
48650571 => CCCOCC(=0)NCc1ccccc1
48672998 => CCCOCC(=0)NOCc1cccc1
48845178 => C=C(Br)CNC(=S)Nc1ccccc1
48548090 \Rightarrow CCNC(=0)N/N=C/c1ccc(C)cc1
48654127 => CCCOCC(=0)NCCSc1ccccc1
48548029 => CCNC(=0)N/N=C/c1cccc(C)c1
48685277 \Rightarrow COCC(C)CNC(=0)c1ccccc1
48915892 \Rightarrow CNC(=0)NCCc1ccccc1Br
48653583 \Rightarrow CCCOCC(=0)N(C)c1ccccc1
48650670 => CCCOCC(=0)Nc1cccc(C)c1
Query? c1cccc10
4946 matches. First 10 displayed
48548137 => CCNC(=0)N/N=C/c1cccc(0C)c1
48651969 => CCCOCC(=0)NCc1cccc(OC)c1
48980706 => CCCCNC(=0)CCCc1ccc(OC)cc1
48661290 => CCCOCC(=0)Nc1cccc(OCC)c1
48653813 => CCCOCC(=0)NCCOc1cccc(C)c1
48651499 => CCCOCC(=0)NCc1ccccc10C
48981063 \Rightarrow COclccc(CCCC(=0)NCC(C)C)cc1
48659995 => CCCOCC(=0)Nc1cccc(OCC#N)c1
```

```
48916672 \Rightarrow CCCCCCCccc(/C=N/NC(N)=0)c1
48653272 => CCCOCC(=0)NCCc1ccccc1OC
Query? c1ccccc1I
10 matches.
48731386 \Rightarrow Cc1cc(CNC(=0)c2ccc(I)cc2)on1
48671550 => NC(=0)Cc1ccc(OCC(=0)Nc2ccc(I)cc2)cc1
48731482 \Rightarrow Cc1cc(CNC(=0)c2cccc(I)c2)on1
48731331 \Rightarrow Cc1cc(CNC(=0)c2cccc2I)on1
48741344 \Rightarrow CN(C)C(=0)c1cccc(NC(=0)Nc2ccc(I)cc2)c1
48584231 => O=C(Nc1cccc(COCC2CC2)c1)c1ccccc1I
48688164 \Rightarrow CC1CN(C(=0)c2ccc(I)cc2)CC(C)(C)01
48688205 \Rightarrow CC1CN(C(=0)c2cccc(I)c2)CC(C)(C)01
48946427 \Rightarrow N\#CC1CCN(S(=0)(=0)c2ccc(I)cc2)CC1
48522115 => CC1(C)COCCN1C(=0)c1ccc(F)cc1I
Query? Fc1c(F)c(F)c(F)c(F)c1F
3 matches.
48759600 \Rightarrow 0=C(Nc1cccnc1)Nc1c(F)c(F)c(F)c(F)c1F
48980959 \Rightarrow Cc1cccc2cc(C(=0)Nc3ccc(F)cc3F)oc12
48981022 \Rightarrow Cc1cccc2cc(C(=0)Nc3c(F)cccc3F)oc12
Query? quit
```

Looks reasonable.

It's not hard to add full substructure matching, but it requires toolkit-specific code. Chemfp doesn't try to abstract that detail, and I'm not sure it should be part of chemfp. Instead, I'll write some RDKit-specific code. Chemfp uses native toolkit molecules, so there's actually only a single line of RDKit code.

I'll also completely rewrite the code so it takes the query string on the command-line, reports all of the screening results, identifies the true positives, and then does a brute-force verification that the screen results are correct. Oh, and report statistics:

```
# This program is called 'search.py'
from __future__ import print_function # Only for Python 2
import sys
import chemfp
import chemfp.search
from chemfp import rdkit_toolkit as T # Will only work with RDKit
import time

fptype = chemfp.get_fingerprint_type("RDKit-Pattern fpSize=1024")

screen = chemfp.load_fingerprints("pubchem_screen.fpb")
if len(sys.argv) != 2:
    raise SystemExit("Usage: %s <smiles>" % (sys.argv[0],))

query_smiles = sys.argv[1]

start_time = time.time()
try:
    query_mol = T.parse_molecule(query_smiles, "smistring")
```

```
except ValueError as err:
 raise SystemExit(str(err))
# Compute the fingerprint and do the substructure screeening
fp = fptype.compute_fingerprint(query_mol)
result = chemfp.search.contains_fp(fp, screen)
search_time = time.time()
num_matches = 0
for augmented_id in result.get_ids():
  id, smiles = augmented_id.split()
  target_mol = T.parse_molecule(smiles, "smistring")
  if target_mol.HasSubstructMatch(query_mol): # RDKit specific!
   print(id, "matches", smiles)
   num_matches += 1
  else:
                ", smiles)
   print(id, "
report_time = time.time()
# Report the results
print()
print("= Screen search =")
print("num targets:", len(screen))
print("screen size:", len(result))
print("num matches:", num_matches)
print("screenout: %.1f\%" % (100.0 * (len(screen)-len(result)) / len(screen),))
if len(result) == 0:
 precision = 100.0
else:
 precision = (100.0*num_matches) / len(result)
print("precision: %.1f%%" % (precision,))
print("screen time: %.2f" % (search_time - start_time,))
print("atom-by-atom-search and report time: %.2f" % (report_time - search_time,))
print("total time: %.2f" % (report_time - start_time,))
# Reduce the computations without any screening
num actual = 0
actual_start_time = time.time()
for augmented_id in screen.ids:
 id, smiles = augmented_id.split()
 target_mol = T.parse_molecule(smiles, "smistring")
 if target_mol.HasSubstructMatch(query_mol): # RDKit specific!
   num_actual += 1
actual_end_time = time.time()
print()
print("= Brute force search =")
print("num matches:", num actual)
print("time to test all molecules: %.2f" % (actual_end_time - actual_start_time,))
print("screening speedup: %.1f" % ((actual_end_time - actual_start_time) / (report_time -

    start_time),))
```

Here's the output with 'c1cccc1O' on the command-line:

```
% python search.py c1ccccc10
48548137 matches CCNC(=0)N/N=C/c1cccc(OC)c1
48651969 matches CCCOCC(=0)NCc1cccc(OC)c1
48980706 matches CCCCNC(=0)CCCc1ccc(OC)cc1
48661290 matches CCCOCC(=0)Nc1cccc(OCC)c1
48653813 matches CCCOCC(=0)NCCOc1cccc(C)c1
  ... many lines omitted ...
48930672 matches CS(=0)(=0)c1ccc(Oc2nc(C3CC3)nc3sc4c(c23)CCCC4)cc1
48673774 matches COc1ccc(C)cc1-n1ccc(C(=0)N2CCc3[nH]c4cccc4c3C2)n1
48551088 matches Cc1cc(C)c(CN2C(=0)NC3(CCOc4ccccc43)C2=0)c(C)c1
48944841 matches CC(C)(CNS(=0)(=0)CC12CCC(CC1=0)C2(C)C)c1ccc2c(c1)0C02
48729925 matches 0=C(Cn1c(-c2cccc2)noc1=0)Nc1ccc2c(c1)0C1(CCCC1)02
= Screen search =
num targets: 14967
screen size: 4946
num matches: 4943
screenout: 67.0%
precision: 99.9%
screen time: 0.00
atom-by-atom-search and report time: 2.99
total time: 3.00
= Brute force search =
num matches: 4943
time to test all molecules: 5.00
screening speedup: 1.7
```

It's a relief to see that the versions with and without the screen give the same number of matches!

Next, 'c1cccc1I' (that's iodobenzene):

```
% python search.py 'c1ccccc1I'
48731386 matches Cc1cc(CNC(=0)c2ccc(I)cc2)on1
48671550 matches NC(=0)Cc1ccc(OCC(=0)Nc2ccc(I)cc2)cc1
48731482 matches Cc1cc(CNC(=0)c2cccc(I)c2)on1
48731331 matches Cc1cc(CNC(=0)c2ccccc2I)on1
48741344 matches CN(C)C(=0)c1cccc(NC(=0)Nc2ccc(I)cc2)c1
48584231 matches O=C(Nc1cccc(COCC2CC2)c1)c1ccccc1I
48688164 matches CC1CN(C(=0)c2ccc(I)cc2)CC(C)(C)01
48688205 matches CC1CN(C(=0)c2cccc(I)c2)CC(C)(C)01
48946427 matches N\#CC1CCN(S(=0)(=0)c2ccc(I)cc2)CC1
48522115 matches CC1(C)COCCN1C(=0)c1ccc(F)cc1I
= Screen search =
num targets: 14967
screen size: 10
num matches: 10
screenout: 99.9%
precision: 100.0%
screen time: 0.01
atom-by-atom-search and report time: 0.01
```

```
total time: 0.02

= Brute force search =
num matches: 10
time to test all molecules: 5.17
screening speedup: 281.4
```

Now for some bad news. Try '[Pu]'. This doesn't screen out many structures yet has no matched. I'll report the search statistics:

```
= Screen search =
num targets: 14967
screen size: 14967
num matches: 0
screenout: 0.0%
precision: 0.0%
screen time: 0.00
atom-by-atom-search and report time: 8.40
total time: 8.40

= Brute force search =
num matches: 0
time to test all molecules: 5.24
screening speedup: 0.6
```

That's horrible! It's slower! What happened is that '[Pu]' generates a fingerprint with only two bits set:

You know, that's really hard to see. I'll use a bit of perl to replace the zeros with "."s:

Ha! And it converted zeros in the header lines to "." (and it would have converted any zeros in the identifier).

I'll just omit the header lines in the following.

Unfortunately, so many other structures also set those two bits that it isn't an effective screen for plutonium.

#### 4.25 Reading structure fingerprints using a toolkit

In this section you'll learn how to use a chemistry toolkit to compute fingerprints from a given structure file.

What happens if you're given a structure file and you want to find the two nearest matches in an FPS file? You'll have to generate the fingerprints for the structures in the structure file, then do the comparison.

For this section you'll need to have a chemistry toolkit. I'll use the "chebi\_maccs.fps" file generated in *Using a toolkit to process the ChEBI dataset* as the targets, and the PubChem file Compound\_099000001\_099500000.sdf.gz as the source of query structures:

```
>>> from __future__ import print_function # Only for Python 2
>>> import chemfp
>>> from chemfp import search
>>> targets = chemfp.load fingerprints("chebi maccs.fps")
>>> queries = chemfp.read_molecule_fingerprints(targets.metadata, "Compound_099000001_
\hookrightarrow 099500000.sdf.gz")
>>> for (query_id, hits) in chemfp.knearest_tanimoto_search(queries, targets, k=2,_
→threshold=0.0):
      print(query id, "=>", end=" ")
      for (target_id, score) in hits.get_ids_and_scores():
        print("%s \%.3f" % (target id, score), end=" ")
      print()
99000039 => CHEBI:116650 0.870 CHEBI:105034 0.812
99000230 => CHEBI:120636 0.840 CHEBI:127468 0.839
99002251 => CHEBI:92604 0.756 CHEBI:92191 0.733
99003537 => CHEBI:112376 0.745 CHEBI:32193 0.696
99003538 => CHEBI:112376 0.745 CHEBI:32193 0.696
     ... many, many lines omitted ...
```

That's it! Pretty simple, wasn't it? I didn't even need to explicitly specify which toolkit I wanted to use because the read\_molecule\_fingerprints() got that information from the arena's Metadata.

The new function is <code>chemfp.read\_molecule\_fingerprints()</code>, which reads a structure file and generates the appropriate fingerprints for each one. The first parameter of this is the metadata used to configure the reader. In my case it's:

```
>>> print(targets.metadata)
#num_bits=166
#type=OpenBabel-MACCS/2
#software=OpenBabel/3.0.0 chemfp/3.4
#source=ChEBI_lite.sdf.gz
#date=2020-05-12T10:09:35
```

The metadata's "type" told chemfp which toolkit to use to read molecules, and how to generate fingerprints from those molecules.

You can pass in your own metadata as the first parameter to read\_molecule\_fingerprints, and as a shortcut, if you pass in a string then it will be used as the fingerprint type.

For examples, if you have OpenBabel installed then you can do:

If you have OEChem and OEGraphSim installed and licensed then you can do:

If you have RDKit installed then you can do:

And if you have the CDK JAR file on your CLASSPATH and the JPype Python/Java adapter installed then you can do:

```
>>> for i, (id, fp) in enumerate(reader):
...    print(id, bitops.hex_encode(fp))
...    if i == 3:
...        break
...
99000039 000004000000300001c4004e83e1b053dce16f6e1f
99000230 000000800100649f0645a7fe2aeab1eb8febffff1f
99002251 00000000001132000088004985e01172dce4ebfe1f
99003537 00000000200020000356149a80e994930cb179ae1f
```

#### 4.26 Select a fingerprint subset using a list of indices

In this section you'll learn how to make a new arena given a list of indices for the fingerprints to select from an old arena.

For this section, one example will use indices will be a randomly selected subset of the indices in the fingerprint. If that's your goal, see the next section, Sample N fingerprints at random to learn how to use FingerprintArena.sample(). If you want to split the arena into a training set and a test set, see the section after that, Split into training and test sets which shows how to use FingerprintArena.train\_test\_split().

A FingerprintArena slice creates a subarena. Technically speaking, this is a "view" of the original data. The subarena doesn't actually copy its fingerprint data from the original arena. Instead, it uses the same fingerprint data, but keeps track of the start and end position of the range it needs. This is why it's not possible to slice with a step size other than +1.

This also means that memory for a large arena won't be freed until all of its subarenas are also removed.

You can see some evidence for this because a *FingerprintArena* stores the entire fingerprint data as a set of bytes named arena:

```
>>> import chemfp
>>> targets = chemfp.load_fingerprints("pubchem_targets.fps")
>>> subset = targets[10:20]
>>> targets.arena is subset.arena
True
```

This shows that the *targets* and *subset* share the same raw data set. At least it does to me, the person who wrote the code.

You can ask an arena or subarena to make a *copy*. This allocates new memory for the new arena and copies all of its fingerprints there.

```
>>> new_subset = subset.copy()
>>> len(new_subset) == len(subset)
True
>>> new_subset.arena is subset.arena
False
>>> subset[7][0]
'48637548'
>>> new_subset[7][0]
'48637548'
```

The FingerprintArena. copy() method can do more than just copy the arena. You can give it a list of indices (or an iterable) and it will only copy those fingerprints:

```
>>> three_targets = targets.copy([3112, 0, 1234])
>>> three_targets.ids
['48942244', '48568841', '48628197']
>>> [targets.ids[3112], targets.ids[0], targets.ids[1234]]
['48628197', '48942244', '48568841']
```

Are you confused about why the identifiers aren't in the same order? That's because when you specify indicies, the copy automatically reorders them by popcount and stores the popcount information. This requires a bit extra overhead to sort, but makes future searches faster. Use reorder=False to leave the order unchanged

```
>>> my_ordering = targets.copy([3112, 0, 1234], reorder=False)
>>> my_ordering.ids
['48628197', '48942244', '48568841']
```

Suppose you want to partition the data set into two parts; one containing the fingerprints at positions 0, 2, 4, ... and the other containing the fingerprints at positions 1, 3, 5, .... The range() function returns iterator for the right length, and you can have it start from either 0 or 1 and count by twos, like this:

```
>>> list(range(0, 10, 2))
[0, 2, 4, 6, 8]
>>> list(range(1, 10, 2))
[1, 3, 5, 7, 9]
```

so the following will create the correct indices and from that the correct arena subsets:

```
>>> evens = targets.copy(range(0, len(targets), 2))
>>> odds = targets.copy(range(1, len(targets), 2))
>>> len(evens)
7484
>>> len(odds)
7483
```

(Use  $FingerprintArena.train\_test\_split()$  if you want to select two disjoint subsets selected at random without replacement.)

What about getting a random subset of the data? I want to select m records at random, without replacement, to make a new data set. (See the next section for a better way to do this using FingerprintArena.sample().)

You can see this just means making a list with m different index values. Python's built-in random.sample function makes this easy:

```
>>> import random
>>> random.sample("abcdefgh", 3)
['b', 'h', 'f']
>>> random.sample("abcdefgh", 2)
['d', 'a']
>>> random.sample([5, 6, 7, 8, 9], 2)
[7, 9]
>>> help(random.sample)
Help on method sample in module random:
```

```
sample(population, k) method of random.Random instance
   Chooses k unique random elements from a population sequence or set.
   ...
   To choose a sample in a range of integers, use range as an argument.
   This is especially fast and space efficient for sampling from a
   large population: sample(range(10000000), 60)
```

The last line of the help points out what do next!:

```
>>> random.sample(range(len(targets)), 5)
[610, 2850, 705, 1402, 2635]
>>> random.sample(range(len(targets)), 5)
[1683, 2320, 1385, 2705, 1850]
```

(Note: on Python 2.7 you'll need to use "xrange()" not "range()".)

Putting it all together, and here's how to get a new arena containing 100 randomly selected fingerprints, without replacement, from the *targets* arena:

```
>>> sample_indices = random.sample(range(len(targets)), 100)
>>> sample = targets.copy(indices=sample_indices)
>>> len(sample)
100
```

But really, see the next section for an easier way to do this.

#### 4.27 Sample N fingerprints at random

In this section you'll learn how to select a random subset of the fingerprints in an arena.

The previous section showed how to use the *FingerprintArena.copy()* method to create a new arena containing a randomly selected subset of the fingerprints in an arena. This required writing some code to specify the randomly samples indices.

Chemfp 3.4.1 added the method FingerprintArena.sample() which lets you make a random sample using a single call:

```
>>> import chemfp
>>> targets = chemfp.load_fingerprints("pubchem_targets.fps")
>>> sample_arena = targets.sample(10000)
>>> len(sample_arena)
10000
>>> sample_arena.ids[:5]
['48941399', '48940284', '48943050', '48656867', '48839855']
```

If you do the sample a few times you'll see that many of the elements occur often:

```
>>> targets.sample(10000).ids[:5]
['48942244', '48656867', '48966209', '48946425', '48946734']
>>> targets.sample(10000).ids[:5]
['48942244', '48940284', '48656359', '48839855', '48946668']
>>> targets.sample(10000).ids[:5]
```

```
['48942244', '48940284', '48656359', '48656867', '48839855']
>>> targets.sample(10000).ids[:5]
['48940284', '48656359', '48656867', '48839855', '48946668']
```

This is for two reasons. First, the sample size is about 2/3rds of the size of the data set:

```
>>> len(targets)
14967
```

which means there's a roughly 2/3rds chance that a given record will be in the sample. Second, by default the sampled fingerprints are reordered by popcount when making the arena, which means many of the first few identifiers are the same.

Set reorder to False to keep the fingerprints in random sample order:

```
>>> targets.sample(10000, reorder=False).ids[:5]
['48830242', '48946583', '48559359', '48836764', '48692192']
>>> targets.sample(10000, reorder=False).ids[:5]
['48868183', '48703234', '48577832', '48913224', '48659805']
>>> targets.sample(10000, reorder=False).ids[:5]
['48965603', '48596355', '48691077', '48688289', '48940955']
>>> targets.sample(10000, reorder=False).ids[:5]
['48560433', '48933559', '48662000', '48958077', '48675138']
```

Remember that similarity search performance is better if the the fingerprints are sorted by popcount.

The above examples used  $num\_samples=10000$ . If  $num\_samples$  is an integer, then it's used as the number of samples to make. (Chemfp raises a ValueError if the size is negative or too large.) If  $num\_samples$  is a float between 0.0 and 1.0 inclusive then it's used as the fraction of the dataset to sample. For example, the following samples 10% of the arena, rounded down:

```
>>> len(targets.sample(0.1))
1496
```

If no rng is given then the underlying implementation uses Python's random.sample function. That in turn uses a random number generator (RNG) which was initialized with a hard-to-guess seed.

If you need a reproducible sample, you can pass in an integer rng value. This is used to seed a new RNG for the sampling. In the following example, using the same seed always returns the same fingerprints:

```
>>> targets.sample(2, rng=123).ids
['48651340', '48778262']
>>> targets.sample(2, rng=123).ids
['48651340', '48778262']
>>> targets.sample(2, rng=789).ids
['48693989', '48507089']
>>> targets.sample(2, rng=789).ids
['48693989', '48507089']
```

Another option is pass in a random.Random() instance, which will be used directly as the RNG:

```
>>> import random
>>> my_rng = random.Random(123)
>>> targets.sample(2, rng=my_rng).ids
```

```
['48651340', '48778262']
>>> targets.sample(2, rng=my_rng).ids
['48730072', '48908385']
>>> targets.sample(2, rng=my_rng).ids
['48690445', '48502715']
```

This may be useful if you need to make several random samples, want reproducibility, and only want to specify one RNG seed. (Be aware that Python's RNG may be subject to change across different versions of Python.)

#### 4.28 Split into training and test sets

In this section you'll learn how to split an arena into two disjoint arenas, which can be then be used as a training set and a test set.

The previous section, *Sample N fingerprints at random* showed how to use chemfp to select N fingerprints at random from an arena. Sometimes you need two randomly selected subsets, with no overlap between the two. For example, one might be used as a training set and the other as a test set.

Chemfp 3.4.1 added the method FingerprintArena.train\_test\_split() which does that. You give it the number of fingerprints you want in the training set and/or the test set, and it returns two arenas; the first is the training set and the second is the test set:

```
>>> import chemfp
>>> targets = chemfp.load_fingerprints("pubchem_targets.fps")
>>> len(targets)
14967
>>> train_arena, test_arena = targets.train_test_split(train_size=10, test_size=5)
>>> len(train_arena)
10
>>> len(test_arena)
5
```

This function is modeled on the scikit learn function train\_test\_split() , which allows for the sizes to be specified as an integer number or a floating point fraction.

If a specified size is an integer, it is interpreted at the number of fingerprints to have in the corresponding set. If a specified size is a float between 0.0 and 1.0 inclusive then it's interpreted as the fraction of fingerprints to select. For example, the following puts 10% of the fingerprints into the training arena and 20 fingerprints

```
>>> train_arena, test_arena = targets.train_test_split(train_size=0.1, test_size=20)
>>> len(train_arena), len(test_arena)
(1496, 20)
```

If you don't specify the test or arena size then the training set gets 75% of the fingerprints and the test set gets the rest:

```
>>> train_arena, test_arena = targets.train_test_split()
>>> len(train_arena), len(test_arena)
(11226, 3741)
```

If only one of *train\_size* or *test\_size* is specified then the other value is interpreted as the complement size, so the entire arena is split into the two sets. In the following, 75% of the fingerprints are put into the training

arena and 25% into the test arena:

```
>>> train_arena, test_arena = targets.train_test_split(train_size=0.75)
>>> len(train_arena), len(test_arena)
(11225, 3742)
```

It is better to let chemp figure out the complement size than to specify both sizes as a float because integer rounding may cause a fingerprint to be left out (the test arena size is 3741 in the following when it should be 3742):

```
>>> train_arena, test_arena = targets.train_test_split(train_size=0.75, test_size=0.25)
>>> len(train_arena), len(test_arena)
(11225, 3741)
```

By default, after the random sampling the fingerprints in each set are reordered by population count and indexed for fast similarity search.

```
>>> from chemfp import bitops
>>> train_arena, test_arena = targets.train_test_split(10, 10)
>>> [bitops.byte_popcount(train_arena.get_fingerprint(i)) for i in range(10)]
[71, 118, 119, 145, 146, 159, 162, 167, 176, 196]
>>> [bitops.byte_popcount(test_arena.get_fingerprint(i)) for i in range(10)]
[87, 116, 117, 121, 129, 131, 139, 183, 184, 193]
```

To keep the fingerprints in random sample order, specify reorder=False:

```
>>> train_arena, test_arena = targets.train_test_split(10, 10, reorder=False)
>>> [bitops.byte_popcount(train_arena.get_fingerprint(i)) for i in range(10)]
[118, 53, 170, 110, 138, 169, 129, 125, 129, 151]
>>> [bitops.byte_popcount(test_arena.get_fingerprint(i)) for i in range(10)]
[172, 167, 123, 152, 147, 162, 156, 197, 45, 151]
```

The *rng* parameter affects how the fingerprints are samples. By default (if *rng=None*), Python's default RNG is used. If *rng* is an integer then it's used as the seed for a new random.Random() instance. Otherwise it's assumed to be an RNG object and its sample() method is used to make the sample.

The rng parameter here works the same as in FingerprintArena.sample() so for examples see the previous section,  $Sample\ N\ fingerprints\ at\ random.$ 

## 4.29 Don't reorder an arena by popcount

In this section you'll learn about why you might want to store your fingerprints in specific order, rather than being ordered by population count.

The previous section showed how to make an arena where the fingerprints are in a user-specified order:

```
>>> import chemfp
>>> targets = chemfp.load_fingerprints("pubchem_targets.fps")
>>> [targets.ids[i] for i in [3112, 0, 1234]]
['48628197', '48942244', '48568841']
>>> targets.copy([3112, 0, 1234], reorder=False).ids
['48628197', '48942244', '48568841']
>>> targets.copy([3112, 0, 1234], reorder=True).ids
['48942244', '48568841', '48628197']
```

If the reorder option is not specified, the fingerprints in the new arena will be in popcount order. Similarity search is faster when the arena is in popcount order because it lets chemfp make an index of the different regions, based on popcount, and use that for sublinear search.

Why would someone want search to be slower?

Sometimes data organization is more important. For one client I developed a SEA implementation, where I compared a set of query fingerprints to about 50 other sets of target fingerprint sets. The largest set had only few thousand fingerprints, so the overall search was fast without a popcount index.

I could have stored each target data set as its own file, but that would have resulted in about 50 data files to manage, in addition to the original fingerprint file and the configuration file containing the information about which identifiers are in which set.

Instead, I stored all of the target data sets in a single FPB file, where the fingerprints for the first set came first, then the fingerprints for the second set, and so on. I also made a range file to store the set name and the start/end range of that set in the FPB file. This reduced 50 files down to two, which was much easier to manage.

It's a bit fiddly to go through the details of how this works, because it requires set membership information which is a bit complicated to extract and which won't be used for the rest of this documentation. Instead of walking though an example here, I'll refer you to my essay ChEMBL target sets association network.

You can use the subranges directly as an arena slice, like arena[54:91] as the target. This will work, but as I said earlier, the search time will be slower because the sublinear algorithm requires a popcount index.

If you need that search performance then during load time make a copy of the slice, as in arena[54:91]. copy(reorder=True), and use that as the target.

A few paragraphs ago I wrote that "I stored all of the target data sets in a single FPB file." When you load an FPB format, the fingerprint order will be exactly as given in the file. However, if you load fingerprints from an FPS file, the fingerprints are by default reordered. For example, given this data set:

```
% cat unordered_example.fps
#FPS1
0001 Record1
ffee Record2
00f0 Record3
```

I'll load it into chemfp and show that by default the records are in the order 1, 3, 2:

```
>>> import chemfp
>>> chemfp.load_fingerprints("unordered_example.fps").ids
['Record1', 'Record3', 'Record2']
```

On the other hand, if I ask it to not reorder then the records are in the input order, which is 1, 2, 3:

```
>>> chemfp.load_fingerprints("unordered_example.fps", reorder=False).ids
['Record1', 'Record2', 'Record3']
```

In short, if you want to preserve the fingerprint order as given in the input file then use the reorder=False argument in <code>chemfp.load\_fingerprints()</code>.

# 4.30 Look up a fingerprint with a given id

In this section you'll learn how to get a fingerprint record with a given id. You will need the "pubchem\_targets.fps" file generated in *Generate fingerprint files from PubChem SD tags* in order to do this

yourself.

All fingerprint records have an identifier and a fingerprint. Identifiers should be unique. (Duplicates are allowed, and if they exist then the lookup code described in this section will arbitrarily decide which record to return. Once made, the choice will not change.)

Let's find the fingerprint for the record in "pubchem\_targets.fps" which has the identifier "14564126". One solution is to iterate over all of the records in a file, using the FPS reader:

```
>>> import chemfp
>>> for id, fp in chemfp.open("pubchem_targets.fps"):
...     if id == "48500164":
...         break
...     else:
...     raise KeyError("%r not found" % (id,))
...
>>> id, fp[:5]
('48500164', b'\x07\xde\x0c\x00\x00')
```

I used the somewhat obscure else clause to the for loop. If the for finishes without breaking, which would happen if the identifier weren't present, then it will raise an exception saying that it couldn't find the given identifier.

If the fingerprint records are already in a FingerprintArena then there's a better solution. Use the FingerprintArena.get\_fingerprint\_by\_id() method to get the fingerprint byte string, or None if the identifier doesn't exist:

```
>>> arena = chemfp.load_fingerprints("pubchem_targets.fps")
>>> fp = arena.get_fingerprint_by_id("48500164")
>>> fp[:5]
b'\x07\xde\x0c\x00\x00'
>>> missing_fp = arena.get_fingerprint_by_id("does-not-exist")
>>> missing_fp
>>> missing_fp is None
True
```

Internally this does about what you think it would. It uses the arena's id list to make a lookup table mapping identifier to index, and caches the table for later use. Given the index, it's very easy to get the fingerprint.

In fact, you can get the index and do the record lookup yourself:

```
>>> arena.get_index_by_id("48500164")
8168
>>> arena[8168]
('48500164', b'\x07\xde\x0c\x00\x00 .. rest omittted ..'')
```

#### 4.31 Sorting search results

In this section you'll learn how to sort the search results.

The k-nearest searches return the hits sorted from highest score to lowest, and break ties arbitrarily. This is usually what you want, and the extra cost to sort is small (k\*log(k)) compared to the time needed to maintain the internal heap (N\*log(k)).

By comparison, the threshold searches return the hits in arbitrary order. Sorting takes up to N\*log(N) time, which is extra work for those cases where you don't want sorted data. If you actually want it sorted, then call <code>SearchResult.reorder()</code> method to sort the hits in-place:

```
>>> import chemfp
>>> arena = chemfp.load_fingerprints("pubchem_targets.fps")
>>> query_fp = arena.get_fingerprint_by_id("48500164")
>>> from chemfp import search
>>> result = search.threshold_tanimoto_search_fp(query_fp, arena, threshold=0.90)
>>> len(result)
>>> result.get_ids_and_scores()
[('48530223', 0.9044585987261147), ('48533220', 0.9230769230769231),
('48533212', 0.9299363057324841), ('48500164', 1.0), ('48501504',
0.906832298136646)]
>>>
>>> result.reorder("decreasing-score")
>>> result.get_ids_and_scores()
[('48500164', 1.0), ('48533212', 0.9299363057324841), ('48533220',
0.9230769230769231), ('48501504', 0.906832298136646),
('48530223', 0.9044585987261147)]
>>>
>>> result.reorder("increasing-score")
>>> result.get_ids_and_scores()
[('48530223', 0.9044585987261147), ('48501504', 0.906832298136646),
('48533220', 0.9230769230769231), ('48533212', 0.9299363057324841),
('48500164', 1.0)]
```

There are currently eight different sort methods, all specified by a name string. These are

- increasing-score sort by increasing score
- increasing-score-plus sort by increasing score, breaking ties on increasing index
- decreasing-score sort by decreasing score
- decreasing-score-plus sort by decreasing score, breaking ties on increasing index
- increasing-index sort by increasing target index
- decreasing-index sort by decreasing target index
- reverse reverse the current ordering
- move-closest-first move the hit with the highest score to the first position

The first two sort by increasing score. The first one only considers the scores when sorting, and preserves the original order of the indices for hits with the same score. The second one sorts by increasing score and, if multiple hits have the same score, ties are broken by increasing index. This gives an absolute ordering to the results, independent of history, but is a bit slower than the first option.

The third and fourth options sort by decreasing score. The third one only considers the scores when sorting, and preserves the original order of the indices for hits with the same score. The fourth one sorts by decreasing score and, if multiple hits have the same score, ties are broken by increasing index. This gives an absolute ordering to the results, independent of history, but is a bit slower than the third option.

**Note:** Before chemfp 3.5 the increasing-score and decreasing-score implementations gave an absolute order (the same as increasing-score-plus and decreasing-score-plus do now). This implementation

detail was never documented. The behavior was changed to allow a faster sort implementation which does not break ties for the same score.

If you find something useful for increasing-index and decreasing-index, let me know. They sort exactly like their names describe.

The reverse method reverses the current ordering, and is mostly useful if you want to reverse the sorted results from a k-nearest search.

The move-closest-first option exists to improve the leader algorithm stage used by the Taylor-Butina algorithm. The newly seen compound is either in the same cluster as its nearest neighbor or it is the new centroid. I felt it best to implement this as a special reorder term, rather than one of the other possible options.

If you have suggestions for alternate orderings which might help improve your clustering performance, let me know.

If you want to reorder all of the search results then you could use the <code>SearchResult.reorder()</code> method on each result, but it's easier to use <code>SearchResults.reorder\_all()</code> and change everything in a single call. It takes the same ordering names as <code>reorder</code>:

```
>>> from __future__ import print_function # Only for Python 2
>>> similarity matrix = search.threshold tanimoto search symmetric(
                            arena, threshold=0.8)
>>> for query_id, row in zip(arena.ids, similarity_matrix):
      print(query_id, "->", row.get_ids_and_scores()[:3])
48942244 -> []
48941399 -> []
48940284 -> []
48943050 -> []
48656359 -> [('48656867', 0.9761904761904762), ('48656360', 0.911111111111111), (
→ '48650490', 0.851063829787234)]
48656867 -> [('48656360', 0.8913043478260869), ('48650490', 0.833333333333333), (
→ '48521769', 0.8)]
48839855 -> [('48839869', 0.9148936170212766), ('48839845', 0.8775510204081632), (
\rightarrow '48839868', 0.8269230769230769)]
         ... lines deleted ....
>>>
>>> similarity matrix.reorder all("increasing-score")
>>> for query_id, row in zip(arena.ids, similarity_matrix):
      print(query_id, "->", row.get_ids_and_scores()[:3])
48942244 -> []
48941399 -> []
48940284 -> []
48943050 -> []
48656359 -> [('48680086', 0.803921568627451), ('48693263', 0.803921568627451), ('48693634
→', 0.803921568627451)]
48656867 -> [('48521769', 0.8), ('48521768', 0.803921568627451), ('48653206', 0.
→803921568627451)]
48839855 -> [('48839868', 0.8269230769230769), ('48839845', 0.8775510204081632), (
→ '48839869', 0.9148936170212766)]
         ... lines deleted ....
```

For display purposes, I used [:3] to display only the first three matches. In the first block the results are

in arbitrary order, while in the second the elements are sorted so the smallest score is first.

#### 4.32 Working with raw scores and counts in a range

In this section you'll learn how to get the hit counts and raw scores for an interval.

The length of a SearchResult is the number of hits it contains:

```
>>> import chemfp
>>> from chemfp import search
>>> arena = chemfp.load_fingerprints("pubchem_targets.fps")
>>> fp = arena.get_fingerprint_by_id("48500164")
>>> result = search.threshold_tanimoto_search_fp(fp, arena, threshold=0.2)
>>> len(result)
14888
```

This gives you the number of hits at or above a threshold of 0.2, which you can also get by doing chemfp.  $search.count\_tanimoto\_hits\_fp()$ :

```
>>> search.count_tanimoto_hits_fp(fp, arena, threshold=0.2)
14888
```

The advantage to the first version is the result also stores the hits. You can query the hit to get the number of hits which are within a specified interval. Here are the counts of the number of hits at or above 0.5, 0.80, and 0.95:

```
>>> result.count(0.5)
7785
>>> result.count(0.8)
42
>>> result.count(0.95)
1
```

The first parameter,  $min\_score$ , specifies the minimum threshold. If not specified it's -infinity. The second,  $max\_score$ , specifies the maximum, and is +infinity if not specified. Here's how to get the number of hits with a score of at most 0.95 and 0.5:

```
>>> result.count(max_score=0.95)
14887
>>> result.count(max_score=0.5)
7209
```

If you double-check the math, and add the number above 0.5 (7785) and the number below 0.5 (7209) you'll get 14994, even through there are only 14888 records. The extra 106 is because by default the count interval uses a closed range. There are 106 hits with a score of exactly 0.5:

```
>>> result.count(0.5, 0.5)
106
```

The third parameter, *interval*, specifies the end conditions. The default is "[]" which means that both ends are closed. The interval "()" means that both ends are open, and "[)" and "(]" are the two half-open/half-closed ranges. To get the number of hits below 0.5 and the number of hits at or above 0.5 then you might use:

```
>>> result.count(None, 0.5, "[)")
7103
>>> result.count(0.5, None, "[]")
7785
>>> 7103+7785
14888
```

This total matches the expected count. (A min or max of *None* means -infinity and +infinity, respectively.)

#### 4.33 Cumulative search result counts and scores

In this section you'll learn some more advanced ways to work with SearchResults and SearchResult instances.

I wanted to title this section "Going to SEA", but decided to use a more descriptive name. "SEA" refers to the "Similarity Ensemble Approach" (SEA) work of Keiser, Roth, Armbruster, Ernsberger, and Irwin. The paper is available online from <a href="http://sea.bkslab.org/">http://sea.bkslab.org/</a>, though I won't actually implement it here. Why do I mention it? Because these chemfp methods were added specifically to make it easier to support a SEA implementation for one of the chemfp customers.

Suppose you have two sets of structures. How well do they compare to each other? I can think of various ways to do it. One is to look at a comparison profile. Find all NxM comparisons between the two sets. How many of the hits have a threshold of 0.2? How many at 0.5? 0.95?

If there are "many", then the two sets are likely more similar than not. If the answer is "few", then they are likely rather distinct.

I'll be more specific. I want to know if the coenzyme A-like structures in ChEBI are more similar to the penicillin-like structures than one would expect by comparing two randomly chosen subsets. To quantify "similar", I'll use Tanimoto similarity of the "chebi\_maccs.fps" fingerprints, which are the 166 MACCS key-like fingerprints from RDMACCS for the ChEBI data set. See *Using a toolkit to process the ChEBI dataset* for details about why I use the --id-tag options:

```
# Use one of the following to create chebi_maccs.fps

oe2fps --id-tag "ChEBI ID" --rdmaccs ChEBI_lite.sdf.gz -o chebi_maccs.fps

ob2fps --id-tag "ChEBI ID" --rdmaccs ChEBI_lite.sdf.gz -o chebi_maccs.fps

rdkit2fps --id-tag "ChEBI ID" --rdmaccs ChEBI_lite.sdf.gz -o chebi_maccs.fps

cdk2fps --id-tag "ChEBI ID" --rdmaccs ChEBI_lite.sdf.gz -o chebi_maccs.fps
```

I used oe2fps to create RDMACCS-OpenEye fingerprints.

The CHEBI id for coenzyme A is CHEBI:15346 and for penicillin is CHEBI:17334. I'll define the "coenzyme A-like" structures as the 256 structures where the fingerprint is at least 0.95 similar to coenzyme A, and "penicillin-like" as the 24 structures at least 0.85 similar to penicillin. This gives 6144 total comparisons.

You know enough to do this, but there's a nice optimization I haven't told you about. You can get the total count of all of the threshold hits using the <code>chemfp.search.SearchResults.count\_all()</code> method instead of looping over each SearchResult and calling <code>chemfp.search.SearchResult.count()</code>:

```
from __future__ import print_function # Only for Python 2
import chemfp
from chemfp import search

def get_neighbors_as_arena(arena, id, threshold):
    fp = arena.get_fingerprint_by_id(id)
```

```
neighbor_results = search.threshold_tanimoto_search_fp(fp, chebi,_
→threshold=threshold)
   neighbor arena = arena.copy(neighbor results.get indices())
   return neighbor arena
chebi = chemfp.load_fingerprints("chebi_maccs.fps")
# Find the 256 neighbors of coenzyme A
coA_arena = get_neighbors_as_arena(chebi, "CHEBI:15346", threshold=0.95)
print(len(coA_arena), "coenzyme A-like structures")
# Find the 24 neighbors of penicillin
penicillin_arena = get_neighbors_as_arena(chebi, "CHEBI:17334", threshold=0.85)
print(len(penicillin_arena), "penicillin-like structures")
# I'll compute a profile at different thresholds
thresholds = [0.3, 0.35, 0.4, 0.45, 0.5, 0.55, 0.6, 0.7, 0.8, 0.9, 0.95]
# Compare the two sets. (For this case the speed difference between a threshold
# of 0.25 and 0.0 is not noticible, but having it makes me feel better.)
coA_against_penicillin_result = search.threshold_tanimoto_search_arena(
   coA_arena, penicillin_arena, threshold=min(thresholds))
# Show a similarity profile
print("Counts coA/penicillin")
for threshold in thresholds:
   print(" %.2f
                     \%5d" % (threshold,
                             coA_against_penicillin_result.count_all(min_
```

This gives a not very useful output:

```
272 coenzyme A-like structures
24 penicillin-like structures
Counts coA/penicillin
0.30
            6528
0.35
            6528
0.40
            6523
0.45
            4403
0.50
            1193
0.55
               0
0.60
               0
0.70
               0
0.80
               0
0.90
               0
0.95
```

It's not useful because it's not possible to make any decisions from this. Are the numbers high or low? It should be low, because these are two quite different structure classes, but there's nothing to compare it against.

I need some sort of background reference. What I'll do is construct two randomly chosen sets, one with 256 fingerprints and the other with 24, and generate the same similarity profile with them. That isn't quite fair,

since randomly chosen sets will most likely be diverse. Instead, I'll pick one fingerprint at random, then get its 256 or 24, respectively, nearest neighbors as the set members (place the following code at the end of the file with the previous code):

```
# Get background statistics for random similarity groups of the same size
import random

# Find a fingerprint at random, get its k neighbors, return them as a new arena
def get_random_fp_and_its_k_neighbors(arena, k):
    fp = arena[random.randrange(len(arena))][1]
    similar_search = search.knearest_tanimoto_search_fp(fp, arena, k)
    return arena.copy(similar_search.get_indices())
```

I'll construct 1000 pairs of sets this way, accumulate the threshold profile, and compare the CoA/penicillin profile to it:

```
# Initialize the threshold counts to 0
total_background_counts = dict.fromkeys(thresholds, 0)
REPEAT = 1000
for i in range(REPEAT):
    # Select background sets of the same size and accumulate the threshold count totals
    set1 = get_random_fp_and_its_k_neighbors(chebi, len(coA_arena))
    set2 = get random fp and its k neighbors(chebi, len(penicillin arena))
    background_search = search.threshold_tanimoto_search_arena(set1, set2,_
→threshold=min(thresholds))
    for threshold in thresholds:
        total_background_counts[threshold] += background_search.count_all(min_
⇔score=threshold)
print("Counts coA/penicillin background")
for threshold in thresholds:
    print(" %.2f
                                    \%5d" % (threshold,
                                            coA_against_penicillin_result.count_all(min_
⇒score=threshold),
                                            total background counts[threshold] / ___
\hookrightarrow (REPEAT+0.0)))
```

Your output should now have something like this at the end:

Counts	coA/penicillin	background
0.30	6528	2798
0.35	6528	2273
0.40	6523	1789
0.45	4403	1301
0.50	1193	988
0.55	0	656
0.60	0	411
0.70	0	160
0.80	0	54
0.90	0	15
0.95	0	0

This is a bit hard to interpret. Clearly the coenzyme A and penicillin sets are not closely similar, but for low Tanimoto scores the similarity is higher than expected. That difficulty is okay for now because I

mostly wanted to show an example of how to use the chemfp API. If you want to dive deeper into this sort of analysis then read a three-part series I wrote at <a href="http://www.dalkescientific.com/writings/diary/archive/2017/03/20/fingerprint\_set\_similarity.html">http://www.dalkescientific.com/writings/diary/archive/2017/03/20/fingerprint\_set\_similarity.html</a> on using chemfp to build a target set association network using ChEMBL.

The SEA paper actually wants you to use the raw score, which is the sum of the hit scores in a given range, and not just the number of hits. No problem! Use SearchResult.cumulative\_score() for the cumulative scores for an individual result, or SearchResults.cumulative\_score\_all() for the cumulative scores across all of the results. The two functions compute almost identical values for the whole data set:

```
>>> sum(row.cumulative_score(min_score=0.5, max_score=0.9)
... for row in coA_against_penicillin_result)
605.5158868869943
>>> coA_against_penicillin_result.cumulative_score_all(min_score=0.5, max_score=0.9)
605.5158868869953
```

The cumulative methods, like the count method you learned about in the previous section, also take the *interval* parameter for when you don't want the default of "[]".

You may wonder why these two values aren't exactly the same. They differ because floating point addition is not associative. The first computes the sum for each result, then the sum of sums. The second computes the sum by adding each score to the cumulative sum.

I get a different result if I sum up the values in reverse order:

```
>>> sum(list(row.cumulative_score(min_score=0.5, max_score=0.9)
... for row in coA_against_penicillin_result)[::-1])
605.5158868869959
```

Which is the "right" score? The cumulative\_score\_all() method at least matches the one you might write if you computed the sum directly:

```
>>> total_score = 0.0
>>> for row_scores in coA_against_penicillin_result.iter_scores():
...    for score in row_scores:
...         if 0.5 <= score <= 0.9:
...             total_score += score
...
>>> total_score
605.5158868869953
```

#### 4.34 Writing fingerprints with a fingerprint writer

In this section you'll learn how to create a fingerprint file using the chemfp fingerprint writer API.

You probably don't need this section. In most cases you can save the contents of an FPS reader or fingerprint arena by using the *FingerprintReader.save()* method, as in the following examples:

```
chemfp.open("pubchem_targets.fps").save("example.fps")
chemfp.open("pubchem_targets.fps").save("example.fpb")
chemfp.open("pubchem_targets.fpb").save("example.fps.gz")
```

The structure-based fingerprint readers also implement the save method so you could simply write:

However, if you generate the fingerprints yourself, or want more fine-grained control over the writer parameters then read on!

(If you don't have RDKit installed then use "OpenBabel-MACCS" for Open Babel's MACCS fingerprints, "OpenEye-MACCS166" for OpenEye's, or "CDK-MACCS" for CDK's.)

Here's an example of the fingerprint writer API. I open the writer, ask it to write a fingerprint id and the fingerprint, and then close it.

```
>>> import chemfp
>>> writer = chemfp.open_fingerprint_writer("example.fps")
>>> writer.write_fingerprint("ABC123", b"\0\0\0\0\0\3\2\1")
>>> writer.close()
```

I'll ask Python to read the file and print the contents:

```
>>> from __future__ import print_function # Only for Python 2
>>> print(open("example.fps").read())
#FPS1
000000000000030201 ABC123
```

Of course you don't need to use chemfp to write this file. It's simple enough that you could get the same result in fewer lines of normal Python code. The advantage starts to be useful when you want to include metadata.

```
>>> metadata = chemfp.Metadata(num_bits=64, type="Example-FP/0")
>>> writer = chemfp.open_fingerprint_writer("example.fps", metadata)
>>> writer.write_fingerprint("ABC123", b"\0\0\0\0\0\0\3\2\1")
>>> writer.close()
>>>
>>> print(open("example.fps").read())
#FPS1
#num_bits=64
#type=Example-FP/0
00000000000030201 ABC123
```

Even then, native Python code is probably easier to use if you know what the header lines will be, because it's a bit of a nuisance to create the *chemfp.Metadata* yourself.

On the other hand, if you have a chemfp fingerprint type you can just ask it for the correct metadata instance:

```
>>> fptype = chemfp.get_fingerprint_type("RDKit-MACCS166")
>>> metadata = fptype.get_metadata()
>>> metadata
Metadata(num_bits=166, num_bytes=21, type='RDKit-MACCS166/2',
aromaticity=None, sources=[], software='RDKit/2019.09.1
chemfp/3.4', date='2020-05-13T13:34:37')
```

Putting the two together, and switching to a 21 byte fingerprint instead of an 8 byte fingerprint, gives:

In real life that fingerprint comes from somewhere. The high-level structure-based fingerprint reader has a handy metadata attribute:

```
>>> filename = "Compound_099000001_099500000.sdf.gz"
>>> reader = chemfp.read_molecule_fingerprints("RDKit-MACCS166", filename)
>>> print(reader.metadata)
#num_bits=166
#type=RDKit-MACCS166/2
#software=RDKit/2019.09.1chemfp/3.4
#source=Compound_099000001_099500000.sdf.gz
#date=2020-05-13T13:36:11
```

By the way, note that this includes the source filename, which FingerprintType.get\_metadata() can't automatically do. (See Merging multiple structure-based fingerprint sources for an example of how to pass that information to get\_metadata().)

A structure-based fingerprint reader is just like any other reader, so you can iterate over the (id, fingerprint) pairs:

You probably already see how to combine this with FingerprintWriter.write\_fingerprint() to generate the FPS output. The key part would look like:

```
for id, fp in reader:
   writer.write_fingerprint(id, fp)
```

While that would work, there's a better way. The chemfp fingerprint writer has a *FingerprintWriter*. write\_fingerprints() method which takes a list or iterator of (id, fingerprint) pairs. Here's a better way to write the code:

```
import chemfp
filename = "Compound_099000001_099500000.sdf.gz"
reader = chemfp.read_molecule_fingerprints("RDKit-MACCS166", filename)
writer = chemfp.open_fingerprint_writer("example.fps", reader.metadata)
writer.write_fingerprints(reader)
writer.close()
reader.close()
# Note: See the next section for an even better solution
# which uses a context manager.
```

This produces output which starts:

```
#FPS1
#num_bits=166
#type=RDKit-MACCS166/2
#software=RDKit/2019.09.1 chemfp/3.4
#source=Compound_099000001_099500000.sdf.gz
#date=2020-05-13T13:38:31
00000400000300001c0004e9361b051dce1676e1f 9900039
00000800100649f0445a7fe2aeab1fb8f6bdfff1f 99000230
0000000000132000088004985601150dce4e3fe1f 99002251
000000000200020000156149a906994930c3159ae1f 99003537
```

Why is write\_fingerprints "better" than multiple calls to write\_fingerprint? I think it more directly describes the goal of writing all of the fingerprints, rather than the mechanics of unpacking and repacking the (id, fingerprint) pairs. I had hoped that there would be performance improvement, because there's less Python function call overhead, but my timings show no differences.

However, there's a still better way, which is to use a context manager to close the files automatically, rather than calling close() explicitly. I'll leave that for the next section.

# 4.35 Fingerprint readers and writers are context managers

In this section you'll learn how the fingerprint readers and writers can be used as a context manager.

The previous section ended with the following code:

```
import chemfp
filename = "Compound_099000001_099500000.sdf.gz"
reader = chemfp.read_molecule_fingerprints("RDKit-MACCS166", filename)
writer = chemfp.open_fingerprint_writer("example.fps", reader.metadata)
writer.write_fingerprints(reader)
writer.close()
reader.close()
```

This reads a PubChem file with RDKit, generates MACCS fingerprints, and saves the results to "example.fps".

The two FingerprintWriter.close() lines ensure that the reader and writer files are closed. This isn't required for a simple script, because Python will close the files automatically at the end of the script, or when the garbage collector kicks in.

However, since the writer may buffer the output, you have to close the file before you or another program can read it. It's good practice to always close the file when you're done with it, as otherwise there are ways to get really confused about why you don't have a complete file.

Even with the explicit close calls, if there's an exception in FingerprintWriter.write\_fingerprints() then the files will be left open. In older-style Python this was handled with a try/finally block, but that's verbose. Instead, chemfp's readers and writers implement modern Python's context manager API, to make it easier to close files automatically at just the right place. Here's what the above looks like with a context manager:

```
import chemfp
filename = "Compound_099000001_099500000.sdf.gz"
with chemfp.read_molecule_fingerprints("RDKit-MACCS166", filename) as reader:
   with chemfp.open_fingerprint_writer("example.fps", reader.metadata) as writer:
        writer.write_fingerprints(reader)
```

Isn't that nice and short? Just bear in mind that it's even more succinctly written as:

```
import chemfp
filename = "Compound_099000001_099500000.sdf.gz"
with chemfp.read_molecule_fingerprints("RDKit-MACCS166", filename) as reader:
    reader.save("example.fps")
```

#### 4.36 Write fingerprints to stdout or a file-like object

In this section you'll learn how to write fingerprints to stdout, and how to write them to a BytesIO instance.

The previous section showed examples of passing a filename string to <code>chemfp.open\_fingerprint\_writer()</code>. If the filename argument is None then the writer will write to stdout in uncompressed FPS format:

The filename argument may also be a file-like object, which is defined as any object which implements the method write(s) where s is a byte string. A io.BytesIO instance is one such file-like object. It gives access to the output as a byte string:

```
#FPS1
#num_bits=16
#type=Experiment/1

>>> writer.write_fingerprint("ETAOIN", b"00")
>>> writer.close()
>>> print(f.getvalue().decode("utf8")) # convert byte string to text
#FPS1
#num_bits=16
#type=Experiment/1
3030 ETAOIN
```

You can see that closing the fingerprint writer does not close the underlying file-like object. (If it did then you couldn't get access to the string content, which gets deleted when the StringIO is closed.)

You can also write an FPB file to a file-like object, if it supports seek() and tell() and binary writes. This means that you cannot write an FPB format to stdout, but you can write it to a BytesIO instance.

```
>>> import chemfp
>>> from io import BytesIO
>>> f = BytesIO()
>>> writer = chemfp.open_fingerprint_writer(f, format="fpb")
>>> writer.write_fingerprint("ID123", b"\x01\xfe")
>>> writer.close()
>>> len(f.getvalue())
2269
```

#### 4.37 Writing fingerprints to an FPB file

In this section you'll learn how to write an FPB file.

The FPS file is a text format which was designed to be easy to read and write. The FPB file is a binary format which is designed to be fast to load. Internally it stores the fingerprints in a way which can be mapped directly to the arena data structure. However, writing this format yourself is not easy.

Instead, let chemfp do it for you. With the <code>chemfp.open\_fingerprint\_writer()</code> function, the difference between writing an FPS file and an FPB file is a matter of changing the extension. Here's a simple example:

Almost all you need to know is to use the ".fpb" extension instead of ".fps". The rest of this section goes into low-level details that might be enlightening, but probably aren't that directly useful for most people.

It's hard to show the content of the FPB file, because it is binary. I'll do a character dump to show the first 96 bytes:

```
% od -c simple.fpb
0000000 F P B 1 \r \n \0 \0 \r \0 \0 \0 \0 \0 \0
```

```
0000020
            М
                 Ε
                     Т
                          Α
                               #
                                                      b
                                                           i
                                                               t
                                                                             1
                                   n
                                        u
                                            m
                                                                    S
0000040
                 #
                    \0
                         \0
                              \0
                                  \0
                                           \0
                                                          R
                                                                                \0
           \n
                                       \0
                                                \0
                                                      Α
                                                               Ε
                                                                    N 002
                                                                            \0
                                           \0 001 002
0000060
                    \0
                              \0 002
                                                              \0
                                                                                \0
           \0
                \b
                         \0
                                       \0
                                                         \0
                                                                   \0
                                                                       \0
                                                                            \0
0000100
            Ζ
                 Z
                    \0
                         \0
                              \0
                                  \0
                                       \0
                                           \0 377 377
                                                          \0
                                                              \0
                                                                   \0
                                                                       \0
                                                                            \0
                                                                                \0
                \0
0000120
            Η
                    \0
                         \0
                              \0
                                  \0
                                       \0
                                           \0
                                                 Ρ
                                                      0
                                                          Ρ
                                                               C
                                                                   \0
                                                                       \0
                                                                            \0
                                                                                \0
  . . .
```

The first eight bytes are the file signature. Following that are a set of blocks, with eight bytes for the length, a four byte block type name, and then the block content. Here you can see the "META"data block, followed by the "AREN"a block containing the fingerprint data, followed by the start of the "POPC"ount block with the popcount index information.

That's probably a bit too much detail for you. I'll use chemfp to read the file and show the contents:

```
>>> from __future__ import print_function # Only for Python 2
>>> import chemfp
>>> reader = chemfp.open("simple.fpb")
>>> print(reader.metadata)
#num_bits=16
```

```
>>> from chemfp import bitops
>>> for id, fp in reader:
... print(id, "=>", bitops.hex_encode(fp))
...
third => 0102
second => 5a5a
first => ffff
```

Unlike the FPS format, the FPB format requires a *num\_bits* in the metadata. Since I didn't give the writer that information, it figured it out from the number of bytes in the first written fingerprint.

You can see that record order is different than the input order. While the FPS fingerprint writer preserves input order, the FPB writer will reorder the records by population count, so the records with fewer 'on' bits come first. It then creates a popcount index, to mark the start and end location of all of the fingerprints with a given popcount. This is used to pre-compute the popcount for a fingerprint, and quickly reject some of the similarity search space.

Use the *reorder* parameter to control if the fingerprints should be reordered. The default is True, and False will preserve the input order:

You might think it's a bit useless to preserve input order, because the performance won't be as fast. It's

actually proved useful for one project, where the targets were broken up into clusters, and cluster membership was done using a SEA analysis. Rather than have a few dozen separate fingerprint files, I stored everything in the same file (including duplicate fingerprints), and used a configuration file which specified the cluster name and its range in the file. This made it a lot easier to organize the data, and since there were only a few thousand fingerprints sublinear search performance wasn't needed.

The FPB fingerprint writer also has an *alignment* option. If you look very carefully at the character dump you can see that the fingerprints are eight byte aligned:

```
0000040
                  #
                     \0
                          \0
                               \0
                                    \0
                                        \0
                                              \0
                                                  \0
                                                        Α
                                                             R
                                                                  Ε
                                                                      N 002
                                                                               \0
                                                                                    \0
            \n
0000060
                               \0 002
            \0
                \b
                     \0
                          \0
                                        \0
                                             \0 001 002
                                                            \0
                                                                \0
                                                                     \0
                                                                          \0
                                                                               \0
                                                                                    \0
                                        \0
                                             \0 377
0000100
             Z
                 Z
                     \0
                          \0
                               \0
                                    \0
                                                     377
                                                            \0
                                                                \0
                                                                     \0
                                                                          \0
                                                                               \0
                                                                                    \0
0000120
             Н
                \0
                     \0
                          \0
                               \0
                                    \0
                                        \0
                                             \0
                                                   Ρ
                                                             Ρ
                                                                  C
                                                                     \0
                                                                          \0
                                                                               \0
                                                                                    \0
```

The "AREN" is the start of the arena block, the next four bytes ("002 0 0 0") are the number of bytes in a fingerprint, in this case 2. The four bytes after that ("b 0 0 0") are the number of bytes allocated for each fingerprint; "b" is the escape code for backspace, or ASCII 8. Yes, 8 bytes are used even though the fingerprints only have 2 bytes in them. This is because the FPB format expects to be able to use the 8 byte "POPC" assembly instruction, if available, because that has the fastest performance.

After the storage size field is a byte for the spacer length. The "002" means two NUL spacer characters follow. This is used to put the start of the first fingerprint on the eight byte boundary, so there will be no alignment issues with using the POPC instruction. (This is not that important for recent Intel processors, but Intel isn't the only processor in the world.)

Finally you see the fingerprints; the first fingerprint is "001 002", followed by six NUL characters to fill up the 8 bytes of storage, the second is "Z Z" followed by six more NUL pad characters, etc.

If you are really working with a two byte fingerprint, then six NUL characters is likely a waste of space. You can ask chemfp to use a two byte alignment instead:

giving:

```
% od -c simple.fpb
0000000
             F
                  Ρ
                      В
                            1
                               \r
                                    \n
                                         \0
                                              \0
                                                   \r
                                                        \0
                                                            \0
                                                                 \0
                                                                      \0
                                                                           \0
                                                                                \0
                                                                                    \0
0000020
                  Ε
                       Τ
                            Α
                                #
                                     n
                                               m
                                                        b
                                                             i
                                                                  t
                                                                       S
                                                                                 1
                                                                                      6
                                          u
0000040
            \n 017
                     \0
                          \0
                               \0
                                    \0
                                                             R
                                                                  Ε
                                                                       N 002
                                                                                \0
                                                                                     \0
                                         \0
                                              \0
                                                  \0
                                                         Α
0000060
            \0 002
                     \0
                          /0
                               \0
                                    \0 001 002
                                                    Ζ
                                                         Ζ
                                                           377 377
                                                                       Η
                                                                           \0
                                                                                \0
                                                                                     \0
0000100
            \0
                \0
                      \0
                          \0
                                Ρ
                                     0
                                               С
                                                  \0
                                                        \0
                                                            \0
                                                                 \0
                                                                      \0
                                                                           \0
                                                                                \0
                                                                                     \0
```

If you stare at it long enough you'll see that the storage size is now two bytes, and that the fingerprints are arranged without any padding. (Actually, since chemfp's two byte popcount uses character pointers, you could even use 1 byte alignment without a performance hit. But all this will do is save you at most one byte of spacer.)

Going in the other direction, it's possible to specify up to 256 bytes of alignment. This is far beyond any conceivable use. Even the AVX instructions need only 256 bits, or 32 byte alignment, and that's not a requirement, only a performance optimization to avoid a cache line split.

(If some future instruction set needs a larger alignment then the FPB format acquire a new block type which provides the right alignment.)

#### 4.38 Specify the output fingerprint format

In this section you'll learn about the format option to the fingerprint writer.

By default <code>chemfp.open\_fingerprint\_writer()</code> uses the destination filename's extension to determine if it should write an FPS file (".fps"), a gzip compressed FPS file (".fps.gz"), a zstandard compressed FPS file (".fps.zst") or an FPB file (".fpb"). If it doesn't recognize the extension, or if the filename is None (to write to stdout) then it will assume the FPS format.

If the destination is a file-like object then things become a bit more complicated. If the object has a name attribute, which is the case with real file objects, then that will be examined for any known extension. That's why the following writes the output in fps.gz format:

```
>>> import chemfp
>>> f = open("example.fps.gz", "wb") # must be in binary mode!
>>> writer = chemfp.open_fingerprint_writer(f)
>>> writer.write_fingerprint("ABC", b"\0\0\0\0")
>>> writer.close()
>>> open("example.fps.gz", "rb").read() # must be in binary mode!
b"\x1f\x8b\x08\x08K\xfc\xbb^\x02\xffexample.fps\x00S ... mode deleted
>>>
>>> import gzip
>>> print(gzip.open("example.fps.gz").read())
b'#FPS1\n000000000\tABC\n'
>>> print(gzip.open("example.fps.gz").read().decode("utf8"))
#FPS1
00000000
ABC
```

There's a large amount of magic behind the scenes to connect the filename in the Python open() call to the chemfp output format.

The other solution is to just tell it which format to use, with the *format* parameter. For example, if you want to send the output to stdout in gzip compressed FPS format then do:

```
writer = chemfp.open_fingerprint_writer(None, format="fps.gz")
```

If you want to save an FPB file to a BytesIO instance then do:

```
from io import BytesIO
f = BytesIO()
writer = chemfp.open_fingerprint_writer(f, format="fpb")
```

And if you really want to save to a file with an ".fpb" extension but have it as an FPS file, then do:

```
writer = chemfp.open_fingerprint_writer("really_an_fps_file.fpb", format="fps")
```

But that would be silly.

# 4.39 Merging multiple structure-based fingerprint sources

In this section you'll learn how to merge multiple fingerprint scores into a single file, and include the full list of source filenames.

The structure-based fingerprint readers include a source filename in the metadata:

```
>>> from __future__ import print_function # Only for Python 2
>>> import chemfp
>>> filename = "Compound_099000001_099500000.sdf.gz"
>>> reader = chemfp.read_molecule_fingerprints("RDKit-MACCS166", filename)
>>> print(reader.metadata)
#num_bits=166
#type=RDKit-MACCS166/2
#software=RDKit/2019.09.1 chemfp/3.4
#source=Compound_099000001_099500000.sdf.gz
#date=2020-05-13T13:57:58
```

If you have a single input file and a single output file then you can save the reader to an FPS or FPB file directly:

```
>>> reader.save("example.fpb")
>>> reader.close()
```

Strictly speaking, the close() is rarely necessary as the garbage collector will close the file during finalization. Still, it's good practice to close file, and to use a context manager to ensure that the file is always closed. Here's what that looks like:

```
>>> with chemfp.read_molecule_fingerprints("RDKit-MACCS166", filename) as reader:
... reader.save("example.fpb")
```

However you create it, the output file will have the original metadata:

```
>>> arena = chemfp.open("example.fpb")
>>> print(arena.metadata)
#num_bits=166
#type=RDKit-MACCS166/2
#software=RDKit/2019.09.1 chemfp/3.4
#source=Compound_099000001_099500000.sdf.gz
#date=2020-05-13T13:58:42
```

What happens if you want to want to merge multiple files? How does the output fingerprint file get the correct metadata?

I'll demonstrate the problem by computing fingerprints from two structure files. I'll get the fingerprint type and ask it to create a metadata instance:

The problem is that I also want to include the filenames as source fields in the metadata. The fingerprint type doesn't have this information. Instead, I'll them in through the *sources* parameter, which takes a string or a list of strings:

```
>>> metadata = fptype.get_metadata(sources=filenames)
>>> print(metadata)
#num_bits=166
#type=RDKit-MACCS166/2
#software=RDKit/2019.09.1 chemfp/3.4
#source=Compound_099000001_099500000.sdf.gz
#source=Compound_048500001_049000000.sdf.gz
#date=2020-05-13T14:00:34
```

What remains is to pass this metadata to the fingerprint writer, then loop through the structure filenames to compute the fingerprints and send them to the writer:

```
>>> with chemfp.open_fingerprint_writer("example.fpb", metadata=metadata) as writer:
... for filename in filenames:
... with fptype.read_molecule_fingerprints(filename) as reader:
... writer.write_fingerprints(reader)
...
```

Here's a quick check to see that the metadata was saved correctly:

```
>>> print(chemfp.open("example.fpb").metadata)
#num_bits=166
#type=RDKit-MACCS166/2
#software=RDKit/2019.09.1 chemfp/3.4
#source=Compound_099000001_099500000.sdf.gz
#source=Compound_048500001_049000000.sdf.gz
#date=2020-05-13T14:00:34
```

If your toolkit can't parse one of the records then it will raise an exception. You likely want it to ignore errors, which you can do with the *errors* option to *chemfp.read\_molecule\_fingerprints()*. The final code for this section looks like:

# 4.40 Merging multiple fingerprint files

In this section you'll learn how to make a modified copy of a metadata instance.

The previous section merged multiple structure-based fingerprints, and used the fingerprint type to get the correct metadata instance.

What if you want to merge several existing fingerprint files, and those use a fingerprint type that chemfp doesn't understand? In that case there is no chemfp fingerprint type, and therefore no <code>get\_metadata()</code> method to call. Instead, you'll need some other way to make a <code>chemfp.Metadata</code> instance.

I'll work through a solution, and start by using sdf2fps to extract the PubChem/CACTVS fingerprints from two PubChem SD files:

```
% sdf2fps --pubchem Compound_099000001_099500000.sdf.gz -o Compound_099000001_099500000.
% sdf2fps --pubchem Compound_048500001_049000000.sdf.gz -o Compound_048500001_049000000.
% head -7 Compound_099000001_099500000.fps | fold
#FPS1
#num_bits=881
#type=CACTVS-E_SCREEN/1.0 extended=2
#software=CACTVS/unknown
#source=Compound 099000001 099500000.sdf.gz
#date=2020-05-13T14:03:21
0030148379203c034f13080015c0acee2a00410104ac4004101b851d261b10065f03ab8f29a41106
% head -7 Compound 048500001 049000000.fps | fold
#FPS1
#num_bits=881
#type=CACTVS-E_SCREEN/1.0 extended=2
#software=CACTVS/unknown
#source=Compound_048500001_049000000.sdf.gz
#date=2020-05-13T14:03:34
48500020
```

Of course you could just ignore the header data, which is what the following does:

```
import chemfp
filenames = ["Compound_099000001_099500000.fps", "Compound_048500001_049000000.fps"]
with chemfp.open_fingerprint_writer("merged_pubchem.fps") as writer:
   for filename in filenames:
     with chemfp.open(filename) as reader:
     writer.write_fingerprints(reader)
```

but then you'll be left with no metadata in the FPS header:

While you could do that, the metadata keeps track of potentially useful information, so it's better to add it.

For that matter, metadata usually isn't useful until some time after the fingerprints are generated. People tend to put off writing code until it's needed, but by then it's too late. I've tried to make chemfp's API easy, to encourage people to add the right metadata from the start.

There are a couple of ways to add the right metadata. The classic way is to make your own <code>chemfp.Metadata</code> with the right values:

```
>>> metadata = chemfp.Metadata(num_bits=881, type="CACTVS-E_SCREEN/1.0 extended=2",
... software="CACTVS/unknown", sources=["Compound_099000001_099500000.sdf.gz",
... "Compound_048500001_049000000.sdf.gz"])
>>> print(metadata)
#num_bits=881
#type=CACTVS-E_SCREEN/1.0 extended=2
#software=CACTVS/unknown
#source=Compound_099000001_099500000.sdf.gz
#source=Compound_048500001_049000000.sdf.gz
```

The downside is this requires knowing all of the fields beforehand. Another option is to *copy* the metadata from the first fingerprint file, and ask the *copy()* to use a new list of sources:

```
>>> from __future__ import print_function # Only for Python 2
>>> import chemfp
>>> reader = chemfp.open("Compound_099000001_099500000.fps")
>>> metadata = reader.metadata.copy()
>>> metadata.sources
['Compound_099000001_099500000.sdf.gz']
>>> metadata = reader.metadata.copy(sources=[
        u"Compound_099000001_099500000.sdf.gz",
        u"Compound_048500001_049000000.sdf.gz"])
>>> print(metadata)
#num_bits=881
#type=CACTVS-E_SCREEN/1.0 extended=2
#software=CACTVS/unknown
#source=Compound 099000001 099500000.sdf.gz
#source=Compound_048500001_049000000.sdf.gz
#date=2020-05-13T14:03:21
```

Now to put the pieces together. I'll make one pass through the fingerprint files to get the sources, and then another pass to generate the output. If you only have a handful of files then this works nicely:

```
>>> from __future__ import print_function # Only for Python 2
>>> import chemfp
>>> filenames = ["Compound_099000001_099500000.fps", "Compound_048500001_049000000.fps"]
>>> sources = []
>>> for filename in filenames:
... with chemfp.open(filename) as reader:
... sources.extend(source.metadata.sources)
...
>>> sources
['Compound_048500001_049000000.sdf.gz', 'Compound_048500001_049000000.sdf.gz']
>>> metadata = reader.metadata.copy(sources=sources) # use the last reader
>>> print(metadata)
#type=CACTVS-E_SCREEN/1.0 extended=2
#software=CACTVS/unknown
```

This code assumes that the fingerprints are compatible, that is, that the fingerprints are the same size, and the fingerprint types and other metadata fields are compatible. The next section shows how to detect if there are compatibility problems.

#### 4.41 Check for metadata compatibility problems

In this section you'll learn how to detect compatibility mismatches between two metadata instances, and between a metadata and a fingerprint.

In the previous section you learned how to merge multiple fingerprint files, which all happened to have the same fingerprint type. What happens if they are different types?

There are actually a few possible problems:

- the fingerprint lengths are different (very bad)
- the fingerprint types are different (probably bad)
- the software is from different versions (probably okay)

The <code>chemfp.check\_metadata\_problems()</code> function compares two metadata objects and returns a list of possible problems:

```
>>> from __future__ import print_function # Only for Python 2
>>> import chemfp
>>> rdkit_metadata = chemfp.get_fingerprint_type("RDKit-MACCS166").get_metadata()
>>> openeye_metadata = chemfp.get_fingerprint_type("OpenEye-MACCS166").get_metadata()
>>> problems = chemfp.check_metadata_problems(rdkit_metadata, openeye_metadata)
>>> len(problems)
2
>>> for problem in problems:
... print(problem)
...
WARNING: query has fingerprints of type 'RDKit-MACCS166/2' but
target has fingerprints of type 'OpenEye-MACCS166/3'
INFO: query comes from software 'RDKit/2020.03.1 chemfp/3.4' but
target comes from software 'OEGraphSim/2.4.3 (20191016) chemfp/3.4'
```

In this case the fingerprint types are different, but since the fingerprint lengths are the same it's not an error, only a warning. The software field is also not identical, but as that's not so significant it's listed as "info".

The returned problem objects are chemfp. ChemFPProblem() instances, which have useful attributes:

```
>>> for problem in problems:
... print("Problem:")
... print(" severity:", problem.severity)
... print(" category:", problem.category)
... print(" description:", problem.description)
...

Problem:
severity: warning
category: type mismatch
description: query has fingerprints of type 'RDKit-MACCS166/2' but target has_
-fingerprints of type 'OpenEye-MACCS166/3'

Problem:
severity: info
category: software mismatch
description: query comes from software 'RDKit/2020.03.1 chemfp/3.4' but target comes_
-from software 'OEGraphSim/2.4.3 (20191016) chemfp/3.4'
```

The idea is that the category text won't change, so your code can figure out what's going on, while the description is subject to change and hopefully improvement. The severity is one of "info", "warning" and "error".

A chemfp. ChemFPProblem is derived from Exception, so you can raise it directly if you want:

```
>>> for problem in chemfp.check_metadata_problems(rdkit1_metadata, rdkit2_metadata):
... if problem.severity == "error":
... raise problem
...
Traceback (most recent call last):
   File "<stdin>", line 3, in <module>
chemfp.ChemFPProblem: ERROR: query has 512 bit fingerprints but target has 1024 bit__
fingerprints
```

You might have noticed that the error message uses the words "query" and "target". Chemfp is designed around similarity searches, so I expect the default to compare query metadata to target metadata.

On the other hand, the previous section merged multiple fingerprint files, where "query" and "target" don't make sense. Instead, you can give alternative names via the query\_name and target\_name parameters:

I'll use this to update the code from the previous section to raise an exception on errors, print warnings to stderr, and do nothing about "info" problems, and add a MACCS fingerprint file to the list of files to process, so I can show what happens if there's a problem:

```
from __future__ import print_function # Only for Python 2
import sys
import chemfp
filenames = ["Compound 099000001 099500000.fps",
             "Compound 048500001 049000000.fps",
             "chebi_maccs.fps"]
# Create the correct metadata with all of the sources from all of the files.
metadata = None
sources = []
for filename in filenames:
    with chemfp.open(filename) as reader:
        if metadata is None:
            metadata = reader.metadata.copy()
            first_filename = filename
            # Check for compatibility problems
            for problem in chemfp.check_metadata_problems(metadata, reader.metadata,
                                                           repr(first_filename),
                                                           repr(filename)):
                if problem.severity == "error":
                    raise problem
                elif problem.severity == "warning":
                    sys.stderr.write(str(problem) + "\n")
        sources.extend(reader.metadata.sources)
if metadata is not None:
  metadata = metadata.copy(sources=sources)
# Merge the files using the new metadata
with chemfp.open_fingerprint_writer("merged_pubchem.fps", metadata=metadata) as writer:
   for filename in filenames:
        with chemfp.open(filename) as reader:
            writer.write_fingerprints(reader)
```

When I run that code with the mismatched fingerprint types, I get the error message:

I then removed the chebi\_maccs.fps and manually changed the fingerprint type in Compound\_048500001\_049000000.fps, so I could demonstrate what a warning message looks like:

```
WARNING: 'Compound_099000001_099500000.fps' has fingerprints of type
'CACTVS-E_SCREEN/1.0 extended=2' but 'Compound_048500001_049000000.fps'
has fingerprints of type 'CACTVS-E_SCREEN/1.0 extended=DIFFERENT_VALUE'
Traceback (most recent call last):
File "/Users/dalke/cvses/cfp-3x/docs/x.py", line 23, in <module>
    raise problem
chemfp.ChemFPProblem: ERROR: 'Compound_099000001_099500000.fps' has
881 bit fingerprints but 'chebi_maccs.fps' has 166 bit fingerprints
```

(In case you're wondering what the type string means, those are the actual CACTVS parameters that PubChem uses, according to the CACTVS author, Wolf-Dietrich Ihlenfeldt.)

Lastly, sometimes the query is a simple byte string. There's not really much to compare, but you use <code>chemfp.check\_fingerprint\_problems()</code> to see if the fingerprint length is compatible with a metadata instance:

```
>>> import chemfp
>>> metadata = chemfp.get_fingerprint_type("RDKit-MACCS166").get_metadata()
>>> chemfp.check_fingerprint_problems(b"\0\0\0\0", metadata)
[ChemFPProblem('error', 'num_bytes mismatch', 'query contains 4
bytes but target has 21 byte fingerprints')]
```

The *simsearch* command-line tool uses this function to check if the query fingerprint, which is entered as hex as a command-line parameter, is compatible with the target fingerprints.

# 4.42 How to write very large FPB files

In this section you'll learn how to write an FPB file even when fingerprint data is so large that the intermediate data doesn't all fit into memory at once.

By default the FPB format will reorder the fingerprints to be in popcount order. (Use reorder=False option to preserve the input order.) This requires intermediate storage in order to sort all of the records. By default the writer will use memory for this, but the implementation may require about two to three times as much memory as the raw fingerprint size.

That is, if you have 50 million fingerprints, with 1024 bits per fingerprint, plus 10 bytes for the name, then the fingerprint arena requires about 6 GiB of memory, plus 0.5 GiB for the ids, and another  $\sim$ 1 GiB for the id lookup table.

That calculation gives the minimum amount of memory needed. The actual implementation may preallocate up to twice as much memory as the current size, in order to handle growth gracefully, and there is some additional overhead. You may be left with the case where you have 12 GiB of RAM, and where the final FPB file is only 8 GiB in size, but where the intermediate storage requires 15 GiB of RAM.

Or you may want to build that data set on a machine with 6 GiB of RAM, and copy the result over to the production machine with a lot more memory.

If that happens, then use the  $max\_spool\_size$  option to specify the maximum number of bytes to store in memory before switching to temporary files for additional storage. This should be about 1/3 of the available RAM because there can be two different temporary file "spools", each of which can use up to  $max\_spool\_size$  bytes of RAM.

For example, the following will use at most about 4 GiB of RAM:

```
writer = chemfp.open_fingerprint_writer(
   "pubchem.fpb", max_spool_size = 2 * 1024 * 1024 * 1024)
```

Note: do not make this too small. The merge step opens all of the temporary files in order to make the final FPB output file. If you specify a spool size of 50 MiB then you'll end up creating several hundred files for PubChem, which may exceed the resource limits for the number of open file descriptors for a process. When that happens you'll get an exception like:

```
IOError: [Errno 24] Too many open files
```

Where does the FPB writer store the temporary files? It uses Python's tempfile module to create the temporary files in a directory. Quoting from that documentation, "The default directory is chosen from a platform-dependent list, but the user of the application can control the directory location by setting the TMPDIR, TEMP or TMP environment variables."

Environment variables give one way to specify an alternate directory. Or you can specify it directly using the tmpdir parameter, as in:

```
writer = chemfp.open_fingerprint_writer(
    "pubchem.fpb", max_spool_size = 2 * 1024 * 1024 * 1024,
    tmpdir = "/scratch")
```

This can be very important on some cluster machines with a small local /tmp but a large networked scratch disk.

# 4.43 FPS fingerprint writer errors

In this section you'll learn how the FPS fingerprint writer handles errors, and how to change the error handling behavior.

It's hard but not impossible to have the FPS writer raise an exception:

The FPS file format simply doesn't support tab characters in the indentifier, nor newline characters, for that matter. It also doesn't allow empty identifiers.

As you saw, the default error action is to raise an exception.

Sometimes it's okay to ignore errors. For example, you might process a large number of structures, where you know that a few of them have missing, or poorly formed, identifiers, and where it's okay to omit those records.

The *errors* parameter can be used to change the error handler. The value of "report" tells the parser to skip failing record and write an error message written to stderr. The value of "ignore" simply skips the record:

```
>>> writer = chemfp.open_fingerprint_writer(None, errors="report")
#FPS1
>>> writer.write_fingerprint("", b"\0\0\0\0")
ERROR: Unable to write a fingerprint with an empty identifier, file '<stdout>', line 1, u record #1. Skipping.
>>>
>>> writer = chemfp.open_fingerprint_writer(None, errors="ignore")
#FPS1
>>> writer.write_fingerprint("", b"\0")
>>> writer.write_fingerprint("Tab\tHere", b"\0")
```

Granted, this feature isn't so important for FingerprintWriter.write\_fingerprint() because catching the exception isn't hard to do. It's a bit more useful for bulk conversions with FingerprintWriter. write\_fingerprints(), like:

Note that the FPB writer ignores the errors parameter and treats all errors as "strict".

# 4.44 FPS fingerprint writer location

In this section you'll learn how to get information like the number of lines and number of records written to an FPS file.

I'll start by saying that this feature isn't all that useful. It exists because of parallelism to the toolkit structure writers, and I wanted to experiment to see if it could be useful in the future.

The FPS fingerprint writer has a location attribute. This can be used to get some information about the state of the output writer. The most basic is the output filename. If the output is None or an unnamed file object then a fake filename will be used:

```
>>> import chemfp
>>> writer = chemfp.open_fingerprint_writer("example.fps")
>>> writer.location.filename
'example.fps'
>>> writer = chemfp.open_fingerprint_writer(None)
#FPS1
```

```
>>> writer.location.filename
'<stdout>'
```

At this point the signature line has been written, so the file is at line 1, but no record have been written:

```
>>> writer.location.lineno
1
>>> writer.location.recno
0
>>> writer.location.output_recno
0
```

Each of these values is incremented by one after adding a valid record:

```
>>> writer.write_fingerprint("FP001", b"\xA0\xFE")
a0fe    FP001
>>> writer.location.lineno
2
>>> writer.location.recno
1
>>> writer.location.output_recno
1
```

If however the record is invalid then the recno will increase by one because it's the number of records sent to the writer, but the other values do not increase because they only change when a record is written successfully:

```
>>> writer.write_fingerprint("", b"\xAO\xFE")
Traceback (most recent call last):
    File "<stdin>", line 1, in <module>
    File "chemfp/fps_io.py", line 550, in write_fingerprint
        raise_tb(err[0], err[1])
    File "chemfp/fps_io.py", line 475, in _fps_writer_gen
        location)
    File "chemfp/io.py", line 87, in error
        _compat.raise_tb(ParseError(msg, location), None)
    File "<string>", line 1, in raise_tb
chemfp.ParseError: Unable to write a fingerprint with an empty identifier, file '<stdout>
        ', line 2, record #2
>>> writer.location.lineno
2
>>> writer.location.recno
2
>>> writer.location.output_recno
1
```

This is perhaps more clearly shown if I try to write four records at one, where two contain errors, and where I've asked the writer to "report" errors rather than raise an exception:

```
>>> metadata = chemfp.Metadata(type="Experiment/1", software="AndrewDalke/1")
>>> writer = chemfp.open_fingerprint_writer(None, metadata=metadata, errors="report")
#FPS1
#type=Experiment/1
```

```
#software=AndrewDalke/1
>>> writer.location.lineno
3
>>> writer.location.output_recno
0
>>> writer.write_fingerprints( [("A", b"\0\0"), ("\t", b"\0\1"), ("", b"\0\2"), ("B", b"\0\3")] )
0000 A
ERROR: Unable to write an identifier containing a tab: '\t', file '<stdout>', line 4,u"\crecord #2. Skipping.
ERROR: Unable to write a fingerprint with an empty identifier, file '<stdout>', line 4,u"\crecord #3. Skipping.
0003 B
>>> writer.location.recno
4
>>> writer.location.output_recno
2
>>> writer.location.lineno
5
```

There are three lines in the header; the signature, the type line, and the software line. I tried to write four fingerprints, but two were invalid. It wrote the valid fingerprint "A" to stdout, report the two invalid records to stderr, and write the valid fingerprint "B" to stdout. Thus, two records were actually output, which is why output\_recno is 2, while four records were sent to the writer, which is why recno is 4. The three header lines and the two lines of output give five lines of output, so the final lineno is 5.

In case you hadn't figured it out, the location information is used to make the exception and error message. That explains why both of the error reports say the error is on "line 4"; that's the line that would have been output if there were no error.

Note that the FPB writer does not have a location, and it ignores the location parameter.

# 4.45 MACCS dependency on hydrogens

In this section you'll learn how the RDKit MACCS fingerprints differ if there are explicit or implicit hydrogens.

Note: A goal of this is to show that MACCS key generation isn't as easy as you might think it is!

One of my long-term goals is to get a good cross-toolkit implementation of the MACCS keys. It's very odd how the MACCS keys are the de facto fingerprint for cheminformatics, but the toolkits don't give the same answers. Over the years, I've found bugs or incomplete definitions in all of the toolkits I've looked at, which I've reported and have since been fixed.

If you use RDKit, Open Babel, or CDK then your toolkit implements MACCS keys that were derived from the ones that Greg Landrum developed for RDKit. The portable portion uses hand-translated SMARTS definitions for most of the MACCS key definitions. A couple keys, like key 125 ("at least two aromatic rings") cannot be represented as SMARTS. RDKit had special code for these definitions, but Open Babel does not.

Even with a portable SMARTS definition, I would expect to see some differences between the toolkits, if only because they have different aromaticity models. One toolkit might call something an aromatic ring,

while another says it's aliphatic.

Unfortunately, the SMARTS patterns used in those programs give different results if you have explicit hydrogens or implicit hydrogens. I'll demonstrate with using RDKit, because that has a *reader\_arg* to specify if I want to remove hydrogens from the input structure or not. (Here "remove" means to make them implicit.)

I'll use RDKit twice to read the first molecule from a file and compute the RDKit fingerprint; the first time I keep the hydrogens and the second time I remove them:

```
>>> import chemfp
>>> from chemfp import bitops
>>> filename = "Compound_099000001_099500000.sdf.gz"
>>> fptype = chemfp.get_fingerprint_type("RDKit-MACCS166")
>>>
>>> with_h_reader = fptype.read_molecule_fingerprints(filename,
... reader_args={"removeHs": False})
>>> with_h_id, with_h_fp = next(with_h_reader)
>>> with_h_id, bitops.hex_encode(with_h_fp)
('99000039', '000004000000300001c4004e93e1b053dce16f6e1f')
>>>
>>> without_h_reader = fptype.read_molecule_fingerprints(filename,
... reader_args={"removeHs": True})
>>> without_h_id, without_h_fp = next(without_h_reader)
>>> without_h_id, bitops.hex_encode(without_h_fp)
('99000039', '000004000000300001c0004e9361b051dce1676e1f')
```

If you look closely you'll see that they have two different fingerprints! I'll make it easier to see by reporting the bits which are only in one or the other fingerprint:

```
>>> with_h_bits = set(bitops.byte_to_bitlist(with_h_fp))
>>> without_h_bits = set(bitops.byte_to_bitlist(without_h_fp))
>>> sorted(with_h_bits - without_h_bits) # only with hydrogens
[74, 111, 121, 147]
>>> sorted(without_h_bits - with_h_bits) # only without hydrogens
[]
```

The molecule with explicit hydrogens sets four more bits than the one with implicit hydrogens.

Why is that? The RDKit (and hence Open Babel and CDK) definitions often use "\*" to match an atom, when the corresponding MACCS definition is supposed to exclude hydrogens. A hydrogen-independent version would use "[!#1]" instead. By default RDKit removes normal explicit hydrogens, so this isn't usually a problem. As far as I can tell, Open Babel always removes them from an SD file, so again this isn't really a problem. (Well, except for hydrogens with an explicit isotope number.)

The list [74, 111, 121, 147] are bit numbers. The corresponding keys are 75, 112, 122, and 148. I looked at how key 122 is defined in various sources:

```
Definitions for key 112 (bit 111)
    MACCS: AA(A)(A)A
    RDKit: *~*(~*)(~*)~*
    OpenBabel: *~*(~*)(~*)~*
    CDK: *~*(~*)(~*)~*
    chemfp's RDMACCS-*: [!#1]~*(~[!#1])~[!#1]
    O'Donnell: *~*(~*)(~*)~*
```

("O'Donnell" here comes from Table A.4 of TJ O'Donnell's Design and Use of Relational Databases in Chemistry.)

If you know SMARTS you can see how an explicit H will lead to a different match than an implicit one, except for chemfp's own attempt at making a cross-toolkit MACCS implementation. I'll test out RDMACCS-RDKit, which is chemfp's implementation of the MACCS 166 fingerprint using RDKit:

```
>>> chemfp_maccs = chemfp.get_fingerprint_type("RDMACCS-RDKit")
>>>
>>> with_h_reader = chemfp_maccs.read_molecule_fingerprints(filename,
... reader_args={"removeHs": False})
>>> with_h_id, with_h_fp = next(with_h_reader)
>>> with_h_id, bitops.hex_encode(with_h_fp)
('99000039', '000004000000300001c00004e9361b051dce1676e1f')
>>>
>>> without_h_reader = chemfp_maccs.read_molecule_fingerprints(filename,
... reader_args={"removeHs": True})
>>> without_h_id, without_h_fp = next(without_h_reader)
>>> without_h_id, bitops.hex_encode(without_h_fp)
('99000039', '000004000000300001c0004e9361b051dce1676e1f')
>>>
>>>
>>> with_h_fp == without_h_fp
True
```

What a relief that they are the same!

If you want to use the OEChem, Open Babel, or CDK-based RDMACSS implementations, the corresponding fingerprint type names are "RDMACCS-OpenEye", "RDMACCS-OpenBabel", or "RDMACCS-CDK" respectively, and the command-line option for *oe2fps*, *ob2fps* and *cdk2fps* is --rdmaccs.

WARNING: the RDMACCS fingerprints have not been fully validated! Validation is hard. A chemfp goal is to make that easier.

To finish, I was curious about the differences in RDKit's native MACCS166 implementation across all of the records in the file, so I wrote some code. It's a direct evolution of the code you already saw. (Note: for Python 2 I use itertools.izip() as a replacement for the generator-based zip() in Python 3.)

```
from __future__ import print_function # Only for Python 2
import itertools
from collections import Counter
import chemfp
from chemfp import bitops

zip = getattr(itertools, "izip", zip) # Support Python2 and Python3

filename = "Compound_099000001_099500000.sdf.gz"
with_h_fingerprints = chemfp.read_molecule_fingerprints(
    "RDKit-MACCS166", filename, reader_args={"removeHs": False})
without_h_fingerprints = chemfp.read_molecule_fingerprints(
    "RDKit-MACCS166", filename, reader_args={"removeHs": True})

extra_with_h = Counter()
extra_without_h = Counter()
num_records = 0
for (id1, with_h_fp), (id2, without_h_fp) in zip(with_h_fingerprints,
```

```
without_h_fingerprints):
   num records += 1
   assert id1 == id2, (id1, id2)
   if with_h_fp != without_h_fp:
       with_h_keys = set(bitno+1 for bitno in bitops.byte_to_bitlist(with_h_fp))
       without_h_keys = set(bitno+1 for bitno in bitops.byte_to_bitlist(without_h_fp))
       only_with_h = sorted(with_h_keys - without_h_keys)
       only_without_h = sorted(without_h_keys - with_h_keys)
       print(id1, "with:", only_with_h, "without:", only_without_h)
       extra_with_h.update(only_with_h)
       extra_without_h.update(only_without_h)
print("\nNumber of records:", num_records)
print("\nCounts that were only with hydrogens:")
for key, count in extra with h.most common():
   print("\nCounts that were only without hydrogens:")
for key, count in extra_without_h.most_common():
```

In case you were wondering, the report summary starts:

```
Number of records: 10826
Counts that were only with hydrogens:
  112 6851
  150 3345
  144 3209
  122 2807
  138 2767
  66 2763
  148 2372
  155 2311
  126 684
  76 682
 75 412
 81 407
  128 344
  118 173
  156 96
  107 24
  90 18
  108 15
  129 9
  132 2
```

Now you can see why I used key 112 in my elaboration - it's the one that causes the most problems!

#### 4.46 Create similarity search web service

In this section you'll learn how to write a simple WSGI-based web service which does a similarity search given an SDF record.

I found it a bit difficult to write this section because few people will write a WSGI service directly. I think most people use Django, but a Django example would require several different files to make it work. There are other web frameworks I could use, like Flask, but I eventually decided to limit myself to what's available in the standard library, that is, the wsgiref module.

I'm going to write a WSGI server named "simple\_server.py" which takes an SDF record as input and returns the top 5 hits from a specified database. If there's a GET request then the result is a simple form. The form sends a POST request to the server, with the SDF record in the query parameter q.

By the way, if the target fingerprint data set is large then you should use an FPB file to get the best startup performance.

Let's get started. The first part is a comment about what the code does and some imports:

```
# This is a very simple fingerprint search server.
# I call it 'simple_server.py'.
#
# Usage: simple_server <fingerprint_filename> [port]
#
# A GET to the server (default uses port 80) returns a simple form.
# The form has a single text box, to paste the SDF query or queries.
# The POST query variable 'q' contains the SDF contents.
# The search finds the nearest 5 queries for each query record.
# The result is a simple list of query ids and its matches.
import argparse
from wsgiref.simple_server import make_server
import cgi
import chemfp
```

The server will return an HTML form for a GET request:

```
# Create a simple form.
def query_form(environ, start_response):
    status = '200 OK' # HTTP Status
    headers = [('Content-type', 'text/html')] # HTTP Headers
    start_response(status, headers)

# The returned object is going to be printed.
    # Must be a byte string for Python 3.
    return [b"""<html>
<head>
    <title>Simple fingerprint search</title>
</head>
<body>
<form method="POST">
Paste in SDF records(s):<br/>
<textarea name="q" type="text" rows="20" cols="80"></textarea><br/>
    /> textarea><br/>
    /> textarea><br/>
    /> /*
```

```
<button type="submit">Search!</button>
</form>
</body>
</html>
"""]
```

I'll use the argparse module to handle the command-line arguments:

The heavy work is in the 'main' function. It starts with some setup to load the fingerprints and make sure the fingerprint type is available:

```
def main():
    args = parser.parse_args()

# Load the arena, get the type, and make sure I can handle the type.
    arena = chemfp.load_fingerprints(args.filename)
    print("Loaded %s fingerprints from %r" % (len(arena), args.filename))

type = arena.metadata.type
    if type is None:
        parser.error("File %r does not contain a fingerprint type" % (args.filename,))

try:
        fptype = chemfp.get_fingerprint_type(type)
    except KeyError as err:
        parser.error(str(err))
```

It then defines the WSGI app, which returns the query\_form() for a GET request, or processes the form for a POST request. I think the embedded comments explain things enough:

```
# ... continue the 'main' function ...
# This is the WSGI app, defined inside of main

def fingerprint_search_app(environ, start_response):
    # Is this a GET or a POST? If a GET, return the query form
    if environ["REQUEST_METHOD"] != "POST":
        return query_form(environ, start_response)

# Get the query data from the POST
    post_env = environ.copy()
    post = cgi.FieldStorage(
        fp=environ['wsgi.input'],
```

```
environ=post_env,
           keep blank values=True,
       )
       q = post.getfirst("q", "")
       # The underlying toolkit code may require "\n" instead of "\n" strings.
       q = q.replace("\r\n", "\n")
       \# For each input record, do a search, get the results, and build up the output
\hookrightarrow lines.
       # Ignore any records that can't be parsed.
       output = ["Search against %r using k=5 and threshold=0.0\n\n" % (args.filename,)]
       # The next three lines use chemfp to convert the record into a
       # fingerprint, do the search for the top 5 hits, get the ids
       # and scores for the hits, and make the output text.
       for query_id, fp in fptype.read_molecule_fingerprints_from_string(q, "sdf", __
→errors="ignore"):
           results = arena.knearest_tanimoto_search_fp(fp, k=5, threshold=0.0)
           text = " ".join( "%s (%.3f)" % (id, score) for (id, score) in results.get_
→ids_and_scores())
           output.append("%s => %s\n" % (query_id, text))
       # Return the results in plain text.
       status = '200 OK' # HTTP Status
       headers = [('Content-type', 'text/plain')] # HTTP Headers
       start_response(status, headers)
       # Python 3 requires bytes, not strings, so convert to UTF-8
       return [line.encode("utf8") for line in output]
```

The main function ends with some code to start the WSGI server using the correct port:

```
# ... end of the 'main' function ...
# Make the server and run it. (Use ~C to kill it.)
httpd = make_server('', args.port, fingerprint_search_app)
print("Serving fingerprint search on port %s..." % (args.port,))
httpd.serve_forever()
```

Finally, code to start things rolling:

```
if __name__ == "__main__":
    main()
```

I'll start the server using a ChEBI-derived data set:

```
% python simple_server.py rdkit_chebi.fps
Loaded 106965 fingerprints from 'rdkit_chebi.fps'
Serving fingerprint search on port 8080...
```

then direct the browser to  $\rm http://127.0.0.1:8080/$ . I pasted in the first three records from ChEBI itself, pressed "Search!", and got the result:

```
Search against 'rdkit_chebi.fps' using k=5 and threshold=0.0

=> CHEBI:90 (1.000) CHEBI:15600 (1.000) CHEBI:23053 (1.000) CHEBI:33992 (1.000)

-- CHEBI:58994 (1.000)

=> CHEBI:165 (1.000) CHEBI:4999 (1.000) CHEBI:36612 (1.000) CHEBI:132827 (0.977)

-- CHEBI:15994 (0.944)

=> CHEBI:598 (1.000) CHEBI:52595 (1.000) CHEBI:144315 (0.965) CHEBI:17389 (0.716)

-- CHEBI:134138 (0.716)
```

I don't think I'll continue this WSGI example in future documentation as that API is too low-level and seldom used by web developers. If you think otherwise, let me know.

## Fingerprint family and type examples

This chapter describes how to use the fingerprint family and fingerprint type API added in chemfp 2.0.

## 5.1 Fingerprint families and types

In this section you'll learn the difference between a fingerprint family and a fingerprint type. You will need  $Compound\_099000001\_099500000.sdf.gz$  from PubChem to work though all of the examples.

Chemfp distinguishes between a "fingerprint family" and a "fingerprint type." A fingerprint family describes the general approach for doing a fingerprint, like "the OpenEye path-based fingerprint method", while a fingerprint type describes the specific parameters used for a given approach, such as "the OpenEye path-based fingerprint method using path lengths between 0 and 5 bonds, where the atom types are based on the atomic number and aromaticity, and the bond type is based on the bond order, mapped to a 256 bit fingerprint."

(In object-oriented terms, a fingerprint family is the class and a fingerprint type is an instance of the class.)

I'll use chemfp.get\_fingerprint\_family() to get the FingerprintFamily for "OpenEye-Path". On the laptop where I'm writing the documentation, this resolves to what chemfp calls version "2":

```
>>> from __future__ import print_function # Only needed in Python 2
>>> import chemfp
>>> family = chemfp.get_fingerprint_family("OpenEye-Path")
>>> family
FingerprintFamily(<OpenEye-Path/2>)
```

The fingerprint family can be called like a function to return a FingerprintType. If you call it with no arguments it will use the defaults parameters for that family. I'll do that, then use  $get\_type()$  to get the fingerprint type string, which is the canonical representation of the fingerprint family name, version, and parameters:

```
>>> fptype = family()
>>> fptype.get_type()
'OpenEye-Path/2 numbits=4096 minbonds=0 maxbonds=5

atype=Arom|AtmNum|Chiral|EqHalo|FCharge|HvyDeg|Hyb btype=Order|Chiral'
```

A 4096 bit fingerprint is rather large. I'll make a new OpenEye-Path fingerprint type, but this time with only 256 bits. That's small enough that the resulting fingerprint will fit on a line of documentation. All of the other parameters will be unchanged:

This time I used  $FingerprintType.get\_metadata()$  to give information about the fingerprint. This returns a new Metadata instance which describes the fingerprint type, and if you print a Metadata it displays the metadata information as an FPS header.

Once you have the fingerprint type you can create fingerprints, including directly from a SMILES string, as in the following:

```
>>> from chemfp import bitops
>>> fp = fptype.parse_molecule_fingerprint("c1ccccc10", "smistring")
>>> bitops.hex_encode(fp)
'0012250160901000080c002810000400201000900054880442000e8040201000'
```

and from a structure file:

```
>>> for id, fp in fptype.read_molecule_fingerprints("Compound_099000001_099500000.sdf.gz

"):
... print(id, bitops.hex_encode(fp))
... if int(id) > 99003537: break
...

99000039 b7f1ff7cf3f377ebf37ff6ffefb5c9fffe69fffbfdfefedf77f5dffee0f7f907
99000230 ffd5f775cffbd790f97f5f797fbefdcd3fcf73efdf5fdfbf7fe6d9df60fd5303
99002251 ba5ff7e5fbfd3ce77decb9aef9a5b5eef7615cd3df5efc0e7f78effc7dfd9a07
99003537 defbbff7f4f57f6fbdfffab35ffddb77fef7dfddfafffffddff77fedeb97f107
99003538 defbbff7f4f57f6fbdfffab35ffddb77fef7dfddfafffffddff77fedeb97f107
```

For more examples of using get\_metadata see Merging multiple structure-based fingerprint sources.

Even though I used the fingerprint family to get the type, I did that more for pedagogical reasons. Most times you can get the fingerprint type directly using <code>chemfp.get\_fingerprint\_type()</code>. You can call it using a fingerprint type string or by passing in the parameters in the optional second parameter::

```
>>> fptype = chemfp.get_fingerprint_type("OpenEye-Path numbits=256")
>>> fptype = chemfp.get_fingerprint_type("OpenEye-Path", {"numbits": 256})
```

See get\_fingerprint\_type() and get\_type() for examples on how to use get\_fingerprint\_type.

## 5.2 Fingerprint family

In this section you'll learn about the attributes and methods of a fingerprint family.

The get\_fingerprint\_family() function takes the fingerprint family name (with or without a version) and returns a FingerprintFamily instance:

```
>>> import chemfp
>>> family = chemfp.get_fingerprint_family("RDKit-Fingerprint")
```

It will raise a ValueError if you ask for a fingerprint family or version which doesn't exist:

```
>>> chemfp.get_fingerprint_family("whirl")
Traceback (most recent call last):
 File "<stdin>", line 1, in <module>
 File "chemfp/__init__.py", line 1996, in get_fingerprint_family
   return _family_registry.get_family(family_name)
 File "chemfp/types.py", line 1258, in get_family
chemfp.types.FingerprintTypeValueError: Unknown fingerprint type 'whirl'
>>> chemfp.get_fingerprint_family("RDKit-Fingerprint/1")
Traceback (most recent call last):
 File "<stdin>", line 1, in <module>
 File "chemfp/__init__.py", line 1996, in get_fingerprint_family
   return _family_registry.get_family(family_name)
 File "chemfp/types.py", line 1258, in get_family
   raise err
chemfp.types.FingerprintTypeValueError: Unable to use RDKit-Fingerprint/1: This version
→of RDKit does not support the RDKit-Fingerprint/1 fingerprint
```

The fingerprint family has several attributes to ask for the name or parts of the name:

```
>>> family
FingerprintFamily(<RDKit-Fingerprint/2>)
>>> family.name
'RDKit-Fingerprint/2'
>>> (family.base_name, family.version)
('RDKit-Fingerprint', '2')
```

It also has a toolkit attribute, which is the underlying chemfp toolkit that can create molecules for this fingerprint:

```
>>> family.toolkit
<module 'chemfp.rdkit_toolkit' from 'chemfp/rdkit_toolkit.pyc'>
>>> family.toolkit.name
'rdkit'
```

See the chapter Toolkit API examples for many examples of how to use a toolkit.

The  $get\_defaults()$  method returns the default arguments used to create a fingerprint type, which is handy when you've forgotten what all of the arguments are:

```
>>> family.get_defaults()
{'minPath': 1, 'maxPath': 7, 'fpSize': 2048, 'nBitsPerHash': 2,
'useHs': 1, 'fromAtoms': None, 'branchedPaths': 1, 'useBondOrder': 1}
```

If you call the family as a function, you'll get a *FingerprintType*. You can check to see that the fingerprint type's keyword arguments match the defaults:

```
>>> fptype = family()
>>> fptype.fingerprint_kwargs
{'minPath': 1, 'maxPath': 7, 'fpSize': 2048, 'nBitsPerHash': 2,
'useHs': 1, 'fromAtoms': None, 'branchedPaths': 1, 'useBondOrder': 1}
```

Call the fingerprint family with keyword arguments to use something other than the default parameters:

```
>>> fptype = family(fpSize=1024, maxPath=6)
>>> fptype.fingerprint_kwargs
{'minPath': 1, 'maxPath': 6, 'fpSize': 1024, 'nBitsPerHash': 2,
'useHs': 1, 'fromAtoms': None, 'branchedPaths': 1, 'useBondOrder': 1}
```

If you have the keyword arguments as a dictionary you can use the "\*\*" syntax to apply the dictionary as keyword arguments, but I think it's clearer to call the <code>FingerprintFamily.from\_kwargs()</code> method to create the fingerprint type:

```
>>> kwargs = {"fpSize": 512, "maxPath": 5}
>>> fptype = family(**kwargs) # Acceptable
>>> fptype.get_type()
'RDKit-Fingerprint/2 minPath=1 maxPath=5 fpSize=512 nBitsPerHash=2 useHs=1'
>>> fptype = family.from_kwargs(kwargs) # Better
>>> fptype.get_type()
'RDKit-Fingerprint/2 minPath=1 maxPath=5 fpSize=512 nBitsPerHash=2 useHs=1'
```

(Currently family(\*\*kwargs) forwards the call to family.from\_kwargs(kwargs) so there is a slight performance advantage to using from\_kwargs().)

Sometimes the fingerprint parameters come from a string, for example, from command-line arguments or a web form. In chemfp a dictionary of text keys and values are called "text settings". The fingerprint family has a helper function to process them and create a kwargs dictionary with the correct data types as values:

```
>>> family.get_kwargs_from_text_settings({
...     "fpSize": "128",
...     "nBitsPerHash": "1",
... })
{'minPath': 1, 'maxPath': 7, 'fpSize': 128, 'nBitsPerHash': 1,
'useHs': 1, 'fromAtoms': None, 'branchedPaths': 1, 'useBondOrder': 1}
```

Note: This method is not as advanced as the *corresponding code in the toolkit Format API*. It does not understand namespaces. It will also raise an exception if called with an unsupported parameter:

```
>>> family.get_kwargs_from_text_settings({
    ... "unsupported parameter": "-12.34",
    ... })

Traceback (most recent call last):
    ...

chemfp.types.FingerprintTypeValueError: Unsupported fingerprint parameter name
    'unsupported parameter'
```

If you have text settings then you probably want to call chemfp.  $get\_fingerprint\_type\_from\_text\_settings()$  directly instead of going through the fingerprint family:

```
>>> fptype = chemfp.get_fingerprint_type_from_text_settings("RDKit-Fingerprint",
... {"fpSize": "512", "nBitsPerHash": "3", "maxPath": "6"})
>>> fptype.get_type()
'RDKit-Fingerprint/2 minPath=1 maxPath=6 fpSize=512 nBitsPerHash=3 useHs=1'
```

See Create a fingerprint using text settings for more examples of how to use this function.

## 5.3 Fingerprint family discovery

In this section you'll learn how to get the available fingerprint families, both as a set of name strings and a list of FingerprintFamily instances.

Even though chemfp knows about the OpenEye fingerprints, those fingerprints might not be available on your system if you don't have OEChem and OEGraphSim installed and licensed. Chemfp has a discovery system which will probe to see which fingerprint types are available and determine their version numbers.

If you just want the available family names, use chemfp.get\_fingerprint\_family\_names():

```
>>> import chemfp
>>> chemfp.get_fingerprint_family_names()
{'OpenBabel-FP3', 'OpenEye-MDLScreen', 'CDK-Daylight',
'CDK-GraphOnly', 'OpenBabel-ECFPO', 'CDK-Pubchem', 'OpenEye-Path',
'RDMACCS-OpenEye', 'CDK-FCFP2', 'CDK-FCFP4', 'RDMACCS-RDKit',
'OpenBabel-MACCS', 'CDK-Hybridization', 'RDKit-SECFP',
'RDKit-Morgan', 'OpenEye-Circular', 'ChemFP-Substruct-OpenEye',
'CDK-AtomPairs2D', 'CDK-ECFP0', 'CDK-Substructure', 'CDK-ECFP2',
'ChemFP-Substruct-RDKit', 'RDMACCS-OpenBabel', 'RDMACCS-CDK',
'CDK-Extended', 'RDKit-AtomPair', 'OpenEye-SMARTSScreen',
'OpenBabel-ECFP4', 'OpenEye-Tree', 'OpenBabel-ECFP2', 'CDK-EState',
'OpenBabel-ECFP10', 'CDK-FCFP6', 'RDKit-Avalon', 'OpenBabel-FP2',
'RDKit-Torsion', 'CDK-ECFP4', 'CDK-ECFP6', 'RDKit-MACCS166',
'CDK-ShortestPath', 'ChemFP-Substruct-OpenBabel', 'CDK-MACCS',
'OpenBabel-FP4', 'ChemFP-Substruct-CDK', 'OpenBabel-ECFP8',
'RDKit-Pattern', 'OpenEye-MoleculeScreen', 'OpenEye-MACCS166',
'CDK-FCFP0', 'OpenBabel-ECFP6', 'RDKit-Fingerprint'}
```

Bear in mind that this might take a few seconds to run, since it will try to load the Python packages for each supported toolkit. (Once done, that list is cached so subsequent calls are fast.)

You can ask the function to return only those fingerprints generated from a given toolkit then use the toolkit name parameter. The following returns the Open Babel fingerprints:

```
>>> chemfp.get_fingerprint_family_names(toolkit_name="openbabel")
{'OpenBabel-ECFP8', 'OpenBabel-ECFP4', 'OpenBabel-MACCS',
'OpenBabel-FP3', 'OpenBabel-ECFP2', 'OpenBabel-ECFP10',
'OpenBabel-ECFP0', 'OpenBabel-FP2', 'RDMACCS-OpenBabel',
'ChemFP-Substruct-OpenBabel', 'OpenBabel-ECFP6', 'OpenBabel-FP4'}
```

The function returns a set of base names, which don't contain the version information. Most likely you want to sort it before displaying it more nicely:

```
>>> from __future__ import print_function # Only needed in Python 2
>>> for name in sorted(chemfp.get_fingerprint_family_names()):
```

```
print(name)
CDK-AtomPairs2D
CDK-Daylight
CDK-ECFP0
CDK-ECFP2
CDK-ECFP4
CDK-ECFP6
CDK-EState
CDK-Extended
CDK-FCFP0
CDK-FCFP2
CDK-FCFP4
CDK-FCFP6
CDK-GraphOnly
CDK-Hybridization
CDK-MACCS
CDK-Pubchem
CDK-ShortestPath
CDK-Substructure
ChemFP-Substruct-CDK
ChemFP-Substruct-OpenBabel
ChemFP-Substruct-OpenEye
ChemFP-Substruct-RDKit
OpenBabel-ECFPO
OpenBabel-ECFP10
OpenBabel-ECFP2
OpenBabel-ECFP4
OpenBabel-ECFP6
OpenBabel-ECFP8
OpenBabel-FP2
OpenBabel-FP3
OpenBabel-FP4
OpenBabel-MACCS
OpenEye-Circular
OpenEye-MACCS166
OpenEye-MDLScreen
OpenEye-MoleculeScreen
OpenEye-Path
OpenEye-SMARTSScreen
OpenEye-Tree
RDKit-AtomPair
RDKit-Avalon
RDKit-Fingerprint
RDKit-MACCS166
RDKit-Morgan
RDKit-Pattern
RDKit-SECFP
RDKit-Torsion
RDMACCS-CDK
RDMACCS-OpenBabel
RDMACCS-OpenEye
```

```
RDMACCS-RDKit
```

I'll run chemfp in a configuration where only the OpenEye toolkits are available and show that chemfp only knows about the OEChem/OEGraphSim fingerprint types:

```
>>> from __future__ import print_function # Only needed in Python 2
>>> import chemfp
>>> print("\n".join(sorted(chemfp.get_fingerprint_family_names())))
ChemFP-Substruct-OpenEye
OpenEye-Circular
OpenEye-MACCS166
OpenEye-MDLScreen
OpenEye-MoleculeScreen
OpenEye-Path
OpenEye-Path
OpenEye-SMARTSScreen
OpenEye-Tree
RDMACCS-OpenEye
```

It's still possible to get a list of all fingerprint family names, including those which aren't actually available for the given Python installation, by setting the <code>include\_unavailable</code> parameter to True:

```
>>> print("\n".join(sorted(chemfp.get_fingerprint_family_names(include_

¬unavailable=True))))
CDK-AtomPairs2D
CDK-Daylight
CDK-ECFP0
CDK-ECFP2
CDK-ECFP4
CDK-ECFP6
CDK-EState
CDK-Extended
CDK-FCFP0
CDK-FCFP2
CDK-FCFP4
CDK-FCFP6
CDK-GraphOnly
CDK-Hybridization
CDK-KlekotaRoth
CDK-MACCS
CDK-Pubchem
CDK-ShortestPath
CDK-Substructure
ChemFP-Substruct-CDK
ChemFP-Substruct-OpenBabel
ChemFP-Substruct-OpenEye
ChemFP-Substruct-RDKit
OpenBabel-ECFPO
OpenBabel-ECFP10
OpenBabel-ECFP2
OpenBabel-ECFP4
OpenBabel-ECFP6
OpenBabel-ECFP8
```

```
OpenBabel-FP2
OpenBabel-FP3
OpenBabel-FP4
OpenBabel-MACCS
OpenEye-Circular
OpenEye-MACCS166
OpenEye-MDLScreen
OpenEye-MoleculeScreen
OpenEye-Path
OpenEye-SMARTSScreen
OpenEye-Tree
RDKit-AtomPair
RDKit-Avalon
RDKit-Fingerprint
RDKit-MACCS166
RDKit-Morgan
RDKit-Pattern
RDKit-SECFP
RDKit-Torsion
RDMACCS-CDK
RDMACCS-OpenBabel
RDMACCS-OpenEye
RDMACCS-RDKit
```

The list of base names is pretty useful, but sometimes you want more details, like the specific version number, and the default number of bits. The FingerprintFamily includes the attributes to get the name and version but it doesn't have a way to get the default number of bits. Instead, I'll use the FingerprintFamily to make a Fingerprint Type with the default parameters, then ask the new fingerprint type its number of bits.

This means I need a list of FingerprintFamily instances, which is conveniently available from chemfp. qet\_finqerprint\_families(). (Remember, this may take a few seconds the first time it's called, because it tries to load all of the available fingerprints. Once determined, this information is cached.)

As a result, you can make a list of all available fingerprint methods and their default number of bits with the following:

```
>>> for family in chemfp.get_fingerprint_families():
      print(family.name, family().num_bits)
. . .
CDK-AtomPairs2D/2.0 780
CDK-Daylight/2.0 1024
CDK-ECFP0/2.0 1024
CDK-ECFP2/2.0 1024
CDK-ECFP4/2.0 1024
CDK-ECFP6/2.0 1024
CDK-EState/2.0 79
CDK-Extended/2.0 1024
CDK-FCFP0/2.0 1024
CDK-FCFP2/2.0 1024
CDK-FCFP4/2.0 1024
CDK-FCFP6/2.0 1024
CDK-GraphOnly/2.0 1024
CDK-Hybridization/2.0 1024
```

```
CDK-MACCS/2.0 166
CDK-Pubchem/2.0 881
CDK-ShortestPath/2.0 1024
CDK-Substructure/2.0 307
ChemFP-Substruct-CDK/1 881
ChemFP-Substruct-OpenBabel/1 881
ChemFP-Substruct-OpenEye/1 881
ChemFP-Substruct-RDKit/1 881
OpenBabel-ECFP0/1 4096
OpenBabel-ECFP10/1 4096
OpenBabel-ECFP2/1 4096
OpenBabel-ECFP4/1 4096
OpenBabel-ECFP6/1 4096
OpenBabel-ECFP8/1 4096
OpenBabel-FP2/1 1021
OpenBabel-FP3/1 55
OpenBabel-FP4/1 307
OpenBabel-MACCS/2 166
OpenEye-Circular/2 4096
OpenEye-MACCS166/3 166
OpenEye-MDLScreen/1 896
OpenEye-MoleculeScreen/1 896
OpenEye-Path/2 4096
OpenEye-SMARTSScreen/1 896
OpenEye-Tree/2 4096
RDKit-AtomPair/2 2048
RDKit-Avalon/1 512
RDKit-Fingerprint/2 2048
RDKit-MACCS166/2 166
RDKit-Morgan/1 2048
RDKit-Pattern/4 2048
RDKit-SECFP/1 2048
RDKit-Torsion/2 2048
RDMACCS-CDK/2 166
RDMACCS-OpenBabel/2 166
RDMACCS-OpenEye/2 166
RDMACCS-RDKit/2 166
```

The output here is a bit fancy. If you only want the version information then you could just look at the list, since a family's repr shows the versioned name:

```
>>> chemfp.get_fingerprint_families()
[FingerprintFamily(<CDK-AtomPairs2D/2.0>),
FingerprintFamily(<CDK-Daylight/2.0>),
FingerprintFamily(<CDK-ECFP0/2.0>),
FingerprintFamily(<CDK-ECFP2/2.0>),
FingerprintFamily(<CDK-ECFP4/2.0>),
FingerprintFamily(<CDK-ECFP6/2.0>),
FingerprintFamily(<CDK-EState/2.0>),
FingerprintFamily(<CDK-Extended/2.0>),
FingerprintFamily(<CDK-FCFP0/2.0>),
FingerprintFamily(<CDK-FCFP0/2.0>),
FingerprintFamily(<CDK-FCFP0/2.0>),
```

```
FingerprintFamily(<CDK-FCFP4/2.0>),
FingerprintFamily(<CDK-FCFP6/2.0>),
FingerprintFamily(<CDK-GraphOnly/2.0>),
FingerprintFamily(<CDK-Hybridization/2.0>),
FingerprintFamily(<CDK-MACCS/2.0>),
FingerprintFamily(<CDK-Pubchem/2.0>),
FingerprintFamily(<CDK-ShortestPath/2.0>),
FingerprintFamily(<CDK-Substructure/2.0>),
FingerprintFamily(<ChemFP-Substruct-CDK/1>),
FingerprintFamily(<ChemFP-Substruct-OpenBabel/1>),
FingerprintFamily(<ChemFP-Substruct-OpenEye/1>),
FingerprintFamily(<ChemFP-Substruct-RDKit/1>),
FingerprintFamily(<OpenBabel-ECFP0/1>),
FingerprintFamily(<OpenBabel-ECFP10/1>),
FingerprintFamily(<OpenBabel-ECFP2/1>),
FingerprintFamily(<OpenBabel-ECFP4/1>),
FingerprintFamily(<OpenBabel-ECFP6/1>),
FingerprintFamily(<OpenBabel-ECFP8/1>),
FingerprintFamily(<OpenBabel-FP2/1>),
FingerprintFamily(<OpenBabel-FP3/1>),
FingerprintFamily(<OpenBabel-FP4/1>),
FingerprintFamily(<OpenBabel-MACCS/2>),
FingerprintFamily(<OpenEye-Circular/2>),
FingerprintFamily(<OpenEye-MACCS166/3>),
FingerprintFamily(<OpenEye-MDLScreen/1>),
FingerprintFamily(<OpenEye-MoleculeScreen/1>),
FingerprintFamily(<OpenEye-Path/2>),
FingerprintFamily(<OpenEye-SMARTSScreen/1>),
FingerprintFamily(<OpenEye-Tree/2>),
FingerprintFamily(<RDKit-AtomPair/2>),
FingerprintFamily(<RDKit-Avalon/1>),
FingerprintFamily(<RDKit-Fingerprint/2>),
FingerprintFamily(<RDKit-MACCS166/2>),
FingerprintFamily(<RDKit-Morgan/1>),
FingerprintFamily(<RDKit-Pattern/4>),
FingerprintFamily(<RDKit-SECFP/1>),
FingerprintFamily(<RDKit-Torsion/2>),
FingerprintFamily(<RDMACCS-CDK/2>),
FingerprintFamily(<RDMACCS-OpenBabel/2>),
FingerprintFamily(<RDMACCS-OpenEye/2>),
FingerprintFamily(<RDMACCS-RDKit/2>)]
```

On the other hand, that's a rather dense block of text.

Use the toolkit\_name parameter to get only those fingerprint families for a given toolkit:

```
>>> chemfp.get_fingerprint_families(toolkit_name="rdkit")
[FingerprintFamily(<ChemFP-Substruct-RDKit/1>),
FingerprintFamily(<RDKit-AtomPair/2>),
FingerprintFamily(<RDKit-Avalon/1>),
FingerprintFamily(<RDKit-Fingerprint/2>),
FingerprintFamily(<RDKit-MACCS166/2>),
```

```
FingerprintFamily(<RDKit-Morgan/1>),
FingerprintFamily(<RDKit-Pattern/4>),
FingerprintFamily(<RDKit-SECFP/1>),
FingerprintFamily(<RDKit-Torsion/2>),
FingerprintFamily(<RDMACCS-RDKit/2>)]
```

Finally, use chemfp.has\_fingerprint\_family() to test if a fingerprint family is available:

```
>>> chemfp.has_fingerprint_family("OpenEye-Tree")
True
>>> chemfp.has_fingerprint_family("OpenEye-Tree/2")
True
>>> chemfp.has_fingerprint_family("OpenEye-Tree/1")
False
```

It understands both version and unversioned names.

## 5.4 get\_fingerprint\_type() and get\_type()

In this section you'll learn how to get a fingerprint type given its type string, and how to specify fingerprint parameters as a dictionary.

The easiest way to get a specific FingerprintType is with chemfp.get\_fingerprint\_type():

```
>>> import chemfp
>>> fptype = chemfp.get_fingerprint_type("RDKit-Fingerprint")
>>> fptype
<chemfp.rdkit_types.RDKitFingerprintType_v2 object at 0x10cfedb10>
```

The fingerprint type has a  $FingerprintType.get\_type()$  method, which returns the canonical fingerprint type string:

```
>>> fptype.get_type()
'RDKit-Fingerprint/2 minPath=1 maxPath=7 fpSize=2048 nBitsPerHash=2 useHs=1'
```

This is canonical because chemfp ensures that all fingerprint type strings with the same parameter values have the same type string.

I left out the version number in the fingerprint name when I asked for the fingerprint, so chemfp gives me the most recent supported version. I could have included the version in the name, which is useful if you want to prevent a version mismatch between your data sets. If the version doesn't exist, the function will raise a ValueError:

I can also specify some or all of the parameters myself in the type string, instead of accepting the default values:

```
>>> fptype = chemfp.get_fingerprint_type("RDKit-Fingerprint fpSize=1024 maxPath=6")
>>> fptype.get_type()
'RDKit-Fingerprint/2 minPath=1 maxPath=6 fpSize=1024 nBitsPerHash=2 useHs=1'
```

You can also pass in the parameters as a Python dictionary, though you still need at least the base name of the fingerprint family:

```
>>> fp_kwargs = {
... "maxPath": 6,
... "fpSize": 512,
... }
>>> fptype = chemfp.get_fingerprint_type("RDKit-Fingerprint", fp_kwargs)
>>> fptype.get_type()
'RDKit-Fingerprint/2 minPath=1 maxPath=6 fpSize=512 nBitsPerHash=2 useHs=1'
```

If a parameter is specified in both the type string and the dictionary then the dictionary value will be used:

```
>>> fptype = chemfp.get_fingerprint_type("RDKit-Fingerprint fpSize=1024 minPath=2",
... {"fpSize": 128})
>>> fptype.get_type()
'RDKit-Fingerprint/2 minPath=2 maxPath=7 fpSize=128 nBitsPerHash=2 useHs=1'
```

# 5.5 Create a fingerprint using text settings

In this section you'll learn how to get a fingerprint type using text settings.

The fingerprint keywords arguments ("kwargs") are a dictionary whose keys are fingerprint parameter names and whose values are native Python objects for those parameters. Here is a fingerprint kwargs dictionary for the RDKit-Fingerprint:

```
{'maxPath': 7, 'fpSize': 2048, 'nBitsPerHash': 2, 'minPath': 1, 'useHs': 1}
```

Text settings are a dictionary where the dictionary keys are still parameter names but where the dictionary values are string-encoded parameter values. Here is the equivalent text settings for the above kwargs dictionary:

```
{'maxPath': '7', 'fpSize': '2048', 'nBitsPerHash': '2', 'minPath': '1', 'useHs': '1'}
```

A text settings dictionary typically comes from command-line parameters or a configuration file, where everything is a string. The fingerprint family has a method to convert text settings to kwargs:

```
>>> import chemfp
>>> family = chemfp.get_fingerprint_family("RDKit-Fingerprint")

(continues on next page)
```

```
>>> kwargs = family.get_kwargs_from_text_settings({"fpSize": "4096"})
>>> kwargs
{'minPath': 1, 'maxPath': 7, 'fpSize': 4096, 'nBitsPerHash': 2,
'useHs': 1, 'fromAtoms': None, 'branchedPaths': 1, 'useBondOrder': 1}
```

The kwargs can then be used to get the specified fingerprint type from the family:

```
>>> fptype = family.from_kwargs(kwargs)
>>> fptype
<chemfp.rdkit_types.RDKitFingerprintType_v2 object at 0x100f68610>
>>> fptype.get_type()
'RDKit-Fingerprint/2 minPath=1 maxPath=7 fpSize=4096 nBitsPerHash=2 useHs=1'
```

It's a bit tedious to go through all those steps to process some text settings. Instead, call chemfp. get\_fingerprint\_type\_from\_text\_settings():

The parameters in the text settings have priority should the fingerprint type string and the text settings both specify the same parameter name, as in this example where the fingerprint type string specifies a 1024 bit fingerprint while the text settings specifies a 4096 bit fingerprint:

At present there is no support for parameter namespaces, and unknown parameter names will raise an exception:

This may change in the future; let me know what's best for you.

For now, if you want to remove unexpected names from a dictionary then use the fingerprint family's  $get\_defaults()$  to get the default kwargs as a dictionary, and use the keys to filter out the unknown parameters:

```
>>> family = chemfp.get_fingerprint_family("RDKit-Fingerprint")
>>> defaults = family.get_defaults()
>>> defaults
{'minPath': 1, 'maxPath': 7, 'fpSize': 2048, 'nBitsPerHash': 2,
'useHs': 1, 'fromAtoms': None, 'branchedPaths': 1, 'useBondOrder': 1}
>>> settings = {"maxPath": "8", "unknown": "mystery"}
>>> new_settings = dict((k, v) for (k,v) in settings.items() if k in defaults)
>>> new_settings
{'maxPath': '8'}
```

## 5.6 FingerprintType properties and methods

In this section you'll learn about the *FingerprintType* properties and methods.

I'll start by getting CDK's Daylight-like fingerprint using the default parameters:

```
>>> fptype = chemfp.get_fingerprint_type("CDK-Daylight")
>>> fptype
<chemfp.cdk_types.CDKDaylightFingerprintType_v20 object at 0x100b5ddc0>
>>> fptype.get_type()
'CDK-Daylight/2.0 size=1024 searchDepth=7 pathLimit=42000 hashPseudoAtoms=0'
```

The "CDK-Daylight/2" is the fingerprint name, which is decomposed into the base\_name "CDK-Daylight" and the version "2":

```
>>> fptype.name
'CDK-Daylight/2.0'
>>> fptype.base_name, fptype.version
('CDK-Daylight', '2.0')
```

The number of bits for the fingerprint is  $num\_bits$ , and  $fingerprint\_kwargs$  is a fingerprint parameters as a dictionary of Python values:

```
>>> fptype.num_bits
1024
>>> fptype.fingerprint_kwargs
{'size': 1024, 'searchDepth': 7, 'pathLimit': 42000, 'hashPseudoAtoms': 0}
```

Each fingerprint type has a *toolkit*, which is the chemfp toolkit that can make molecules used as input to the fingerprint type. (This would be None if there were no toolkit.) Given a fingerprint type it's easy to figure out the *toolkit.name* of the toolkit it's associated with:

```
>>> fptype.toolkit.name
'cdk'
```

The *software* attribute gives information about the software used to generate the fingerprint. For RDKit, Open Babel, and CDK this is the same as the *toolkit.software* string. On the other hand, OpenEye distributes OEChem and OEGraphSim as two different libraries. These map quite naturally to chemfp's concepts of fingerprint type and toolkit, so the "software" field for its fingerprint type and toolkit differ:

```
>>> oefptype = chemfp.get_fingerprint_type("OpenEye-Tree")
>>> oefptype.software

(continues on next page)
```

```
'OEGraphSim/2.4.3 (20191016) chemfp/3.5'
>>> oefptype.toolkit.software
''OEChem/20191016'
```

Finally,  $FingerprintType.get\_fingerprint\_family()$  returns the fingerprint family for a given fingerprint type:

```
>>> fptype.get_fingerprint_family()
FingerprintFamily(<CDK-Daylight/2.0>)
```

## 5.7 Convert a structure record to a fingerprint

In this section you'll learn how to use a fingerprint type to convert a structure record into a fingerprint.

The FingerprintType method parse\_molecule\_fingerprint() parses a structure record and returns the fingerprint as a byte string. The following uses Open Babel to get the MACCS fingerprint for phenol:

The parameters to parse\_molecule\_fingerprint() are identical to the toolkit's parse\_molecule() function. For example, the following shows that the SMILES "Q" raises a chemfp.ParseError with the default errors mode, and returns None when errors is "ignore":

(While the error is ignored at the Python level, Open Babel writes a warning messages to stderr at the C++ level.)

See *Parse and create SMILES* for information about using parse\_molecule() and the distinction between "smistring", "smi" and other SMILES formats. See *Specify alternate error behavior* for more about the *errors* parameter.

## 5.8 Convert a structure record to an id and fingerprint

In this section you'll learn how to use a fingerprint type to extract the id from a structure record, convert the structure record into a fingerprint, and return the (id, fingerprint) pair.

The previous section showed how to convert a structure record into a fingerprint. Sometimes you'll also want the identifier. The FingerprintType method parse\_id\_and\_molecule\_fingerprint() does both in the same call.

(If the identifier is not present then the function may return None or the empty string, depending on the format and underlying implementation.)

The parameters to parse\_id\_and\_molecule\_fingerprint are identical to the *toolkit*. parse\_id\_and\_molecule() function. For example, the following shows the difference in using two different delimiter types in the reader\_args:

The  $id\_tag$  and errors parameters are also supported, though I won't give examples. See  $Read\ ids$  and  $molecules\ using\ an\ SD\ tag\ for\ the\ id$  to learn how to use the  $id\_tag$  and  $Specify\ a\ SMILES\ delimiter\ through\ reader\ args$  and  $Multi-toolkit\ reader\ args$  and  $writer\ args$  for examples of using  $reader\ args$ .

## 5.9 Make a specialized id and molecule fingerprint parser

In this section you'll learn how to make a specialized function for computing the fingerprints given many individual structure records.

Sometimes the structure input comes as a set of individual strings, with one record per string. For example, the input might come from a database query, where the cursor returns each field of each row as its own term, and you want to convert each of them into a fingerprint.

One way to do this through successive calls to FingerprintType.parse\_molecule\_fingerprint():

```
>>> from __future__ import print_function # Only needed in Python 2
>>> import chemfp
>>> from chemfp import bitops
>>>
>>> smiles_list = ["C", "O=O", "C#N"]
>>>
>>> fptype = chemfp.get_fingerprint_type("RDKit-MACCS166")
```

There is some overhead in this because the parameters, like *format* ("smistring" in this case) are (re)validated for each call, and sometimes extra work is done to ensure that the call is thread-safe. (The overhead is higher if there are complex reader args, and if the underlying fingerprinter is very fast.)

Another solution is to use make\_id\_and\_molecule\_fingerprinter\_parser() to create a specialized parser function for a given set of parameters. The parameters are only validated once, and the returned parser function takes only the record as input and returns the (id, fingerprint) pair:

The parameters to make\_id\_and\_molecule\_fingerprint\_parser are identical to toolkit. make\_id\_and\_molecule\_parser().

I'll use the new function to parse the smiles list from earlier:

For OpenEye-MACCS166, creating and using a specialized parser is about 10% faster than using the parse\_molecule\_fingerprint() when the query is isocane (C20H42). For OpenBabel-MACCS it's about 5%, for CDK-MACCS it's slighly less than 5%, and for RDKit-MACCS166 it's around 1%.

The performance differences are in part due to the performance differences of the SMILES parsers in the underlying toolkit and in part because of differences in how the toolkits handle parsing. Chemfp does not guarantee that the function returned by make\_id\_and\_molecule\_parser() may be called by different threads at the same time. (Instead, make a function for each thread.) This means the OEChem version re-use a single molecule object, which reduces some memory allocation overhead. While the RDKit and Open Babel implementations always create a new molecule each time, adding some overhead.

In addition, RDKit's native MACCS implementation maps key 1 to bit 1, while the other toolkits and chemfp map key 1 to bit 0. Chemfp normalizes RDKit-MACCS by shifting all of the bits left, and this translation code hasn't yet been optimized (though it appears to take only about 2% of the overall time).

You may have noticed that parse\_molecule\_fingerprint() there's a and make\_id\_and\_molecule\_fingerprint\_parser() but there isn't parse id and molecule fingerprint() or make molecule fingerprint parser(). This is simply a matter of time. I haven't needed those functions, they are quite easy to emulate given what's available, and I was getting bored of writing test cases.

Let me know if they would be useful for your code.

## 5.10 Read a structure file and compute fingerprints

In this section you'll learn how to use a fingerprint type to read a structure file, compute fingerprints for each one, and iterate over the resulting (id, fingerprint) pairs. You will need Compound 099000001 099500000.sdf.gz from PubChem.

The read\_molecule\_fingerprints() method of a FingerprintType reads a structure file and computes the fingerprint for each molecule. It will also extract the record identifier. It returns an iterator of the (id, fingerprint) pairs. For example, the following uses OEChem/OEGraphSim to compute the MACCS166 fingerprint for a PubChem file, and prints the identifier, the number of keys set in the fingerprint, and the hex-encoded fingerprint:

```
from __future__ import print_function # Only needed in Python 2
import chemfp
from chemfp import bitops

## Uncomment the fingerprint type you want to use.
fptype = chemfp.get_fingerprint_type("OpenEye-MACCS166")

#fptype = chemfp.get_fingerprint_type("RDKit-MACCS166")

#fptype = chemfp.get_fingerprint_type("OpenBabel-MACCS")

#fptype = chemfp.get_fingerprint_type("CDK-MACCS")

for id, fp in fptype.read_molecule_fingerprints("Compound_099000001_099500000.sdf.gz"):
    print("%s %3d %s" % (id, bitops.byte_popcount(fp), bitops.hex_encode(fp)))
```

The first few lines of chemfp output are:

```
99000039 46 00000400000300001c0404e93e19053dca06b6e1b

99000230 67 000000880100648f0445a7fe2aeab1738f2a5b7e1b

99002251 45 0000000001132000088404985e01152dca46b7e1b

99003537 44 00000000200020000156149a90e994938c30592e1b

99003538 44 00000000200020000156149a90e994938c30592e1b
```

However. in mostcases you should use  $_{
m the}$ top-level helper function chemfp. read molecule fingerprints(), which does the fingerprint type lookup and the call to read\_molecule\_fingerprints:

```
from __future__ import print_function # Only needed in Python 2
import chemfp
from chemfp import bitops
for id, fp in chemfp.read_molecule_fingerprints("CDK-MACCS",
```

```
"Compound_099000001_099500000.sdf.gz"):
print("%s %3d %s" % (id, bitops.byte_popcount(fp), bitops.hex_encode(fp)))
```

The helper function accepts both a type string, as shown here, and a Metadata object. On the other hand, the helper function does not support fingerprint kwargs, so in that case you have to go through the FingerprintType.

The read\_molecule\_fingerprints method takes the same parameters as the toolkit. read\_ids\_and\_molecules(), including id\_tag, errors, and location. I won't cover those details again here. Instead, see Read ids and molecules from an SD file at the same time.

## 5.11 Structure-based fingerprint reader location

In this section you'll learn more about the location attribute of the structure-based fingerprint iterator returned by read\_molecule\_fingerprints and read\_molecule\_fingerprints\_from\_string.

Four related functions implement structure-based fingerprint readers:

- chemfp.read\_molecule\_fingerprints()
- $\bullet \quad chemfp.read\_molecule\_fingerprints\_from\_string()\\$
- FingerprintType.read\_molecule\_fingerprints()
- $\bullet \ \ Fingerprint Type.read\_molecule\_fingerprints\_from\_string()$

They all return a FingerprintIterator. Just like with the BaseMoleculeReader classes, the FingerprintIterator has a location attribute that can be used to get more information about the internal reader state. The toolkit section has more details about how to get the current record number (see Location information: filename, record\_format, recno and output\_recno) and, if supported by the parser implementation for a format, the line number and byte ranges for the record (see Location information: record position and content).

It's also possible to get the current molecule object using the location's "mol" attribute. This isn't so important for the toolkit API since all of the molecule readers return the molecule object. It's more useful in the fingerprint iterator, which doesn't.

NOTE: accessing the molecule this way is somewhat slow, because it requires several Python function calls. It should mostly be used for error reporting; the following is meant as an example of use, and not a recommended best practice.

The following uses the location's mol to report the SMILES string for every molecule whose MACCS fingerprint sets at most 6 keys:

```
from __future__ import print_function # Only needed in Python 2
import chemfp
from chemfp import bitops

from openeye.oechem import OECreateSmiString, OEThrow, OEErrorLevel_Fatal
OEThrow.SetLevel(OEErrorLevel_Fatal) # Disable warnings

fptype = chemfp.get_fingerprint_type("OpenEye-MACCS166")
with fptype.read_molecule_fingerprints("Compound_099000001_0995000000.sdf.gz") as reader:
    location = reader.location
    for id, fp in reader:
```

The output from the above is:

```
99116624 6 C(C(C1)(C1)C1)(F)C1

99116625 6 C(C(C1)(C1)C1)(F)C1

99118955 6 C(C(C(C1)(C1)C1)(F)C1)(C(F)(F)F)(F)F

99118956 6 C(C(C(C1)(C1)C1)(F)C1)(C(F)(F)F)(F)F
```

The above code imports the OEChem toolkit to disable warnings about "Stereochemistry corrected on atom number", and to call OECreateSmiString directly.

While chemfp has no cross-platform method to silence warnings, it does have a cross-toolkit solution to generate the SMILES string, which is only slightly more complicated than using the native API.

I need to use the fingerprint type object to get the underlying "toolkit", which is a portability layer on top of the actual cheminformatics toolkit with functions to parse a string into a molecule and vice versa:

```
>>> import chemfp
>>> fptype = chemfp.get_fingerprint_type("OpenEye-MACCS166")
>>> fptype.toolkit
<module 'chemfp.openeye_toolkit' from 'chemfp/openeye_toolkit.py'>
>>> T = fptype.toolkit
>>> mol = T.parse_molecule("OC", "smistring")
>>> T.create_string(mol, "smistring")
'CO'
```

I'll use the toolkit's create\_string() method to make the SMILES string for each molecule which passes the filter:

```
from __future__ import print_function # Only needed in Python 2
import chemfp
from chemfp import bitops

fptype = chemfp.get_fingerprint_type("OpenEye-MACCS166")
T = fptype.toolkit

with fptype.read_molecule_fingerprints("Compound_099000001_0995000000.sdf.gz") as reader:
    location = reader.location
    for id, fp in reader:
        popcount = bitops.byte_popcount(fp)
        if popcount > 6:
            continue
        smiles = T.create_string(location.mol, "smistring")
            print("%s %3d %s" % (id, popcount, smiles))
```

When should you use a toolkit-specific API and when to use the portable one?

That depends on you. There's definitely a portability vs. performance tradeoff because the new create\_string function will always require an extra function call over the native API. If you work with

a given toolkit a lot then you're going to be more familiar with it than this brand new chemfp API. Plus, calling a function to create another function is somewhat unusual.

On the other hand, it's trivial to change the above code to work with any of the fingerprint types that chemfp supports.

## 5.12 Read fingerprints from a string containing structures

In this section you'll learn how to use a fingerprint type to read a string containing a set of structure records, compute fingerprints for each one, and iterate over the resulting (id, fingerprint) pairs.

The  $read\_molecule\_fingerprints\_from\_string()$  method of the FingerprintType takes as input a string containing structure records and returns an iterator over the (id, fingerprint) pairs.

In most cases you should use the top-level helper function *chemfp*. read\_molecule\_fingerprints\_from\_string(), which is slightly easier to call:

The helper function accepts both a type string, as shown here, and a Metadata object. The helper function does not support fingerprint kwargs so in that case you must go through the fingerprint type.

The method takes the same parameters as toolkit.read\_ids\_and\_molecules\_from\_string(), including the id\_tag, errors, location, and reader\_args. See Read from a string instead of a file for more about that function.

## 5.13 Structure-based fingerprint reader errors

In this section you'll learn how to use the *errors* option for the "read molecule fingerprints" functions, including how to use the experimental support for a callback error handler.

The four structure reader functions (chemfp.read\_molecule\_fingerprints(), chemfp. read\_molecule\_fingerprints\_from\_string(), FingerprintType.read\_molecule\_fingerprints(), and FingerprintType.read\_molecule\_fingerprints\_from\_string()) take the standard errors option. By default it is "strict", which means that it raises an exception when there are errors, and stops processing.

```
>>> from __future__ import print_function # Only needed in Python 2
>>> import chemfp
>>> from chemfp import bitops
>>> content = ("C methane\n" +
             "Q Q-ane\n" +
              "0=0 molecular oxygen\n")
>>> with chemfp.read_molecule_fingerprints_from_string(
             "RDKit-MACCS166", content, "smi") as reader:
     for (id, fp) in reader:
       print(id, bitops.hex_encode(fp))
[11:10:34] SMILES Parse Error: syntax error while parsing: Q
[11:10:34] SMILES Parse Error: Failed parsing SMILES 'Q' for input: 'Q'
Traceback (most recent call last):
 File "<stdin>", line 3, in <module>
       ... traceback lines omitted ...
 File "<string>", line 1, in raise_tb
chemfp.ParseError: RDKit cannot parse the SMILES 'Q', file '<string>', line 2, record
→#2: first line is 'Q Q-ane'
```

The default is "strict" because you should be the one to decide if you really want to ignore errors, not me. Specify errors="ignore" to ignore errors, or use "report" to have chemfp write its own error messages to stderr:

Of course, this depends on the underlying toolkit implementation. Some toolkit/format combinations don't let chemfp know there was an error, such as most of the OEChem-based formats.

## 5.14 Experimental error handler

In this section you'll learn about the experimental API for writing your own error handler.

In the previous section you learned about the "strict", "report", and "ignore" error handlers. What if you want something different? Chemfp has an experimental feature where the *errors* can be any object with the method "error(message, location)". You might send the results to a log file, or display it in a GUI, … or send it to a speech synthesizer and hear all of the error messages go by.

NOTE: This error handler API is experimental and may change in the future.

The following creates an error handler which counts the number of errors, and for each one reports the error number, the filename (which is "<string>" if the input is from a string), and the error message:

```
>>> class ErrorCounter(object):
      def __init__(self):
          self.num_errors = 0
      def error(self, message, location):
          self.num_errors += 1
          print("Failure #%d from file %r: %s" % (
                self.num errors, location.filename, message))
>>> error_handler = ErrorCounter()
>>> # ... use 'content' from the previous section
>>> with chemfp.read_molecule_fingerprints_from_string(
            "RDKit-MACCS166", content, "smi", errors=error_handler) as reader:
      for (id, fp) in reader:
. . .
          print(id, bitops.hex_encode(fp))
[11:13:56] SMILES Parse Error: syntax error while parsing: Q
[11:13:56] SMILES Parse Error: Failed parsing SMILES 'Q' for input: 'Q'
Failure #1 from file '<string>': RDKit cannot parse the SMILES 'Q'
```

Let me know if you use the API and have ideas for improvements.

The toolkit documentation includes another example of how to write an error handler.

## 5.15 Compute a fingerprint for a native toolkit molecule

In this section you'll learn how to compute a fingerprint given a toolkit molecule.

All of the previous sections assumed the inputs were structure record(s), either as a string or from a file. What if you already have a native toolkit molecule and want to compute its fingerprint? In that case, use the FingerprintType.compute\_fingerprint() method:

This can be useful when you want to compute multiple fingerprint types for the same molecule. For example, I'll compare Open Babel's MACCS implementation with chemfp's own MACCS implementation for Open Babel:

```
from future import print function # Only needed in Python 2
import chemfp
from chemfp import openbabel toolkit as T
from chemfp import bitops
fptype1 = chemfp.get_fingerprint_type("OpenBabel-MACCS")
fptype2 = chemfp.get_fingerprint_type("RDMACCS-OpenBabel")
with T.read_ids_and_molecules("Compound_099000001_099500000.sdf.gz") as reader:
   for id, mol in reader:
        fp1 = fptype1.compute_fingerprint(mol)
       fp2 = fptype2.compute_fingerprint(mol)
        if fp1 != fp2:
           bits1 = set(bitops.byte to bitlist(fp1))
            bits2 = set(bitops.byte_to_bitlist(fp2))
            print(id, "in OB:", sorted(bits1-bits2), "in RDMACCS:", sorted(bits2-bits1))
        else:
            print(id, "equal")
```

Almost half (7929 of 10826) of the output were lines of the form:

```
99000039 in OB: [] in RDMACCS: [124]
```

I was curious, so I investigated the differences. Key 125 (the MACCS keys start at 1 while chemfp bit indexing starts at 0) is defined as "Aromatic Ring > 1". Open Babel doesn't support this bit because it only allows key definitions based on SMARTS, and this query cannot be represented as SMARTS.

Note: compute\_fingerprint() is thread-safe. If an underlying chemistry toolkit object is not thread-safe then chemfp will duplicate that object before computing the fingerprint.

## 5.16 Fingerprint many native toolkit molecules

In this section you'll learn how to generate a fingerprint given many native toolkit molecules.

Sometimes you have a list of molecules and you want to compute fingerprints for each one. In the following I'll load 10826 molecules from an SD file using OEChem:

```
>>> import chemfp
>>>
    fptype = chemfp.get_fingerprint_type("OpenEye-MACCS166")
>>> T = fptype.toolkit
>>>
>>> with T.read_molecules("Compound_099000001_099500000.sdf.gz") as reader:
...    mols = [T.copy_molecule(mol) for mol in reader]
...
... various OEChem warnings omitted ...
>>> len(mols)
10826
```

NOTE: for performance reasons, some of the toolkit implementations will reuse a molecule object. I call toolkit.copy\_molecule() to force a copy of each one. A future version of chemfp will likely support a new reader\_args parameter to ask the reader implementation to always return a new molecule.

You know from the previous section how to compute the fingerprint one molecule at a time using FingerprintType.compute\_fingerprint():

```
>>> fps = [fptype.compute_fingerprint(mol) for mol in mols]
```

You can also process all of them at once using FingerprintType.compute\_fingerprints():

```
>>> fps = list(fptype.compute_fingerprints(mols))
```

The plural in the name compute\_fingerprints() is the hint that it can take multiple molecules. It returns a generator, so I used Python's list() to convert it to an actual list.

Why call compute\_fingerprints instead of compute\_fingerprint? The main reason is that it expresses your intent more clearly than setting up a for-loop. But to be honest, the original reason was that I expected it would be faster than calling the compute\_fingerprint many times, because the underlying code could skip some overhead.

By design, compute\_fingerprint is thread-safe, which means chemfp sometimes makes extra objects to keep that promise. On the other hand, compute\_fingerprints, which processes a sequential series of molecules, can reuse internal objects across the series instead of creating new ones. In principle this should be a bit faster. In practice, nearly all of the time is spent in generating the fingerprints. The overhead adds less than 1%.

## 5.17 Make a specialized molecule fingerprinter

In this section you'll learn how to make a specialized function to compute a fingerprint for a molecule. However, there is very little reason for you to use this function.

The FingerprintType.compute\_fingerprint() method is thread-safe. Some of the underlying toolkit implementations can use code which isn't thread-safe. For example, OEGraphSim writes its fingerprint information to an OEFingerPrint instance, and replaces its previous value. A thread-safe implementation would make a new OEFingerPrint for each call, which a non-thread-safe implementation could reuse it, and save a small bit of allocation overhead.

The FingerprintType.make\_fingerprinter() method returns a non-thread-safe fingerprinter function, which is potentially faster beause it doesn't need to keep the thread-safe promise.

Here's an example of the two APIs. First, a bit of preamble to get things set up with a couple of molecules:

```
>>> import chemfp
>>> from chemfp import bitops
>>>
>>>
prom chemfp import bitops
>>>
>>> fptype = chemfp.get_fingerprint_type("OpenBabel-FP2")
>>> mol1 = fptype.toolkit.parse_molecule("c1ccccc10", "smistring")
>>> mol2 = fptype.toolkit.parse_molecule("0=0", "smistring")
```

The thread-safe API calls the compute fingerprint() method:

```
>>> bitops.byte_popcount(fptype.compute_fingerprint(mol1))
12
>>> bitops.byte_popcount(fptype.compute_fingerprint(mol2))
1
```

The non-thread-safe version uses make\_fingerprinter to create a new fingerprinter function, which I've assigned to calc\_fingerprint, and then call directly:

```
>>> calc_fingerprint = fptype.make_fingerprinter()
>>> bitops.byte_popcount(calc_fingerprint(mol1))
12
>>> bitops.byte_popcount(calc_fingerprint(mol2))
1
```

The keen-eyed will note that I could have written the first code as:

```
>>> compute_fingerprint = fptype.compute_fingerprint
>>> bitops.byte_popcount(compute_fingerprint(mol1))
12
>>> bitops.byte_popcount(compute_fingerprint(mol2))
1
```

and gotten the same answer, which means there is little API need for a special "make\_fingerprinter()" function, except for performance.

I timed the performance differences using the following:

```
import chemfp
import time
def main():
   fptype = chemfp.get_fingerprint_type("OpenBabel-FP2")
   T = fptype.toolkit
   with T.read_molecules("Compound_099000001_099500000.sdf.gz") as reader:
     mols = list(reader)
   compute_fingerprint = fptype.compute_fingerprint
   calc_fingerprint = fptype.make_fingerprinter()
   t1 = time.time()
   fps1 = [compute_fingerprint(mol) for mol in mols]
   t2 = time.time()
   fps2 = [calc_fingerprint(mol) for mol in mols]
   t3 = time.time()
   assert fps1 == fps2
   print("compute_fingerprint():", t2-t1)
   print("make fingerprinter():", t3-t2)
   print("ratio:", (t2-t1)/(t3-t2))
   print("1/ratio:", (t3-t2)/(t2-t1))
main()
```

With the Open Babel 3.0.0 fingerprints, the performance improvement was roughly 10%.

Toolkit API examples

This chapter gives many examples of how to use the toolkit API. For an overview of the toolkit API functions, see <code>chemfp.toolkit</code>. For details about actual toolkit implementations, see <code>chemfp.openeye\_toolkit</code>, <code>chemfp.openbabel\_toolkit</code>, <code>chemfp.rdkit\_toolkit</code>, and <code>chemfp.text\_toolkit</code>.

Fingerprint search usually starts with a structure record, and not a fingerprint. The functions *chemfp.*  $read\_molecule\_fingerprints()$  and  $chemfp.read\_molecule\_fingerprints\_from\_string()$  give a quick way to read a file or string containing structure records as the corresponding fingerprints.

Sometimes you want more control over the process. You might want to generate multiple fingerprints for the same structure and not want to reparse the structure record multiple times. Or you might want to return the search results as extra fields to the query SDF record instead of a simple list of values.

Chemfp uses a third-party chemistry toolkit to parse the records into a molecule, or compute the fingerprint for a given molecule. It's not hard to write your own Open Babel, OEChem/OEGraphSim, or RDKit code to handle any of these or similar tasks. The problem comes in when you want to mix multiple fingerprint types, like to compare the default RDKit fingerprint to Open Babel's FP2 fingerprint. You end up writing very different code for essentially the same fingerprint task.

There's an old saying in computer science; all problems can be solved with another layer of indirection. The chemfp toolkit API follows that tradition. It's a common API for molecule I/O which works across the three supported toolkits. It's also my best effort at implementing a next generation API.

Bear in mind that it is only an I/O API. Chemfp is a fingerprint toolkit and it will not gain a common molecule API. For that, look toward Cinfony.

## 6.1 Get a chemfp toolkit

In this section you'll learn how to load a "toolkit" – a portable API layer above the actual chemistry toolkit – and how to check if a toolkit is available and has a valid license.

Each toolkit I/O adapter is implemented as a chemfp submodule. If you know the underlying chemistry toolkit is installed you can import the adapter directly:

```
>>> from chemfp import openbabel_toolkit
>>> from chemfp import openeye_toolkit
>>> from chemfp import rdkit_toolkit
```

Use chemfp.get\_toolkit\_names() to get the available toolkit names:

```
>>> chemfp.get_toolkit_names()
set(['openeye', 'rdkit', 'openbabel'])
```

This will try to import each module, which means it may take a second or more depending on the shared library load time for your system. (This overhead only occurs once.) The function returns a list of the modules that could be loaded and have a valid license.

You can use <code>chemfp.get\_toolkit()</code> to get the correct toolkit module given a name; it raises a ValueError if the underlying toolkit isn't installed or the toolkit name is unknown:

```
>>> chemfp.get_toolkit("rdkit")
<module 'chemfp.rdkit_toolkit' from 'chemfp/rdkit_toolkit.pyc'>
>>> chemfp.get_toolkit("openeye")
<module 'chemfp.openeye_toolkit' from 'chemfp/openeye_toolkit.pyc'>
>>> chemfp.get_toolkit("openbabel")
<module 'chemfp.openbabel_toolkit' from 'chemfp/openbabel_toolkit.pyc'>
```

Existence isn't enough to know if you can use a toolkit. OEChem requires a license. Each I/O adapter implements <code>chemfp.toolkit.is\_licensed()</code>. It returns True for Open Babel and RDKit and the value of OEChemIsLicensed() for OEChem:

```
>>> from __future__ import print_function # Only needed in Python 2
>>> for name in chemfp.get_toolkit_names():
...    T = chemfp.get_toolkit(name)
...    print("Toolkit %r (%s) is licensed? %s" % (T.name, T.software, T.is_licensed()))
...
Toolkit 'openeye' (OEChem/20191016) is licensed? True
Toolkit 'openbabel' (OpenBabel/3.0.0) is licensed? True
Toolkit 'rdkit' (RDKit/2020.03.1) is licensed? True
```

(Thanks OpenEye for an no-cost developer license to their toolkit!) There is currently no way to check if OEGraphSim is licensed; you'll need to use native OpenEye code instead.

For fun I also showed the **software** attribute, which gives more detailed information about the toolkit version in a standardized format.

Finally, use <code>chemfp.has\_toolkit()</code> to check if a toolkit is available. In the following, I used one of my local testing environments which has OEChem installed but not the other toolkits. (I use venv to create and manage these virtual environments; it's a very useful tool.):

```
>>> chemfp.has_toolkit("openeye")
True
>>> chemfp.has_toolkit("openbabel")
False
>>> chemfp.has_toolkit("rdkit")
False
```

The other option is to catch the ValueError raised when trying to get an unavailable toolkit:

```
>>> chemfp.get_toolkit("openeye")
<module 'chemfp.openeye_toolkit' from 'chemfp/openeye_toolkit.py'>
>>> chemfp.get_toolkit("rdkit")
Traceback (most recent call last):
   File "<stdin>", line 1, in <module>
   File "chemfp/__init__.py", line 1907, in get_toolkit
        raise ValueError("Unable to get toolkit %r: %s" % (toolkit_name, err))
ValueError: Unable to get toolkit 'rdkit': No module named rdkit
>>> chemfp.get_toolkit("cdk")
Traceback (most recent call last):
   File "<stdin>", line 1, in <module>
   File "chemfp/__init__.py", line 1929, in get_toolkit
        raise ValueError("Toolkit %r is not supported" % (toolkit_name,))
ValueError: Toolkit 'cdk' is not supported
```

This is a bit more complicated to do, but does have the advantage of giving access to an error message.

#### 6.2 Parse and create SMILES

In this section you'll learn how to parse a SMILES into a molecule, convert a molecule into a SMILES, and the difference between a SMILES record and a SMILES string. You will need a chemistry toolkit for this and most of the examples in this chapter.

The chemfp toolkit I/O API is the same across the different toolkits, and examples with one will generally work with the other, except for essential differences like the specific formats available, the chemistry differences in how to interpret a record, the error messages, and reader and writer arguments.

For most examples I'll use T as the toolkit module name, rather than specify a specific toolkit. My examples will be based on RDKit, but you can use any of the following, if available on your system:

```
# Choose one of these
from chemfp import openeye_toolkit as T
from chemfp import openbabel_toolkit as T
from chemfp import rdkit_toolkit as T
```

I'll parse the SMILES string for phenol as a toolkit molecule, then convert the toolkit molecule into its canonical isomeric SMILES string using <code>chemfp.toolkit.create\_string()</code>:

```
>>> mol = T.parse_molecule("c1ccccc10", "smistring")
>>> mol
<rdkit.Chem.rdchem.Mol object at 0x103559980>
>>> T.create_string(mol, "smistring")
'Oc1ccccc1'
```

The "smistring" format name means that the input is a SMILES string. Chemfp follows the rule from the original SMILES paper that the SMILES string ends at the first whitespace. The following is valid across the chemfp toolkits API even if the underlying toolkit doesn't accept the "junk" as part of a SMILES:

```
>>> mol = T.parse_molecule("c1ccccc10 junk", "smistring")
```

On the other hand, if you have a SMILES record, which is a SMILES string followed by an id and possibly other fields, then use the "smi" format name. That will parse the first characters as a SMILES string and parse the rest of the input, up to the end of the line, as the record id:

```
>>> mol = T.parse_molecule("c1cccc10 junk", "smistring")
>>> T.get_id(mol) is None
True
>>> mol = T.parse_molecule("c1cccc10 junk", "smi")
>>> T.get_id(mol)
'junk'
>>> mol = T.parse_molecule("c1ccccc10 flotsam and jetsam\nand more\n", "smi")
>>> T.get_id(mol)
'flotsam and jetsam'
```

I used the <code>chemfp.toolkit.get\_id()</code> helper function. While chemfp doesn't have a common molecule object, I found I do need a few standard functions to manipulate toolkit molecules. Also, <code>toolkit.parse\_molecule()</code> will only read the first record and ignore trailing data, which is why the "and more" didn't affect anything.

Now that the molecule has an id, it's easy to see the difference between the "smistring" and "smi" in the output string:

```
>>> T.create_string(mol, "smistring")
'Oc1ccccc1'
>>> T.create_string(mol, "smi")
'Oc1ccccc1 flotsam and jetsam\n'
```

Finally, you can pass an alternate *id* to the *toolkit.create\_string()* function. One example of when this is useful is when your identifier comes from one field of a database and the SMILES string from another, and you want to combine the results to get an SDF record:

```
>>> T.create_string(mol, "smi", id="nothing to see here")
'Oc1ccccc1 nothing to see here\n'
```

WARNING: Chemfp's toolkit wrapper implementation may temporarily change then restore the toolkit molecule's own identifier in order to get the correct output. This is not thread-safe.

## 6.3 Canonical, non-isomeric, and arbitrary SMILES

In this section you'll learn the difference between the "smistring", "canstring", and "usmstring" SMILES string formats and the "smi", "can", and "usm" SMILES record formats. As with all examples which use the generic T toolkit name, you'll need one of the supported chemistry toolkits, and I'll use RDKit as my underlying toolkit.

The SMILES format supports many different ways to represent the same molecule. "CO", "OC", "[OH][CH3]", and "C3.O3" are four different SMILES strings for methanol. A canonicalization algorithm uses additional rules to create a unique SMILES representation for a given molecular graph. The different chemistry toolkit have different canonicalization algorithms, so each toolkit will likely generate a different canonical SMILES string for the same molecular graph.

There are multiple classes of canonical SMILES strings even in the same toolkit. The original SMILES format did not handle isotopes, chirality, or stereochemistry. The later extension to support these was called "isomeric SMILES", to distinguish it from the original SMILES.

Because of the history, when people asked a toolkit for "SMILES" output they got non-isomeric non-canonical SMILES, while "canonical SMILES" gave them "non-isomeric canonical". This caused subtle usability errors. Many people, including people like me who should have the experience to know better, expect canonical

isomeric SMILES by default. But for over 20 years nearly all of the toolkits followed Daylight's lead in how they did things.

I learned about the problem when OEChem 2.0 broke with tradition and fixed the mistake. It defined the default SMILES as canonical isomeric SMILES. If you make the effort to ask for a canonical SMILES you get canonical non-isomeric SMILES, and if you really want non-canonical, non-isomeric SMILES you can ask for the "usm" format.

Year later I learned that that Open Babel did the right thing well before OpenEye. Open Babel's "canonical" is isomeric SMILES, you must specify the "i" option to not include isotopic or chiral markings, and they don't even refer to "isomeric SMILES".

Chemfp follows OpenEye's naming convention. The "smistring" format generates a canonical isomeric SMILES string, the "canstring" format generates a canonical non-isomeric SMILES string, and the "usm-string" format generates a non-canonical non-isomeric SMILES string:

```
>>> from chemfp import rdkit_toolkit as T # use your toolkit of choice
>>>
>>> mol = T.parse_molecule("[235P].[238U]", "smistring")
>>> T.create_string(mol, "smistring")
'[235P].[238U]'
>>> T.create_string(mol, "canstring")
'[P].[U]'
>>> T.create_string(mol, "usmstring")
'[P].[U]'
```

Here's evidence that the "usmstring" format is non-canonical:

```
>>> mol = T.parse_molecule("[238U].[235P]", "smistring")
>>> T.create_string(mol, "usmstring")
'[U].[P]'
>>> T.create_string(mol, "smistring")
'[235P].[238U]'
```

These conventions also apply when creating "smi", "can", and "usm" strings:

```
>>> T.set_id(mol, "radioactive")
>>> T.create_string(mol, "smi")
'[235P].[238U] radioactive\n'
>>> T.create_string(mol, "can")
'[P].[U] radioactive\n'
>>> T.create_string(mol, "usm")
'[U].[P] radioactive\n'
```

By the way, <code>chemfp.toolkit.parse\_molecule()</code> doesn't distinguish between "smi", "can" and "usm" as input SMILES records, nor between "smistring", "canstring" and "usmstring". The format only makes a difference for output. Later on you'll see how to specify <code>writer\_args</code> to have more fine-grained control over the output SMILES format. (See <code>RDKit-specific SMILES reader\_args and writer\_args</code>, <code>OpenEye-specific SMILES reader\_args and writer\_args</code>, and <code>CDK-specific SMILES reader\_args and writer\_args</code> and <code>writer\_args</code> for toolkit-specific examples.)

#### 6.4 Use format to create a record in SDF format

In this section you'll learn how to convert a toolkit molecule into an SDF record. This example will use the RDKit toolkit but the results will be substantially the same for any of the three supported chemistry toolkits.

To create an SDF record as a Unicode string, pass "sdf" as the format to chemfp.toolkit.create\_string():

Starting with chemfp 3.0, the create\_string() function returns a Unicode string, under both Python 2.7 and Python 3.5+:

```
>>> T.create_string(mol, "sdf")[:13]
'\n RDKit '
```

In earlier versions of chemfp, create\_string() returned a byte string. This was the usual practice under Python 2.5 to 2.7. It was fine for ASCII data, but caused problems with other characters, like Greek letters in a compound name or a data item listing prices in with the GBP or EUR symbol.

Python 3 makes a strong distinction between a byte string and a Unicode string. Chemfp 3.x follows that lead by having create\_string() return a Unicode string, and added the new function chemfp.toolkit. create\_bytes() to return a byte string:

```
>>> T.create_bytes(mol, "sdf")[:13]
b'\n RDKit '
```

Here I'll set the molecule's name to the lower-case Greek letter 'alpha', and show you the interactive output from Python 2.7:

```
>>> T.set_id(mol, u"\N{GREEK SMALL LETTER ALPHA}")
>>> T.create_string(mol, "sdf")[:13]
u'\u03b1\n RDKit '
>>> T.create_bytes(mol, "sdf")[:13]
'\xce\xb1\n RDKit'
>>> print(T.create_string(mol, "sdf")[:13])
α
RDKit
```

Here's the same output under Python 3.8:

```
>>> T.set_id(mol, u"\N{GREEK SMALL LETTER ALPHA}")
>>> T.create_string(mol, "sdf")[:13]
'α\n RDKit '
>>> T.create_bytes(mol, "sdf")[:13]
b'\xce\xb1\n RDKit'
>>> print(T.create_string(mol, "sdf")[:13])
```

```
lpha RDKit
```

## 6.5 Use zlib record compression

In this section you'll learn about the "zlib" compression option for single record parsers and byte string creation.

A record in SDF format can be large, but most of the content is repetetive. Often it's better to store a zlib compressed record in a database instead of the full record. When I use zlib to compress each record of Compound\_099000001\_099500000.sdf.gz I get a 4.5-fold compression. That is, the uncompressed records take 73,024,092 bytes, the individually compressed records take 16,262,567 bytes, and the gzip compressed file takes 6,847,342 bytes. (Gzip is twice as good as individually compressed records because it can collect compression statistics across multiple records and build a better prediction model.)

Chemfp supports a zlib compression option for the record-oriented functions, though not the file-oriented functions. To enable it, add ".zlib" to the format string for <code>chemfp.toolkit.create\_bytes()</code>. Here you can see how adding that suffix reduces the record size:

```
>>> from __future__ import print_function # Only needed in Python 2
>>> from chemfp import rdkit_toolkit as T # use your toolkit of choice
>>> mol = T.parse_molecule("CO", "smistring")
>>> print("uncompressed:", len(T.create_bytes(mol, "sdf")))
uncompressed: 228
>>> print("compressed:", len(T.create_bytes(mol, "sdf.zlib")))
compressed: 77
```

I'll complete a round-trip conversion by parsing the compressed SD record to a molecule then converting it to a SMILES string:

```
>>> compressed = T.create_bytes(mol, "sdf.zlib")
>>> new_mol = T.parse_molecule(compressed, "sdf.zlib")
>>> T.create_string(new_mol, "smistring")
'CO'
```

The zlib option only works with create\_bytes; it does not work with create\_string because the latter only returns Unicode strings, and it's possible for zlib to return something which isn't valid Unicode. Here's what happens if you try to use it anyway:

```
>>> T.create_string(mol, "sdf.zlib")
Traceback (most recent call last):
   File "<stdin>", line 1, in <module>
   File "chemfp/rdkit_toolkit.py", line 419, in create_string
    return _toolkit.create_string(mol, format, id, writer_args, errors)
   File "chemfp/base_toolkit.py", line 1382, in create_string
    raise ValueError("create_string() does not support compression. Use create_bytes()")
ValueError: create_string() does not support compression. Use create_bytes()
```

On the other hand, <code>chemfp.toolkit.parse\_molecule()</code> takes both Unicode strings and byte strings as input. It treats byte strings as being UTF-8 encoded.

## 6.6 Use zst record compression

In this section you'll learn about the "zst" compression option for single record parsers and byte string creation.

Chemfp 3.4 added support for ZStandard compression in most places, including in the record-oriented functions, via the suffix ".zst" in the format name or filename. The following compares zlib and zst compression to the uncompressed size:

The output of the above is:

```
'text' toolkit: uncompressed: 73024092 zlib: 16262567 (4.49) zstd: 16976598 (4.30)
'rdkit' toolkit: uncompressed: 68180103 zlib: 15843096 (4.30) zstd: 16714426 (4.08)
'openbabel' toolkit: uncompressed: 73392094 zlib: 16295123 (4.50) zstd: 16985140 (4.32)
'openeye' toolkit: uncompressed: 73024092 zlib: 16269883 (4.49) zstd: 16977089 (4.30)
```

By default OEChem and Open Babel will keep hydrogens while RDKit removes them, which makes the output SD files considerably smaller. The reader\_args specifies rdkit.sdf.removeHs so RDKit will keep the hydrogens, which makes the size comparisons more direct. The total RDKit size is still smaller than the other toolkits because RDKit only writes 4 columns for each bond, while the others use 7 columns.

Remember, compression effectiveness is a balance between compression time, compressed size, and decompression time. The zlib, gzip, and zst compression methods all support different compression levels. For zlib and gzip, 1 results in faster compression time but generally larger compressed sizes, and 9 gives the best compression at the cost of decreased performance. Zstandard also uses 1 for faster compression but uses 19 to get the maximum compression.

The compression level can be specified using the level argument of the chemfp functions which support compressed output, like <code>chemfp.toolkit.create\_bytes()</code>, <code>chemfp.toolkit.open\_molecule\_writer()</code>, and <code>save()</code>. It can be the numeric compression level, or the words "min" for minimum compression, "default" for default (for zlib and gzip, 3 for zstd), and "max" for maximum compression at the expense of time.

# 6.7 Get a list of available formats and distinguish between input and output formats

In this section you'll learn how to get the list of available formats for each object, and determine if a format can be used to get a toolkit molecule from a string record, or convert a toolkit molecule into a string record.

The toolkit's chemfp.toolkit.get\_formats() function returns a list of the available formats. On my

computer RDKit supports 20 formats, OEChem 31, and Open Babel (showing off its heritage) supports a whopping 196:

```
>>> from chemfp import rdkit toolkit
>>> len(rdkit toolkit.get formats())
20
>>> rdkit_toolkit.get_formats()
[Format('rdkit/smi'), Format('rdkit/can'), Format('rdkit/usm'),
Format('rdkit/sdf'), Format('rdkit/smistring'),
Format('rdkit/canstring'), Format('rdkit/usmstring'),
Format('rdkit/molfile'), Format('rdkit/rdbinmol'),
Format('rdkit/fasta'), Format('rdkit/sequence'), Format('rdkit/helm'),
Format('rdkit/mol2'), Format('rdkit/pdb'), Format('rdkit/xyz'),
Format('rdkit/mae'), Format('rdkit/inchi'), Format('rdkit/inchikey'),
Format('rdkit/inchistring'), Format('rdkit/inchikeystring')]
>>>
>>> from chemfp import openeye toolkit
>>> len(openeye_toolkit.get_formats())
>>> openeye_toolkit.get_formats()
[Format('openeye/smi'), Format('openeye/usm'),
Format('openeye/can'), Format('openeye/sdf'),
Format('openeye/molfile'), Format('openeye/skc'),
Format('openeye/mol2'), Format('openeye/mol2h'),
Format('openeye/sln'), Format('openeye/mmod'),
Format('openeye/pdb'), Format('openeye/xyz'), Format('openeye/cdx'),
Format('openeye/mopac'), Format('openeye/mf'),
Format('openeve/oeb'), Format('openeve/inchi'),
Format('openeye/inchikey'), Format('openeye/oez'),
Format('openeye/cif'), Format('openeye/mmcif'),
Format('openeye/fasta'), Format('openeye/sequence'),
Format('openeye/csv'), Format('openeye/json'),
Format('openeye/smistring'), Format('openeye/canstring'),
Format('openeye/usmstring'), Format('openeye/slnstring'),
Format('openeye/inchistring'), Format('openeye/inchikeystring')]
>>> from chemfp import openbabel_toolkit
>>> len(openbabel toolkit.get formats())
196
>>> openbabel_toolkit.get_formats()
[Format('openbabel/smi'), Format('openbabel/can'),
Format('openbabel/usm'), Format('openbabel/smistring'),
Format('openbabel/canstring'), Format('openbabel/usmstring'),
Format('openbabel/sdf'), Format('openbabel/inchi'),
Format('openbabel/inchikey'), Format('openbabel/inchistring'),
Format('openbabel/inchikeystring'), Format('openbabel/ins'),
Format('openbabel/moo'), Format('openbabel/cmlr'),
  ... many formats omitted ...
Format('openbabel/pdb')]
>>>
```

I'll use chemfp.toolkit.get\_format(), which returns a chemfp.base\_toolkit.Format, to get the "sdf" format for OpenEye (if you don't have access to OEChem, use one of the other toolkits instead):

```
>>> sdf_format = openeye_toolkit.get_format("sdf")
>>> sdf_format.name
'sdf'
>>> sdf_format.toolkit_name
'openeye'
```

The "sdf" format can be used for both input and output in all toolkits:

```
>>> sdf_format.is_input_format, sdf_format.is_output_format
(True, True)
```

However, some formats are output only, like the InChIKey format (assuming it's available for your toolkit):

```
>>> inchi_fmt = openeye_toolkit.get_format("inchikey")
>>> inchi_fmt.is_input_format, inchi_fmt.is_output_format
(False, True)
```

On the other hand, some formats are input only, like Open Babel's support for MOPAC's output format:

```
>>> mopout_fmt = openbabel_toolkit.get_format("mopout")
>>> mopout_fmt.is_input_format, mopout_fmt.is_output_format
(True, False)
```

Instead of asking for all available formats, you can ask for only the input formats, or only the output formats, using chemfp.toolkit.get\_input\_formats or chemfp.toolkit.get\_output\_formats:

```
>>> from __future__ import print_function # Only needed in Python 2
>>> import chemfp
>>> for toolkit_name in ("openbabel", "openeye", "rdkit"):
...    T = chemfp.get_toolkit(toolkit_name)
...    print(toolkit_name, "has", len(T.get_input_formats()), "input formats")
...    print(toolkit_name, "has", len(T.get_output_formats()), "output formats")
...
openbabel has 153 input formats
openbabel has 142 output formats
openeye has 25 input formats
openeye has 30 output formats
rdkit has 17 input formats
rdkit has 18 output formats
```

## 6.8 Determine the format for a given filename

It's sometimes useful to know what format will be used for a given filename. A filename can be used as a source for a reader or destination for a writer, and a toolkit might understand a given format when used as input but not as ouput, or vice-versa.

The function <code>chemfp.toolkit.get\_input\_format\_from\_source()</code> returns a <code>chemfp.base\_toolkit.Format</code> for the given filename:

```
>>> from chemfp import rdkit_toolkit as T # use your toolkit of choice
>>> T.get_input_format_from_source("abc.smi.gz")
Format('rdkit/smi.gz')
```

This is the same Format object you saw in the previous section. I didn't mention the compression attribute in that discussion. It's "gz" for gzip-ed files, "zst" for zstandard compressed files, and the empty string "" for uncompressed files.

```
>>> fmt = T.get_input_format_from_source("abc.smi.gz")
>>> fmt.name
'smi'
>>> fmt.compression
'gz'
>>>
>>> fmt = T.get_input_format_from_source("abc.smi")
>>> fmt.name
'smi'
>>> fmt.compression
''
```

Asking for a supported format which isn't an input format raises a ValueError exception:

```
>>> from chemfp import openbabel_toolkit
>>> openbabel_toolkit.get_input_format_from_source("example.inchikey")
Traceback (most recent call last):
   File "<stdin>", line 1, in <module>
   File "chemfp/openbabel_toolkit.py", line 168, in get_input_format_from_source
     return _format_registry.get_input_format_from_source(source, format)
   File "chemfp/base_toolkit.py", line 875, in get_input_format_from_source
     format_config = self.get_input_format_config(register_name)
   File "chemfp/base_toolkit.py", line 798, in get_input_format_config
     raise ValueError("%s does not support %r as an input format"
ValueError: Open Babel does not support 'inchikey' as an input format
```

even though "inchikey" is supported as an output format:

```
>>> openbabel_toolkit.get_output_format_from_destination("example.inchikey")
Format('openbabel/inchikey')
```

Yes, there's a different function to get the format name for a source filename than for a destination filename. Maybe in the future I'll support a generic get\_format\_from\_filename(); let me know if that would be useful.

If you ask for a format which doesn't exist then the functions raise a different ValueError exception:

I've found it useful to have a way to override the default guess. It's amazing how many people use ".dat" for SMILES or SDF files, and ".txt" files for SMILES. The format lookup functions support a second, optional parameter, which is the format name to use.

```
>>> openbabel_toolkit.get_input_format_from_source("example.does-not-exist", "smi.gz")
Format('openbabel/smi.gz')
```

This exists so that code like:

```
if format is not None:
    fmt = T.get_format(format)
else:
    fmt = T.get_format_from_source(filename)
```

can be replaced with:

```
fmt = T.get_format_from_source(filename, format)
```

Working with a format object is useful when combined with format's reader\_args and writer\_arg functions discussed in Specify a SMILES delimiter through reader\_args

#### 6.9 Parse the id and the molecule at the same time

In this section you'll learn how to parse a structure record, as a string, to extract both the identifier and the native molecule object.

Usually you want both the molecule and its id. You could parse the molecule then use  $T.get\_id(mol)$  to get the id, but that's extra work, it leads to awkward looking code, and is slower than having chemfp do the work for you when it parses the molecule.

Instead, use chemfp.toolkit.parse\_id\_and\_molecule():

```
>>> from chemfp import rdkit_toolkit as T # use your toolkit of choice
>>>
>>> T.parse_id_and_molecule("C1C(C)=C(C=CC(C)=CC=CC(C)=CCO)C(C)(C)(C)(C) vitamin a", "smi")
('vitamin a', <rdkit.Chem.rdchem.Mol object at 0x1035f14b0>)
```

Note that the identifier is a Unicode string. This was changed in chemfp 3.0. Earlier versions returned byte string instead.

If there is no id/title field then the id will either be None or the empty string, depending on the toolkit and format:

```
>>> T.parse_id_and_molecule("C", "smi")
(None, <rdkit.Chem.rdchem.Mol object at 0x1035f14b0>)
```

Instead of testing for the empty string or None, your code you should use "if not id:" to test for a missing id:

```
>>> id, mol = T.parse_id_and_molecule("C", "smi")
>>> if not id:
... print("Missing id!")
...
Missing id!
```

### 6.10 Specify alternate error behavior

In this section you'll learn how to use the *errors* parameter to have *chemfp.toolkit.parse\_molecule()* return None rather than raise an exception, and to have it print a report about the failing molecule.

The string "Q" is not a valid SMILES string. All of the toolkits will fail to parse it, and the chemfp toolkit I/O adapter by default raises an exception when that happens:

```
>>> from chemfp import openbabel_toolkit
>>> openbabel toolkit.parse molecule("Q", "smistring")
Traceback (most recent call last):
 File "<stdin>", line 1, in <module>
 File "chemfp/io.py", line 112, in error
    _compat.raise_tb(ParseError(msg, location), None)
 File "<string>", line 1, in raise_tb
chemfp.ParseError: Open Babel cannot parse the SMILES 'Q'
>>> rdkit_toolkit.parse_molecule("Q", "smistring")
[16:02:55] SMILES Parse Error: syntax error while parsing: Q
[16:02:55] SMILES Parse Error: Failed parsing SMILES 'Q' for input: 'Q'
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
  File "chemfp/io.py", line 112, in error
    _compat.raise_tb(ParseError(msg, location), None)
 File "<string>", line 1, in raise tb
chemfp.ParseError: RDKit cannot parse the SMILES string 'Q'
>>>
>>> from chemfp import openeye_toolkit
>>> openeye_toolkit.parse_molecule("Q", "smistring")
Warning: Problem parsing SMILES:
Warning: Q
Warning:
Traceback (most recent call last):
 File "<stdin>", line 1, in <module>
  File "chemfp/io.py", line 112, in error
    _compat.raise_tb(ParseError(msg, location), None)
 File "<string>", line 1, in raise_tb
chemfp.ParseError: OEChem cannot parse the smistring record: 'Q'
```

On the other hand, "[NH8]" is a valid SMILES, but RDKit by default will reject it as chemically unreasonable, while OEChem and Open Babel are less strict and treat it as a molecular graph rather than a chemical molecule.

I'll write a program which checks which toolkits will parse "[NH8]"

```
# I call this "check_NH8.py"
from __future__ import print_function # Only needed in Python 2
import chemfp
allowed = []; rejected = []
for name in chemfp.get_toolkit_names():
    T = chemfp.get_toolkit(name)
    try:
        T.parse_molecule("[NH8]", "smistring")
    except ValueError:
        rejected.append(name)
    else:
        allowed.append(name)
print("Allowed:", allowed, "Rejected:", rejected)
```

```
% python check_NH8.py
[16:04:39] Explicit valence for atom # 0 N, 8, is greater than permitted
Allowed: ['openeye', 'openbabel'] Rejected: ['rdkit']
```

I think the try/except/else is sometimes harder to understand than returning an error value, because it's harder to see the control flow. I can ask <code>chemfp.toolkit.parse\_molecule()</code> to <code>ignore</code> errors, which causes it to return a None object rather than raise an exception. turns the above loop into the following:

```
for name in chemfp.get_toolkit_names():
    T = chemfp.get_toolkit(name)
    mol = T.parse_molecule("[NH8]", "smistring", errors="ignore")
    if mol is None:
        rejected.append(name)
    else:
        allowed.append(name)
```

The errors option is more useful in later sections, when parsing multiple records.

The errors parameter can also take the value report. Like ignore, this will return a None when there is an error rather than raise an exception. It will also write a consistent, cross-toolkit error message to stderr, including the SMILES string that failed if the input is a SMILES:

```
>>> for name in chemfp.get_toolkit_names():
... print("Using toolkit", repr(name))
... T = chemfp.get_toolkit(name)
... mol = T.parse_molecule("Q", "smistring", errors="report")
... mol = T.parse_molecule("[NH8]", "smistring", errors="report")
...
```

The <code>chemfp.toolkit.parse\_id\_and\_molecule()</code> function also takes the <code>errors</code> parameter. If the structure could not be parsed then the second component of the tuple (the molecule) will be None. The first component (the id) may or or may not be None, depending on the underlying implementation:

```
>>> from chemfp import rdkit_toolkit
>>> rdkit_toolkit.parse_id_and_molecule("Q q-ane", "smi", errors="ignore")
[13:03:10] SMILES Parse Error: syntax error while parsing: Q
[13:03:10] SMILES Parse Error: Failed parsing SMILES 'Q' for input: 'Q'
(None, None)
```

Future versions of chemfp may work to normalize this behavior, or let the caller choose a specific behavior.

## 6.11 Specify a SMILES delimiter through reader\_args

In this section you'll learn how to parse a SMILES record as a set of delimited fields instead of the default of a SMILES string followed by a title, and some of the limitations of chemfp's attempt at a consistent cross-toolkit SMILES record parser.

You might think that the SMILES file format is well defined, but it sadly isn't. Different toolkits have slightly different interpretations for a SMILES record format. Consider the SMILES record:

```
C1C(C)=C(C=CC(C)=CC=CC(C)=CCO)C(C)(C)C1 vitamin a
```

The original Daylight definition is that a SMILES record is single line, which starts with the SMILES string. The SMILES string ends with the first whitespace character or the end of the line, and if there was a whitespace character than the rest of the line is the title. OpenEye follows this definition, as does chemfp. That's why the previous example extracted "vitamin A" as the record id.

However, RDKit treats a SMILES file record as a space or tab separated set of fields, where the first field is the SMILES, the second field is the id/title and additional columns may store other properties. RDKit would use "vitamin" as the record id for this record. (RDKit can also be configured to interpret the first line as column names. Chemfp does not currently support this option, though I plan to have a cross-platform implementation in a future release.)

Chemfp normalizes the SMILES record parser API so that all toolkits by default expect the Daylight format.

Warning: Future versions of chemfp may change the default to "tab" instead of "to-eol" because CXSMILES is becoming more common.

Use the optional reader\_args dictionary to specify an alternate interpretation:

```
>>> from chemfp import rdkit_toolkit as T # use your toolkit of choice
>>>
>>> smiles = "C1C(C)=C(C=CC(C)=CC=CC(C)=CCO)C(C)(C)(C) vitamin a"
```

```
>>> T.parse_id_and_molecule(smiles, "smi", reader_args={"delimiter": "whitespace"})
('vitamin', <rdkit.Chem.rdchem.Mol object at 0x10f5ccfa0>)
```

In this case I asked it to parse the record as a set of whitespace delimited fields. If you have tab-separated fields, where a space inside of a field is not part of the delimiter, then use the "tab" delimiter:

```
>>> T.parse_id_and_molecule("0=0\tmolecular oxygen\t31.9988\n", "smi",
... reader_args={"delimiter": "tab"})
('molecular oxygen', <rdkit.Chem.rdchem.Mol object at 0x10fbe9590>)
```

The supported delimiters are:

- to-eol (default) everything past the first whitespace is interpreted as the id/title;
- tab or "\t" the fields are tab-separated; the first field is the SMILES and the second the id;
- space or " " the fields are space-separated;
- whitespace the fields are whitespace-separated;
- native use the native interpretation for the given toolkit;

While chemfp strives for cross-toolkit portability, it is not perfect. Leading and trailing whitespace might not be supported, so the first character of the SMILES record must also be the first character of the SMILES string. Also, the toolkit is free to interpret the first whitespace as the delimiter despite the *reader\_args* setting. In practice, as of early 2020, Open Babel, RDKit, and OEChem will stop at the first whitespace, though I suspect they will increasingly support the CXSMILES extensions.

Neither the SMILES parser nor the other parsers validate the full contents of the *reader\_args* dictionary. Extra items are ignored. This is deliberate because it lets you combine, say, SMILES and SDF parameters in the same dictionary without needing to check the specific format first.

To a lesser extent, it also makes it easier to specify parameters which work across multiple toolkit versions. For example, the most recent version of OEChem's SMILES parsers added a *quiet* option, which chemfp will support in the future. Your code can have a {"quiet": True} without first checking to see if this version of chemfp is new enough to support the parameter.

WARNING: As a result, it's very easy to specify a key with a typo, which is ignored, and not notice that it nothing happens.

WARNING #2: Really, I've been bitten by this a few times. Be extra cautious to check that you are using the right keys.

# 6.12 Specify an output SMILES delimiter through writer\_args

In this section you'll learn how to create a SMILES record with a tab character separating the SMILES from the title using the writer\_args parameter of chemfp.toolkit.create\_string().

By default create\_string uses a space character to separate the SMILES from the rest of the id:

```
>>> from chemfp import rdkit_toolkit as T # use your toolkit of choice
>>>
>>> mol = T.parse_molecule("0=0 molecular oxygen\n", "smi")
>>> T.create_string(mol, "smi")
'0=0 molecular oxygen\n'
```

To use a tab character instead, pass in a writer\_args dictionary with a "delimiter" of "tab":

```
>>> T.create_string(mol, "smi", writer_args={"delimiter": "tab"})
'0=0\tmolecular oxygen\n'
```

The writer\_args delimiter also accepts "whitespace", "space", "to-eol" and the other values from reader\_args. Only "tab" and "\t" will use a tab character as the delimiter; all of the the others will use a space character.

**Warning:** Future versions of chemfp may change the default to "tab" to better support the use of CXSMILES extensions.

Neither the SMILES writer nor the other writers validate the full contents of the *writer\_args* dictionary. Extra items are ignored. This is deliberate because it lets you combine, say, SMILES and SDF parameters in the same dictionary without needing to check the specific format first. It also makes it easier to specify parameters which work across multiple toolkit versions.

WARNING: As a result, it's very easy to specify a key with a typo, which is ignored, and not notice that it nothing happens.

WARNING #2: Really, I've been bitten by this a few times. Be extra cautious to check that you are using the right keys.

## 6.13 RDKit-specific SMILES reader\_args and writer\_args

In this section you'll learn how to pass toolkit-specific parameters to the RDKit toolkit functions to parse and create a SMILES string. You will need the RDKit toolkit.

Earlier I showed that RDKit by default does a sanitization check to verify that the input is correct.

```
>>> from chemfp import rdkit_toolkit
>>> mol = rdkit_toolkit.parse_molecule("[NH8]", "smistring", errors="ignore")
[16:31:55] Explicit valence for atom # 0 N, 8, is greater than permitted
>>> mol is None
True
```

The underlying RDKit code to parse a SMILES string, MolFromSmiles, takes a *sanitize* parameter. The default, True, tells it to do the sanitization step, while False disables it.

Use the reader\_args dictionary to pass the sanitize parameter to the underlying toolkit function:

Use the writer args dictionary to pass toolkit-specific parameters to RDKit's MolToSmiles:

```
>>> mol = rdkit_toolkit.parse_molecule("c1ccccc1[160H]", "smistring")
>>> rdkit_toolkit.create_string(mol, "smistring")
'[160H]c1ccccc1'
>>> rdkit_toolkit.create_string(mol, "smistring",
```

```
... writer_args={"isomericSmiles": False})
'Oc1ccccc1'
>>> rdkit_toolkit.create_string(mol, "smistring",
... writer_args={"kekuleSmiles": True, "allBondsExplicit": True})
'[160H]-C1:C:C:C:C:C:1'
```

See Get the default reader\_args or writer\_args for a format for a description of how to get the default reader and writer arguments for a given format, and use help(rdkit\_toolkit.read\_molecules) and help(rdkit\_toolkit.open\_molecule\_writer) to get a more human-readable description.

## 6.14 OpenEye-specific SMILES reader\_args and writer\_args

In this section you'll learn how to pass toolkit-specific parameters to the OEChem toolkit functions to parse and create a SMILES string. You will need the OEChem toolkit. See the next section for specific details about aromaticity.

By default the OEChem SMILES parser is tolerant of bad SMILES. I believe it's too tolerant, because will gladly parse what I think are invalid SMILES, like "C-=C":

```
>>> from chemfp import openeye_toolkit
>>> mol = openeye_toolkit.parse_molecule("C-=C", "smistring")
>>> openeye_toolkit.create_string(mol, "smistring")
'C=C'
```

The developers at OpenEye recognize that pedantic folk like me exist. The OEChem SMILES parser has a "strict" mode, which I can enable in chemfp through the "flavor" parameter of the *reader\_args* dictionary:

The underlying OEParseSmiles() function takes the optional strict and canon parameters. Why does chemfp use the term "flavor"? Why the capitalization for "Strict"?

Historically the low-level OEChem functions took individual parameters, like the positional arguments canon and strict:

```
>>> mol = OEGraphMol()
>>> OEParseSmiles(mol, "C-=C", False, True)
Warning: Problem parsing SMILES:
Warning: Bond without end atom.
```

```
Warning: C-=C
Warning: ^
False
```

(I wrote "historically" because more recent versions have format-specific options classes, like OEParseSmilesOptions for SMILES. These collect all of the configuration options into a single parameter, which is easier to pass around.)

On the other hand, the high-level molecule parsers take a single "flavor" integer value to specify the options for a given format. This flavor is usually expressed as the union of a set of bitmasks. I'll show how OEChem's Python API uses the flavor parameter.

The following OEChem code reads a SMILES file in the default non-strict mode (with no specified flavor):

```
% cat example.smi
C=-C bad
CCC good
% python
...
>>> from __future__ import print_function # Only needed in Python 2
>>> from openeye.oechem import *
>>> ifs = oemolistream("example.smi")
>>> for mol in ifs.GetOEGraphMols():
...    print(mol.GetTitle(), mol.NumAtoms())
...
bad 2
good 3
```

while the following sets the SMILES flavor to use "strict" mode:

```
>>> ifs = oemolistream("example.smi")
>>> ifs.SetFlavor(OEFormat_SMI, OEIFlavor_SMI_Strict)
True
>>> for mol in ifs.GetOEGraphMols():
...    print(mol.GetTitle(), mol.NumAtoms())
...
Warning: Problem parsing SMILES:
Warning: Bond without end atom.
Warning: C=-C bad
Warning: ^
Warning: Error reading molecule "" in Canonical stereo SMILES format.
good 3
```

(You can see some terminology differences between me and OpenEye in the warning message. The "Canonical" and "stereo" are only meaningful as a description of the output format, not the input format, and I use the traditional term "isomeric" while they highlight the more important stereochemistry aspect. I also got confused because I thought at first the "Canonical" had something to do with OEIFlavor\_SMI\_Canon.)

I decided to base the *chemfp openeye\_toolkit* API on the high-level "flavor" API of OEChem, which is better documented and requires less work on my part to implement than low-level functions. But I also decided to extend it to support a string value, and not just an integer.

To explain how that works, I'll switch from describing reader args to writer args, because raising an excep-

tion with the "Strict" option gets boring, fast.

The OEChem SMILES output flavors are: OEOFlavor\_SMI\_AtomMaps, OEOFlavor\_SMI\_AtomStereo, ... and you know what? The OEOFlavor\_SMI\_ prefix is part of what makes the flavors hard to use in Python, so I'll omit the prefix in chemfp. The OEChem SMILES output flavors are: AllBonds, AtomMaps, AtomStereo, BondStereo, Canonical, ExtBonds, Hydrogens, ImpHCount, Isotopes, Kekule, RGroups, SmiMask, and SuperAtoms. There are also Default and DEFAULT which are the bitwise union RGroups | Isotopes | AtomStereo | BondStereo | AtomMaps | Canonical.

In chemfp you can specify the fields as a "|" or "," separated list of flavor flags, without the prefix. Here are several different ways to specify the default settings for isomeric canonical SMILES string output:

```
>>> mol = openeye_toolkit.parse_molecule("[160][*:1]", "smistring")
>>> openeye_toolkit.create_string(mol, "smistring")
'[R1][160]'
>>> openeye_toolkit.create_string(mol, "smistring",
... writer_args={"flavor": ""})
'[R1][160]'
>>> openeye_toolkit.create_string(mol, "smistring",
... writer_args={"flavor": "Default"})
'[R1][160]'
>>> openeye_toolkit.create_string(mol, "smistring",
... writer_args={"flavor": "RGroups|Isotopes|AtomStereo|BondStereo|AtomMaps|Canonical
..."})
'[R1][160]'
```

These settings override any options which might be implied by the format name. Thus, even though "smistring" is supposed to generate an isomeric canonical SMILES, I can use the *writer\_args* to remove the isomeric component from the flavor:

```
>>> openeye_toolkit.create_string(mol, "smistring",
... writer_args={"flavor": "RGroups|AtomStereo|BondStereo|AtomMaps|Canonical"})
'[R1][0]'
```

While I used "|" as the separator, I can equally use ",", as in:

```
>>> openeye_toolkit.create_string(mol, "smistring",
... writer_args={"flavor": "Isotopes,Canonical"})
'*[160]'
```

OEChem uses the bar as a bitwise-or operator which merges the different flags. I added the comma as an alternative to the vertical bar because chemfp has additional syntax for removing options. The following removes the "RGroups" option from the isomeric and non-isomerical formats defaults, but otherwise leaves the defaults alone:

(The terms are evaluated from left to right, so you can delete a term then add it back if you want.)

I added a comma because writing this as Default | -RGroups caused the C programmer mind in me to gasp

in bewilderment. ("The bitwise-or with the negative of the RGroups bitflags?!!")

You don't need to specify the OEChem flavor using a flavor string. You can also specify it as an integer:

```
>>> from openeye.oechem import *
>>> (OEOFlavor_SMI_Isotopes|OEOFlavor_SMI_AtomStereo|OEOFlavor_SMI_BondStereo|
... OEOFlavor_SMI_AtomMaps|OEOFlavor_SMI_Canonical)
121
>>> openeye_toolkit.create_string(mol, "smistring",
... writer_args={"flavor": 121})
'[*:1][160]'
>>> openeye_toolkit.create_string(mol, "smistring",
... writer_args={"flavor": 0})
'[0]*'
```

or (and this might be a bit excessive) as a string-encoded integer:

Chemfp tries to be helpful. It will include the list of available flavor names in the exception if it doesn't understand what you gave it:

See Get the default reader\_args or writer\_args for a format for a description of how to get the default reader and writer arguments for a given format, and use help(openeye\_toolkit.read\_molecules) and help(openeye\_toolkit.open\_molecule\_writer) to get a more human-readable description.

# 6.15 OpenEye-specific aromaticity

In this section you'll learn how chemfp handles OpenEye's aromaticity parameter. You will need the OEChem toolkit, and you should read the previous section to understand some of the terminology.

Note: the OEGraphSim fingerprints are not affected by the *aromaticity* of the reader because the fingerprint generators ensure that the molecules are always perceived using "openeye" aromaticity before generating the fingerprint.

The OpenEye toolkit supports the "openeye", "daylight", "tripos", "mdl", and "mmff" aromaticity models. In the high-level API, which is meant for reading and writing files or file-like objects, the aromaticity is an aspect of the flavor integer. If unspecified, OEChem uses the appropriate default aromaticity model for that format. As a result, aromaticity perception is required for both reading and writing files.

The low-level API handles file processing and aromaticity perception as distinct steps. This API can also process a single record directly, while the high-level API requires wrapping the record in a file-like object and then reading the first molecule from it.

The chemfp toolkit API is a high-level API for both files and records, which means I had to implement record conversion routines on top of OEChem's low-level API. Consequently, some of the details are different between the file I/O and record I/O APIs; the most significant being that the record I/O routines also support a "none" aromaticity.

The following shows the default aromaticity proceessing in action:

```
>>> from chemfp import openeye_toolkit
>>> mol = openeye_toolkit.parse_molecule("C1=CC=CC=C1", "smistring")
>>> [bond.IsAromatic() for bond in mol.GetBonds()]
[True, True, True, True, True]
```

Automatic aromaticity perception is normally the right thing to do, because different toolkits and even different versions of the same toolkit may have different ideas of what is aromatic, and it's best to ensure that they are consistently interpreted.

Aromaticity perception isn't needed when you know that the input aromaticity is correct and unambiguous. My timings show that aromaticity perception takes about half of the time needed to parse a SMILES string. If the string comes from a good data source, like a database record where OEChem created the SMILES, then you can nearly double the performance by omitting the perception step.

What does "ambiguous" mean? Consider azulene, which can be described by the SMILES "c1ccc2ccc2cc1". The fusion bond is not aromatic, while the peripheral bonds form a 10 pi electron system. In SMILES, an unspecified bond means "single or aromatic". If one of the terminal atoms is aliphatic then the bond must be a single bond. But as the fusion bond in azulene shows, it's possible for an unspecified bond with terminal aromatic atoms to still be non-aromatic. The above SMILES is ambiguous, and OEChem needs to do a full aromaticity analysis to determine that the fusion bond is not aromatic.

An unambiguous SMILES for azulene is "c1ccc-2ccc2cc1", where the fusion bond is marked explicitly as a single bond. The SMILES parser can use the simpler rule that an unspecified ring bond is aromatic whenever both terminal atoms are aromatic, and not require the lengthy aromatic perception step to determine that. OEChem generates unambiguous SMILES, so if you know OEChem generated the SMILES then you can recover the original aromaticity directly.

(As a side note, Daylight first introduced this in 4.71, and used fluorene ("C1c2cccc2-c3ccccc13") as the prototypical case. Daylight's rule is to include the "-" for a single bond between two aromatic atoms, while OEChem's rule is to include the "-" for a single bond between two aromatic atoms and which is in a ring. Ring identification is much easier than aromaticity perception.)

So where was I ... ah, right, specifing the aromaticity model. I decided to separate aromaticity from the rest of the flavor flags, and specify it with its own <code>reader\_args</code> and <code>writer\_args</code> field. It's easiest to see using beneze in Kekule form:

```
>>> openeye_toolkit.create_string(mol, "smistring",
... writer_args={"aromaticity": "none"})
'C1=CC=CC=C1'
```

NOTE: the aromaticity flags are volatile. If you don't specify the "none" aromaticity model then *chemfp*. toolkit.create\_string() will reperceive aromaticity using the "openeye" aromaticity model and possibly reassign the aromaticity flags.

```
>>> openeye_toolkit.create_string(mol, "smistring")
'c1ccccc1'
>>> openeye_toolkit.create_string(mol, "smistring",
... writer_args={"aromaticity": "none"})
'c1ccccc1'
```

This is consistent with how OEChem's high-level operations also modify the input molecule when creating output. I'm not fully happy with it. OEChem also has a "ConstMolecule" version, so this detail may change in the future.

## 6.16 Open Babel-specific SMILES reader\_args and writer\_args

In this section you'll learn how to pass toolkit-specific parameters to the Open Babel toolkit functions to create a SMILES string. You will need the Open Babel toolkit.

As far as I can tell, Open Babel does not have configuration options to change the default SMILES parser, so chemfp has no toolkit-specific reader\_args for that toolkit. Open Babel does have configuration options to change the default SMILES output routines. These can be set in chemfp with the writer\_args dictionary.

Open Babel uses an options string to change the configuration. The string "i U smilesonly" generates non-isomeric SMILES output, where the atom ordering is determined by the InChI's canonicalization algorithm ("Universal SMILES"), and where the identifier is excluded from the SMILES output.

Did you know all of that? I didn't. Some of these options are only documented in the code. It's also difficult for chemfp to handle since some of the options conflict with how chemfp thinks of things. For example, chemfp is in charge of including the identifier, so it will always enable "smilesonly", and it's difficult for the "cansmiles" output, which is non-isomeric, to know if an options string wants to override the default"i" option that it requires.

I ended up making my own writer args API to have more explicit control over the individual parameters:

- explicit hydrogens boolean
- isomeric boolean
- canonicalization a string like "default", "none", "universal", "anticanonical", or "inchified"
- options the Open Babel options string (if you must use it; using it may break things if you are not very careful.)

Here's an example of how to disable isomeric support for the "smistring" output, which would normally generate an isomeric SMILES:

```
>>> from chemfp import openbabel_toolkit
>>> mol = openbabel_toolkit.parse_molecule("[160]=0", "smistring")
>>> openbabel_toolkit.create_string(mol, "smistring")
'[160]=0'
```

```
>>> openbabel_toolkit.create_string(mol, "smistring",
... writer_args={"isomeric": False})
'0=0'
```

I can also enable isomeric SMILES for the "canstring" format, which is normally non-isomeric:

```
>>> openbabel_toolkit.create_string(mol, "canstring")
'0=0'
>>> openbabel_toolkit.create_string(mol, "canstring",
... writer_args={"isomeric": True})
'[160]=0'
```

Open Babel supports several different canonicalization algorithms. Perhaps the most unusual one is "anti-canonical", which uses random numbers for the atom ordering algorithm. The same molecule can generate different SMILES strings across multiple calls, so it's the antithesis of "canonical":

See Get the default reader\_args or writer\_args for a format for a description of how to get the default reader and writer arguments for a given format, and use help(openbabel\_toolkit.read\_molecules) and help(openbabel\_toolkit.open\_molecule\_writer) to get a more human-readable description.

# 6.17 CDK-specific SMILES reader\_args and writer\_args

In this section you'll learn how to pass toolkit-specific parameters to the CDK toolkit functions to parse and create a SMILES string. You will need the CDK JAR file on your CLASSPATH and the JPype Java/Python adapter installed. (See the [installation guide for help]).

By default CDK will find a Kekule assignment of the input SMILES:

```
>>> from chemfp import cdk_toolkit
>>> cdk_toolkit.parse_molecule("oC", "smistring")
Traceback (most recent call last):
File "<stdin>", line 1, in <module>
...
File "<string>", line 1, in raise_tb
chemfp.ParseError: CDK cannot parse the SMILES 'oC': a valid kekulé structure could not_
_____be assigned
```

This can be disabled with the kekulise=False reader argument:

```
>>> mol = cdk_toolkit.parse_molecule("oC", "smistring", reader_args={"kekulise": False})
>>> [a.isAromatic() for a in mol.atoms()]
[True, False]
```

I'm not sure why you would need it, but it's there.

The CDK writer\_args are more interesting. The default SMILES writer generates the SMILES in Kekule form:

```
>>> mol = cdk_toolkit.parse_molecule("c1ccccc1[160H]", "smistring")
>>> cdk_toolkit.create_string(mol, "smistring")
'C1=CC=C(C=C1)[160H]'
```

CDK uses a flavor parameter similar to how OpenEye's flavor system works. I'll use first specify the "Default" flavor, then use "???" to cause the flavor parser to fail and show a list of possible options:

CDK has an a lot of options! Let's try a few. First, use aromatic symbols instead of Kekule form:

Now, also disable isomeric SMILES:

```
>>> cdk_toolkit.create_string(mol, "smistring",
... writer_args={"flavor": "Default,UseAromaticSymbols,-Isomeric"})
'Oc1ccccc1'
```

If you know the CDK toolkit then you should be able to figure out how to use these flavor flags.

# 6.18 Get the default reader\_args or writer\_args for a format

In this section you'll learn how to get the default reader\_args and writer\_args for a given format.

As you've seen, each toolkit format can have its own <code>reader\_args</code> and <code>writer\_args</code> parameters, and chemfp layers its own format types (like "smistring") on top of the native formats. It's easy to forget the specific parameters for a given format, much less the default values.

The  $get\_default\_reader\_args()$  and  $get\_default\_writer\_args()$  methods of the Format object return the respective default arguments:

```
>>> from chemfp import rdkit_toolkit
>>> fmt = rdkit_toolkit.get_format("smi")
```

```
>>> fmt.get_default_reader_args()
{'sanitize': True, 'has_header': False, 'delimiter': None}
>>> fmt.get_default_writer_args()
{'isomericSmiles': True, 'kekuleSmiles': False, 'canonical': True,
'allBondsExplicit': False, 'allHsExplicit': False, 'cxsmiles': False,
'delimiter': None}
```

You can sometimes use this information to see how chemfp maps its format types to the toolkit parameters. In RDKit, the difference between chemfp's "smi" and "can" formats is that *isomericSmiles* is True for the first and False for the second:

```
>>> rdkit_toolkit.get_format("can").get_default_writer_args()
{'isomericSmiles': False, 'kekuleSmiles': False, 'canonical': True,
'allBondsExplicit': False, 'allHsExplicit': False, 'cxsmiles': False,
'delimiter': None}
```

While writing this documentation I realized that the OEChem toolkit shows neither the default flavor nor the default aromaticity for a given format type. I will likely improve that in a future version of chemfp.

### 6.19 Convert text settings into reader and writer arguments

In this section you'll learn how to convert text-based configuration settings into the appropriate reader\_args or writer\_args dictionary.

The reader\_args and writer\_args take native Python values, including integers and booleans. In practice these will often be defined in a configuration file, through command-line options, or as CGI parameters. The Format methods get\_reader\_args\_from\_text\_settings() and get\_writer\_args\_from\_text\_settings() convert a text-based settings dictionary into the appropriate arguments dictionary with native Python objects as values. (These are methods of the Format object, because the parameter details are format-specific.)

The following shows an example using the RDKit toolkit's "sdf" format to get  $reader\_args$  from a dictionary of text settings:

The boolean setting parser converts "true", "True", and "1" to Python's True, and "false", "False", and "0" to Python's False. Otherwise it raises a ValueError.

The following shows an equivalent example for RDKit's SDF writer\_args:

WARNING: these functions will ignore unknown keys. This was done to allow the text settings dictionary to contain settings for other toolkits and formats. As a result, typos are harder to detect, because they will be ignored.

See argparse text settings to reader and writer args for an example of converting text settings from the command-line into reader and writer arguments.

### 6.20 Multi-toolkit reader\_args and writer\_args

In this section you'll learn how to configure reader\_args and writer\_args so the same dictionary can be used to configure multiple toolkits and formats.

Sometimes you don't know which toolkit will be used for parsing, but you do know that you want Open Babel, OEChem, and RDKit to act in non-standard ways. For example, the choice of toolkit may depend on the user-defined fingerprint type, or simply (as in the following example) depend on user input.

The reader\_args and writer\_args will ignore unknown parameters, which lets you combine arguments for different toolkits into a single dictionary. As the toolkits use completely different parameter names (except a couple, like "delimiter", which are supposed to act the same for all toolkits), there's no conflict in the names for a given format.

The following defines a reader\_args dictionary and a writer\_args dictionary with parameters for each supported toolkit, then enters a loop. The loop asks the user for a SMILES string, or the name of the toolkit to use, or "q" to quit the loop. It will parse each SMILES into a molecule, then generate a SMILES output, although with decidedly strange parameters:

```
from __future__ import print_function # Only needed in Python 2
import chemfp
from chemfp import rdkit toolkit as T # use your default toolkit of choice
#from chemfp import openeye_toolkit as T
#from chemfp import openbabel_toolkit as T
#from chemfp import cdk_toolkit as T
 raw_input # Python 2 name
except NameError:
 raw_input = input # Python 3
reader_args = {
   "sanitize": False, # RDKit,
   "openeye.*.flavor": "Default, Strict",
                                          # OEChem
   "aromaticity": "none", # OEChem
}
writer_args = {
```

```
"kekuleSmiles": True, # RDKit
   "canonicalization": "anticanonical", # Open Babel
  "aromaticity": "daylight", # OEChem
   "cdk.*.flavor": "Default, UseAromaticSymbols", # CDK
}
print("Using", T.name, "toolkit")
while 1:
  query = raw_input("SMILES, toolkit name, or 'q' to quit? ")
  if not query or query == "q":
   break
  if query in ("rdkit", "openeye" ,"openbabel", "cdk"):
   try:
       T = chemfp.get toolkit(query)
   except ValueError:
       print("Toolkit %r not available" % (query,))
   print("Using", T.name, "toolkit")
  mol = T.parse_molecule(query, "smistring", reader_args=reader_args, errors="ignore")
  if mol is None:
   print("Toolkit", T.name, "could not parse query as SMILES")
   continue
  smiles = T.create_string(mol, "smistring", writer_args=writer_args, errors="ignore")
  if not smiles:
   print("Toolkit", T.name, "could not convert the molecule to SMILES")
   continue
  print(" -->", smiles)
```

I saved the above to a script and then ran it. It starts using RDKit, where I've set the reader's "sanitize" to False so RDKit won't perceive aromaticity on input, and set the writer's "kekuleSmiles" to show explicit aromatic bond types:

```
Using rdkit toolkit
SMILES, toolkit name, or 'q' to quit? C1=CC=CC=C10
--> OC1=CC=CC=C1
SMILES, toolkit name, or 'q' to quit? c1ccccc10
--> OC1:C:C:C:C:C:1
```

I then switch to the OpenEye toolkit, show that it is operating with "strict" added to the default reader flavor, and convert a couple of SMILES to canonical SMILES to show the output uses the Daylight aromaticity model instead of the default:

```
SMILES, toolkit name, or 'q' to quit? openeye
SMILES, toolkit name, or 'q' to quit? C==C
Warning: Problem parsing SMILES:
Warning: Bond without end atom.
Warning: C==C
Warning: ^
```

```
Toolkit openeye could not parse query as SMILES
Using openeye toolkit
SMILES, toolkit name, or 'q' to quit? C1=CC=CC=C10
--> c1ccc(cc1)0
SMILES, toolkit name, or 'q' to quit? c1ccccc10
--> c1ccc(cc1)0
```

I then switch to the Open Babel toolkit and show that it generates "anti-canonical" SMILES, where the spanning tree priority order for SMILES output is randomly assigned:

```
SMILES, toolkit name, or 'q' to quit? openbabel
Using openbabel toolkit
SMILES, toolkit name, or 'q' to quit? C1=CC=CC=C10
--> Oc1ccccc1
SMILES, toolkit name, or 'q' to quit? C1=CC=CC=C10
--> Oc1ccccc1
SMILES, toolkit name, or 'q' to quit? C1=CC=CC=C10
--> c1ccc(cc1)0
SMILES, toolkit name, or 'q' to quit? C1=CC=CC=C10
--> Oc1ccccc1
SMILES, toolkit name, or 'q' to quit? c1ccccc10
--> Oc1ccccc1
SMILES, toolkit name, or 'q' to quit? c1ccccc10
--> c1c(0)cccc1
SMILES, toolkit name, or 'q' to quit? q
```

Finally I switch to CDK and show that it generate aromatic SMILES instead of Kekule:

```
SMILES, toolkit name, or 'q' to quit? cdk
Using cdk toolkit
SMILES, toolkit name, or 'q' to quit? C1=CC=CC=C10
--> C1=CC=C(C=C1)0
SMILES, toolkit name, or 'q' to quit? c1ccccc10
--> c1ccc(cc1)0
```

See argparse text settings to reader and writer args for an example of using multi-toolkit reader\_args and writer args.

# 6.21 Qualified reader and writer parameters names

In this section you'll learn how to use qualified parameter names. These give fine-grained control over the configuration options for each toolkit and format.

The previous section pointed out that the three toolkits use different parameter names, so for a given format you can combine the toolkit-specific reader\_args into one unified dictionary and writer\_args into another unified dictionary. However, within a toolkit the same parameter name can be reused for different formats, with different meanings.

This best example is for the <code>chemfp.openeye\_toolkit</code>, where the <code>reader\_args</code> and <code>writer\_args</code> for all formats support the "flavor" and "aromaticity" parameters. The following shows examples where I might use a different flavor for the SMILES and InChI outputs, to get something other than the default representation:

```
>>> from chemfp import openeye_toolkit
>>> mol = openeye_toolkit.parse_molecule("CC([0-])=0", "smistring")
```

```
>>>
>>> openeye_toolkit.create_string(mol, "smistring")
'CC(=0)[0-]'
>>> openeye_toolkit.create_string(mol, "smistring",
... writer_args={"flavor": "Default|ImpHCount"})
'[CH3]C(=0)[0-]'
>>>
>>> openeye_toolkit.create_string(mol, "inchistring")
'InChI=1S/C2H402/c1-2(3)4/h1H3,(H,3,4)/p-1'
>>> openeye_toolkit.create_string(mol, "inchistring",
... writer_args={"flavor": "Default|FixedHLayer"})
'InChI=1/C2H402/c1-2(3)4/h1H3,(H,3,4)/p-1/fC2H302/q-1'
```

Chemfp uses "qualified" parameter names to handle this situation. For example, the qualified name "smistring.flavor" is the flavor parameter for the smistring format:

WARNING: there are six SMILES-related formats ("smi", "can", "usm", "smistring", "canstring", and "usmstring") so to be complete you'll need to specify values for all of them. There are also two InChI-related formats ("inchi" and "inchistring").

A "fully qualified" name looks like "openeye.smistring.flavor". The first term is the toolkit, the second the format name, and the last the parameter name. At present there little need for fully qualified names because most parameter names are either unique to a toolkit and format type, or (like 'delimiter') supposed to be identical across all toolkits. The major exception is 'flavor', used by all of the OpenEye formats as well as the RDKit "fasta", "sequence", and "pdb" formats.

The following demonstration, which is more a parlor trick than something useful, shows how to have each toolkit use a different SMILES delimiter:

```
print(toolkit_name, "sees the id", repr(id))

rdkit sees the id 'abc def'
openbabel sees the id 'abc'
openeye sees the id 'abc def\tghi'
cdk sees the id 'def\tghi'
```

(As a reminder, the 'delimiter' implementation is not perfect. A toolkit may accept the first whitespace after the SMILES term as a valid delimiter even if it doesn't match the actual parameter, and a toolkit may decide to stop parsing the SMILES term at the first whitespace.)

The final type of qualified parameter looks like "openeye.\*.aromaticity", where the first term is the toolkit name, the second term is "\*", and the third term is the parameter name. This is most useful if you want OEChem to enforce the same aromaticity across all formats, or have the RDKit parsers ignore sanitization, with configuration entries like:

```
{"openeye.*.aromaticity": "daylight",
    "rdkit.*.sanitize": False}
```

However, as only OEChem supports "aromaticity" and only RDKit supports "sanitize", you could also write this as simply:

```
{"aromaticity": "daylight",
"sanitize": False}
```

### 6.22 Qualified parameter priorities

In this section you'll learn the priority order when multiple terms try to specify the same parameter.

In the previous section you learned how "delimiter", "smi.delimiter", "rdkit.\*.delimiter" and "rd-kit.smi.delimiter" can all be used to set the delimiter style for RDKit's "smi" format. If more then one term is specified, which one wins?

Chemfp checks for the parameters in the following order:

- 1. rdkit.smi.delimiter
- 2. rdkit.\*.delimiter
- 3. smi.delimiter
- 4. delimiter

The parameter with the highest ranking determines the setting, as the following shows:

```
>>> id
'methane 16.04246'
>>> id, mol = T.parse_id_and_molecule("C methane 16.04246", "smi",
... reader_args={"rdkit.*.delimiter": "to-eol",
... "rdkit.smi.delimiter": "whitespace"})
>>> id
'methane'
```

One way to remember it is the longest name has priority.

It can be confusing to have a large dictionary with multiple format and toolkit qualifiers. The <code>get\_unqualified\_reader\_args()</code> and <code>get\_unqualified\_writer\_args()</code> methods of <code>Format</code> object will return the fully unqualified <code>reader\_args</code> and <code>writer\_args</code> for that format:

This can also be helpful if you think you made a typo; get the unqualified *reader\_args* and see if the result has the arguments you think it should have.

# 6.23 Qualified names and text settings

In this section you'll learn how the qualified names also apply to text settings.

Earlier you learned that text settings are string-based keys and values, which might come from the commandline, a configuration file, or some other text-based source. These need to be converted into Python values before they can be used as reader args or writer args.

A *Format* object can convert a dictionary of text settings into the correct argument dictionary. To get a Format object, ask the toolkit for the format of the given name:

```
>>> from chemfp import rdkit_toolkit as T
>>> fmt = T.get_format("sdf")
>>> fmt.get_default_reader_args()
{'sanitize': True, 'removeHs': True, 'strictParsing': True, 'includeTags': True}
```

The section Convert text settings into reader and writer arguments showed how to convert the text settings with unqualified names into a reader args dictionary:

```
>>> fmt.get_reader_args_from_text_settings({
    ... "strictParsing": "false",
```

```
"removeHs": "false",
... })
{'removeHs': False, 'strictParsing': False}
```

The text settings dictionary also supports qualified parameter names, including handling the priority resolution described in *Qualified parameter priorities*:

If you stare at it for a bit you'll see that "sdf.strictParsing" has a higher priority than "strictParsing" and "rdkit.\*.removeHs" is higher than "removeHs", which is how it's supposed to work.

#### 6.24 Read molecules from an SD file or stdin

In this section you'll learn how to read an SD file and iterate through its records as toolkit molecules. You will need Compound\_099000001\_099500000.sdf.gz from PubChem.

Time to get back to molecules! The *chemfp.toolkit.read\_molecules()* function reads molecules from a structure file:

```
from __future__ import print_function # Only needed in Python 2
from chemfp import rdkit_toolkit as T # use your toolkit of choice
for mol in T.read_molecules("Compound_099000001_099500000.sdf.gz"):
    print(T.create_string(mol, "smistring"))
```

By default it uses the filename extension to figure out the format and compression type. You can specify it yourself, if you wish, using the *format* option:

Examples of valid format values are "smi", "can", and "usm" (but not the \*string variants like "smistring", because those aren't record-based formats), and "sdf", as well as gzip-compressed versions like "smi.gz" and "sdf.gz".

(For Open Babel the ".gz" extension does nothing as Open Babel will auto-detect and handle gzip compressed input. Chemfp's RDKit interface also support zstandard-compressed files with the extension ".zst" if the Python package "zstandard" is installed.)

If the first parameter (the *source* parameter) is the Python None value then the toolkit will read from stdin. As there's no filename, chemfp can't look at the extension to figure out the format, so it assumes the input is in "smi" format, that is, an uncompressed SMILES file.

Therefore, to read an SD file from stdin you must specify the format. The following program reads a gzip compressed SD file from stdin, convert it to SMILES, and find the 10 most common characters used in the SMILES strings:

```
# This file is named 'count_smiles_characters.py'
from __future__ import print_function # Only needed in Python 2
from collections import Counter
from chemfp import rdkit_toolkit as T # use your toolkit of choice

symbol_counts = Counter()
for mol in T.read_molecules(None, "sdf.gz"):
    smiles = T.create_string(mol, "smistring")
    symbol_counts.update(smiles)
for symbol, count in symbol_counts.most_common(10):
    print("%7d: %r" % (count, symbol))
```

Now to try it on a data set:

```
% python count_smiles_characters.py < Compound_099000001_099500000.sdf.gz
114190: 'c'
96119: 'C'
50541: '('
50541: ')'
33054: '1'
29000: '0'
22227: '='
19716: '2'
19276: '@'
18420: 'N'</pre>
```

#### 6.25 Read ids and molecules from an SD file at the same time

In this section you'll learn how to read an SD file and iterate through its records as the two-element tuple of (id, molecule). You will need the Compound\_099000001\_099500000.sdf.gz from PubChem, which was used in the previous section.

In an earlier section, Parse the id and the molecule at the same time, you learned how to parse a structure record to get both the identifier and the molecule at the same time. The toolkit function chemfp.toolkit. read\_ids\_and\_molecules() is the equivalent for reading from a structure file.

In the following example I'll use the RDKit toolkit to create a tab-separated file with the id in the first column, the number of carbon atoms in the second, and the SMILES in the third. For brevity, I'll display only the first 10 records, which also gives a nice example of when to use itertools.islice:

```
from __future__ import print_function # Only needed in Python 2
from itertools import islice
from chemfp import rdkit_toolkit
filename = "Compound_099000001_099500000.sdf.gz"

with rdkit_toolkit.read_ids_and_molecules(filename) as reader:
    for id, mol in islice(reader, 0, 10):
        num_carbons = sum(1 for atom in mol.GetAtoms() if atom.GetAtomicNum() == 6)
```

```
smiles = rdkit_toolkit.create_string(mol, "smistring")
print(id, num_carbons, smiles, sep="\t")
```

(See the next section for a description of how the line with the sum() works.)

Here's the output, and a spot check shows the carbon counts are correct:

```
99000039
                   21
                               O=C(CC[C@H]1NC(=0)c2cccc2NC1=0)Nc1cccc2ncccc12
99000230
                               \texttt{COc1ccc}(\texttt{S(=0)}(=\texttt{0})\texttt{N2CCC}(\texttt{C(=0)}\texttt{N[C@H]}(\texttt{C)}\texttt{C(=0)}\texttt{NCc3ccco3})\texttt{CC2})\texttt{cc1}
                   21
99002251
                               Cc1ccc(N/C=C(/C#N)C(=0)NC(=0)Cc2cccc2)c(0)c1
                   19
99003537
                               CC(C)C[C@H](NC(=0)Cc1cn(C)c2ccccc12)c1nc2ccccc2[nH]1
                   23
99003538
                   23
                               CC(C)C[C@@H](NC(=0)Cc1cn(C)c2ccccc12)c1nc2ccccc2[nH]1
99005028
                   19
                               C[C@H](OC(=0)/C=C/c1ccccc1)C(=0)N[C@QH]1CCCC[C@QH]1C
99005031
                   19
                               C[C@H](OC(=0)/C=C/c1cccc1)C(=0)N[C@H]1CCCC[C@@H]1C
                               Cc1ccc(C)c(S(=0)(=0)N2CCC[C@H](C(=0)NC3CCCCC3)C2)c1
99006292
                   20
99006293
                   20
                                \texttt{Cc1ccc}(\texttt{C}) \, \texttt{c}(\texttt{S}(=\texttt{O}) \, (=\texttt{O}) \, \texttt{N2CCC} \, [\texttt{C@@H}] \, (\texttt{C}(=\texttt{O}) \, \texttt{NC3CCCCC3}) \, \texttt{C2}) \, \texttt{c1} 
99006597
                   25
                               CS/C(N=CN(C)C)=C(\C\#N)[P+](c1ccccc1)(c1ccccc1)c1ccccc1
```

What's fun is that RDKit and OEChem both implement mol.GetAtoms() and atom.GetAtomicNum() so it's trivial to port the above from RDKit to OEChem; replace rdkit\_toolkit with openeye\_toolkit!

The Open Babel port isn't quite as easy because Open Babel has a different way to get the atoms in a molecule. To make it easy to copy and paste, here's the equivalent code for Open Babel:

Finally, here's the implementation for CDK. (This only works with Python 3 because the jpype Java/Python adapater doesn't support Python 2):

```
from itertools import islice
from chemfp import cdk_toolkit
filename = "Compound_099000001_099500000.sdf.gz"

with cdk_toolkit.read_ids_and_molecules(filename) as reader:
   for id, mol in islice(reader, 0, 10):
      num_carbons = sum(a.getAtomicNumber() == 6 for a in mol.atoms())
      smiles = cdk_toolkit.create_string(mol, "smistring")
      print(id, num_carbons, smiles, sep="\t")
```

(If you run this you'll notice that CDK's SDF reader keeps the hydrogens as explicit atoms because the above generates SMILES strings like C1([H])=C([H])C2=C(C([H])=C1.....)

# 6.26 Read ids and molecules using an SD tag for the id

In this section you'll learn how to use the  $id\_tag$  to get the id from one of the SD tags, rather than from the record's title. You will need the Compound\_099000001\_099500000.sdf.gz from PubChem, which was used in the previous section. I'll also explain an idiom for how to count the number of records in an iterator.

Sometimes you would rather use a tag value as the id rather than the title line of the SDF record. This is critical for ChEBI data set and older ChEMBL data sets, which leave the title line (mostly) blank. In this case, use the  $id\_tag$  to specify the tag to use.

The following example modifies the RDKit code from previous code to use PUB-CHEM IUPAC SYSTEMATIC NAME as the id, rather than the title line:

The output is:

```
3-[(3R)-2,5-bis(oxidanylidene)-3,4-dihydro-1H-1,4-benzodiazepin-3-yl]-N-quinolin-5-yl-
                          O=C(CC[C@H]1NC(=O)c2cccc2NC1=O)Nc1cccc2ncccc12
propanamide
                                                                                       N-[(2R)-1-
(furan-2-vlmethylamino)-1-oxidanylidene-propan-2-vl]-1-(4-methoxyphenyl)sulfonyl-piperidine-
                            COc1ccc(S(=O)(=O)N2CCC(C(=O)N[C@H](C)C(=O)NCc3ccco3)CC2)cc1
4-carboxamide
(Z)-2-cyano-3-[(4-methyl-2-oxidanyl-phenyl)amino]-N-(2-phenylethanoyl)prop-2-enamide
Cc1ccc(N/C=C(/C\#N)C(=O)NC(=O)Cc2cccc2)c(O)c1
                                                         N-[(1S)-1-(1H-benzimidazol-2-yl)-3-methyl-
butyl]-2-(1-methylindol-3-yl)ethanamide 23 CC(C)C[C@H](NC(=O)Cc1cn(C)c2ccccc12)c1nc2cccc2[nH]1
N-[(1R)-1-(1H-benzimidazol-2-yl)-3-methyl-butyl]-2-(1-methylindol-3-yl)ethanamide
23
             CC(C)C[C@@H](NC(=O)Cc1cn(C)c2cccc12)c1nc2cccc2[nH]1
                                                                                 [(2S)-1-[[(1R,2S)-
2-methylcyclohexyllamino]-1-oxidanylidene-propan-2-yll
                                                                         (E)-3-phenylprop-2-enoate
              C[C@H](OC(=O)/C=C/c1ccccc1)C(=O)N[C@@H]1CCCC[C@@H]1C
                                                                                         [(2S)-1-
[[(1S,2S)-2-methylcyclohexyl]amino]-1-oxidanylidene-propan-2-yl]
                                                                                (E)-3-phenylprop-
                                   C[C@H](OC(=O)/C=C/c1cccc1)C(=O)N[C@H]1CCCC[C@@H]1C
2-enoate
(3S)-N-cyclohexyl-1-(2,5-dimethylphenyl)sulfonyl-piperidine-3-carboxamide
                                                                                              20
Cc1ccc(C)c(S(=O)(=O)N2CCC[C@H](C(=O)NC3CCCCC3)C2)c1
                                                                         (3R)-N-cyclohexyl-1-(2,5-
dimethylphenyl) sulfonyl-piperidine-3-carboxamide 20\ Cc1ccc(C)c(S(=O)(=O)N2CCC[C@@H](C(=O)NC3CCCCC3)C2)c1
[(E)-1-cyano-2-(dimethylaminomethylideneamino)-2-methylsulfanyl-ethenyl]-triphenyl-phosphanium
CS/C(N=CN(C)C)=C(C\#N)[P+](c1cccc1)(c1cccc1)c1cccc1
You might have found the "sum(1 for atom in ....)" a bit odd. I agree with you. It is, however, the
```

break it down so you can understand how it works.

A list comprehension iterates through each element in an iterator (in the following it iterates over the characters in a string) and returns a list:

standard way in Python to count the number of elements in the iterator which match a given condition. I'll

```
>>> [c for c in "Hello"]
['H', 'e', 'l', 'o']
```

Add an "if" to it to operate on only a subset of the characters:

```
>>> [c for c in "Hello" if c != "l"]
['H', 'e', 'o']
```

I could use len() of this to get the number of non-"l" characters, but that would require making a list only to throw it away. There's another route to the same answer. To get there, use the value 1 for each character rather than the character itself:

```
>>> [1 for c in "Hello" if c != "l"]
[1, 1, 1]
```

Then use sum() to sum the values, which in this case is also the number of elements in the list:

```
>>> sum([1 for c in "Hello" if c != "l"])
3
```

Unlike len(), sum() only needs an iterator, not a list. I can replace the list comprehension with a generator comprehension, to get:

```
>>> sum(1 for c in "Hello" if c != "l")
3
```

Going back to the RDKit/OEChem expression:

```
num_carbons = sum(1 for atom in mol.GetAtoms() if atom.GetAtomicNum() == 6)
```

I hope you can see how this counts the number of atoms in the molecule whose atomic number is 6. Or, if you want another way to think of it, the expression is the same as:

```
num_carbons = 0
for atom in mol.GetAtoms():
   if atom.GetAtomicNum() == 6:
        num_carbons += 1
```

# 6.27 Read from a string instead of a file

In this section you'll learn how to read molecules from a string containing multiple SMILES records.

In the section *Read molecules from an SD file or stdin* you learned how to read molecules from a structure file or stdin. Sometimes the input structures come from a string. For example, if a web page has a form with a text box, where users can paste in a set of SMILES or SDF records and submit the form, then the web application on the server will likely receive those records as a single string.

When the records are in a string instead of a file, use <code>chemfp.toolkit.read\_molecules\_from\_string()</code>. It's very similar to <code>chemfp.toolkit.read\_molecules()</code>, except that the first parameter, <code>content</code>, is the string instead of the source filename, and the second parameter, <code>format</code>, is required. (chemfp doesn't try to auto-detect the format from the content.)

The following reads the records from a string containing two simple SMILES records and prints the number of non-implicit atoms for each one. I've included implementations for all three toolkits; use the one(s) that are available to you:

When I run the above (on a computer where all four supported toolkits are installed), the above reports:

```
RDKit: 1
RDKit: 2
0EChem: 1
0EChem: 2
0pen Babel: 1
0pen Babel: 2
CDK: 1
CDK: 2
```

I would like to improve the output a bit to also include the record id in the output. The toolkit function <code>chemfp.toolkit.read\_ids\_and\_molecules\_from\_string()</code> is similar to <code>chemfp.toolkit.read\_molecules\_from\_string()</code> except that it iterates through the (id, toolkit molecule) tuple rather than just the molecule:

You can see that the default SMILES reader assumes the rest of the line is the id. The file and string record readers take a reader\_args parameter just like chemfp.toolkit.parse\_id\_and\_molecule(). I'll specify the "whitespace" delimiter so the parser uses only the second word as the id:

See Specify a SMILES delimiter through reader\_args for more details about setting the "delimiter" reader\_args.

The string readers, like the file readers, also support the  $id\_tag$  option to get the id from an SD tag instead of the title line. See Read ids and molecules using an SD tag for the id for more details about using the  $id\_tag$ .

### 6.28 The reader may reuse molecule objects!

In this section you'll learn that the OEChem and Open Babel toolkits reuse the same molecule object, which means you can't save a molecule for later.

Suppose you want to read all of the molecules from a file into a list. It's very tempting to write it as:

```
>>> import chemfp
>>> from chemfp import openeye_toolkit as T
>>> mols = list(T.read_molecules_from_string("C methane\n0 water\n", "smi"))
```

This does not work for the openeye\_toolkit or the openbabel\_toolkit:

This is because the underlying reader for those two toolkits reuse the same molecule object. You can see that in the above, which returns the same OEGraphMol object (with id 0x10326ba40) for each record. The reason why OpenEye decided to reuse the object is to get better performance. Clearing the molecule object is faster than deleting it and reallocating a new one.

In addition, the OEChem reader code does a "clear molecule" followed by "read next record or stop". At the end of the file there is no record, so the reader ends with a clear molecule. That explains why the OEGraphMol produces an empty SMILES string for the last couple of lines in the above code.

The only portable way to load a list of molecules is to use chemfp.toolkit.copy\_molecule(), as in:

I don't really like this solution because the RDKit reader doesn't need a copy, so the extra copy is pure overhead.

Future versions of chemfp will likely have a *reader\_arg* to specify if it's okay to reuse a molecule object or if a new one must be used each time.

#### 6.29 Write molecules to a SMILES file

In this section you will learn how to write toolkit molecules into a structure file. You will need Compound\_099000001\_099500000.sdf.gz from PubChem.

Chemfp can write toolkit molecules to a file in a given format. I'll start by making an RDKit molecule, though the same API works with Open Babel and OEChem:

```
>>> from chemfp import rdkit_toolkit as T # use your toolkit of choice
>>> mol = T.parse_molecule("c1ccccc10 phenol", "smi")
```

Use *chemfp.toolkit.open\_molecule\_writer()* to create a writer object. By default it will look at the output filename extension to figure out the format and compression type, and if that doesn't work it defaults to SMILES output:

```
>>> writer = T.open_molecule_writer("example.smi")
```

The fingerprint writer has several methods to write a molecule to the file. If you write a molecule by itself it will use the molecule's own id (in this case, "phenol"):

```
>>> writer.write_molecule(mol)
```

Or, use write\_id\_and\_molecule() if you want to specify an alternate id:

```
>>> writer.write_id_and_molecule("something else", mol)
```

WARNING: The toolkit implementation may temporarily change the toolkit molecule's own identifier in order to get the correct output. You should not alter the molecule's id in another thread while calling this function.

Let's see if it worked, by closing the writer (otherwise some of the output may be in an internal buffer) and reading the file:

```
>>> writer.close()
>>> print(open("example.smi").read())
Oc1ccccc1 phenol
Oc1ccccc1 something else
```

The <code>write\_molecules()</code> method is optimized for passing in a list or iterator of molecule objects, and <code>write\_ids\_and\_molecules()</code> is the equivalent if you have (id, molecule) pairs. For example, the following converts an SD file into a compressed SMILES file:

```
from chemfp import rdkit_toolkit as T # use your toolkit of choice
reader = T.read_molecules("Compound_099000001_099500000.sdf.gz")
writer = T.open_molecule_writer("example.smi.gz")
writer.write_molecules(reader)

# These are optional, but recommended. Even better would be
# to use the context manager described in the next section.
writer.close()
reader.close()
```

If you have a list (or iterator) of molecules, then use the write molecules() method.

The open function also supports the *format* parameter, so you can specify "smi" or "sdf.gz" some other combination of structure format and compression type:

```
writer = T.open_molecule("wrong_extension.smi", format="sdf.gz")
```

If the zstandard package is available then use the .zst suffiz for ZStandard compression.

## 6.30 Reader and writer context managers

In this section you'll learn how to use chemfp's readers and writers to close the file, rather than depend on Python's garbage collector or manual "close()". You will need Compound\_099000001\_099500000.sdf.gz from PubChem.

In the previous section, Write molecules to a SMILES file, you learned how to convert an SD file into a SMILES file. At the end was a small program with optional "close()" statements. These are optional because Python's garbage collector and chemfp work together. When a chemfp reader or writer is no longer needed, the garbage collector asks chemfp to clean up, and chemfp closes the native toolkit's file object.

This is fine for a simple script or function, but sometimes you want more control over when the file is closed. You can call the writer's <code>close()</code> method yourself, but it's really easy to forget to do that.

Python supports "context managers", which carry out certain actions when a block of code finishes. See **PEP 343** if you want the full details. For chemfp you only need to know that the reader and writer context managers will always close the file at the end of the block.

A normal Python file context manager works like this:

```
>>> with open("example.txt", "w") as outfile:
... outfile.write("I am here.\n")
...
>>> print(repr(open("example.txt").read()))
'I am here.\n'
```

If instead I use one file object to write the data and another to read the file, without a flush() or close() by the writer, then there's a syncronization problem:

```
>>> outfile = open("example.txt", "w")
>>> outfile.write("I am here.\n")
>>> print(repr(open("example.txt").read()))
''
```

Why does this print the empty string? The output text is still in an internal buffer, which isn't written to the disk until the close call:

```
>>> outfile.close()
>>> print(repr(open("example.txt").read())
'I am here.\n'
```

The same problem occurs with molecule output:

```
>>> from chemfp import rdkit_toolkit as T # can also use openbabel_toolkit
>>> mol = T.parse_molecule("C=0 carbon monoxide", "smi")
>>> writer = T.open_molecule_writer("example.smi")
>>> writer.write_molecule(mol)
>>> open("example.smi").read()
''
>>> writer.close()
>>> open("example.smi").read()
'C=0 carbon monoxide\n'
```

Note: this problem does not occur with the openeye\_toolkit. Most likely that toolkit always flushes its output buffers after each molecule.

The chemfp readers and writers support a context manager, so you can use the same solution you would for regular files:

With the context manager concept firmly in mind, the following is the way I prefer to write the conversion script from the previous section:

```
from chemfp import rdkit_toolkit as T # use your toolkit of choice
with T.read_molecules("Compound_099000001_099500000.sdf.gz") as reader:
   with T.open_molecule_writer("example.smi.gz") as writer:
    writer.write_molecules(reader)
```

That said, if you really want to depend on the garbage collector, you can also write it with one (or two) fewer lines:

```
from chemfp import rdkit_toolkit as T # use your toolkit of choice
T.open_molecule_writer("example.smi.gz").write_molecules(
    T.read_molecules("Compound_099000001_099500000.sdf.gz"))
```

# 6.31 Write molecules to stdout in a specified format

In this section you'll learn how to specify the structure writer's output format, and to write to stdout instead of to a file.

The function  $chemfp.toolkit.open\_molecule\_writer()$  supports a format parameter, in case you don't want chemfp to determine the output format and compression based on the filename extension.

For example, if the destination is None (instead of a filename) then chemfp will write the output to stdout. Since Python's None object doesn't have an extension, it will write the molecules as uncompressed SMILES. If you want to write to stdout in SDF format you will have to specify the output format, like the following:

```
>>> from chemfp import rdkit toolkit as T # use your toolkit of choice
>>> mol = T.parse_molecule("0=0 molecular oxygen", "smi")
>>> with T.open_molecule_writer(None, "sdf") as writer:
       writer.write_molecule(mol)
molecular oxygen
    RDKit
 2 1 0
          0 0 0 0 0
                            0999 V2000
   0.0000
             0.0000
                       0.0000 0
                                  0
                                     0
                                        0
                                          0
                                             0
                                                0
                                                   0
                                                      0
   0.0000
             0.0000
                       0.0000 0
                                    0 0 0
                                             0
 1 2 2 0
M END
$$$$
>>> with T.open_molecule_writer(None, "inchikey") as writer:
     writer.write_molecule(mol)
MYMOFIZGZYHOMD-UHFFFAOYSA-N molecular oxygen
```

# 6.32 Write molecules to a string (and a bit of InChI)

In this section you'll learn how to write toolkit molecules into memory, and when finished to get the result as a string.

The previous sections showed examples of writing molecules to a file or to stdout. Sometimes you want to save the records as a string; perhaps to send a response for a web request or display the contents in a text pane of a GUI. The function <code>chemfp.toolkit.open\_molecule\_writer\_to\_string()</code> creates a <code>MoleculeStringWriter</code> which stores the output records into memory. Once the writer is closed, the memory contents can be retrieved as a string with <code>MoleculeStringWriter.getvalue()</code>.

For a bit of variation, the following example uses the "inchi" output format, and the openbabel\_toolkit:

```
>>> from chemfp import openbabel_toolkit as T # use your toolkit of choice
>>> alanine = T.parse_molecule("O=C(0)[C@OH](N)C alanine", "smi")
>>> glycine = T.parse_molecule("C(C(=0)0)N glycine", "smi")
>>> writer = T.open_molecule_writer_to_string("inchi")
>>> writer.write_molecules([alanine, glycine])
>>> writer.close()
>>> print(writer.getvalue())
InChI=1S/C3H7NO2/c1-2(4)3(5)6/h2H,4H2,1H3,(H,5,6)/t2-/mO/s1 alanine
InChI=1S/C2H5NO2/c3-1-2(4)5/h1,3H2,(H,4,5) glycine
```

You should know that there's no well-defined "inchi" file format, only an InChI string. I decided to follow Open Babel's lead and say that the "inchi" format has one record per line, where each line contains the InChI string followed by a delimiter, followed by the id (if available) on the rest of the line.

The InChI output writer\_args supports an "include\_id" parameter. The default, True, includes the id, while the following example sets it to False to have only the InChI string on the line:

I also used the context manager so the code would be a bit shorter and, I think, clearer. It's up to you to decide if write\_molecules() with a 2-element list is clear than two write\_molecule() lines.

## 6.33 Handling errors when reading molecules from a string

In this section you'll learn how to ignore errors and improve error reporting when reading from a string, rather then accept the default of raising an exception and stopping. The examples will use a string containing SMILES records, but the same principles apply to any format.

If you've used the chemfp readers on real-world data sets you might have noticed that the RDKit and Open Babel ones sometimes raise an exception, saying that a given record could not be parsed. I'll demonstrate with a string containing four SMILES records:

RDKit doesn't like the pentavalent nitrogen, and chemfp's rdkit\_toolkit stops processing at that record:

```
>>> from chemfp import rdkit_toolkit
>>> with rdkit_toolkit.read_ids_and_molecules_from_string(content, "smi") as reader:
       for id, mol in reader:
           print(id)
. . .
methane
[16:11:12] Explicit valence for atom # 1 N, 5, is greater than permitted
Traceback (most recent call last):
 File "<stdin>", line 2, in <module>
 File "chemfp/_rdkit_toolkit.py", line 342, in _iter_read_smiles_ids_and_molecules
   error_handler.error("RDKit cannot parse the SMILES %s" % (_compat.myrepr(smiles),),_
→location)
 File "chemfp/io.py", line 112, in error
    _compat.raise_tb(ParseError(msg, location), None)
 File "<string>", line 1, in raise_tb
chemfp.ParseError: RDKit cannot parse the SMILES 'CN(C)(C)(C)C',
file '<string>', line 2, record #2: first line is 'CN(C)(C)(C)C pentavalent nitrogen'
```

Open Babel doesn't care about the too-high valence on the nitrogen, but doesn't like the non-SMILES in the third record:

```
>>> from chemfp import openbabel toolkit
>>> with openbabel_toolkit.read_ids_and_molecules_from_string(content, "smi") as reader:
       for id, mol in reader:
           print(id)
. . .
methane
pentavalent nitrogen
_____
*** Open Babel Error in ParseSimple
 SMILES string contains a character 'Q' which is invalid
Traceback (most recent call last):
 File "<stdin>", line 2, in <module>
 File "chemfp/_openbabel_toolkit.py", line 927, in _iter_column_records
   error handler.error("Open Babel cannot parse the %s %s"
 File "chemfp/io.py", line 112, in error
    _compat.raise_tb(ParseError(msg, location), None)
 File "<string>", line 1, in raise_tb
chemfp.ParseError: Open Babel cannot parse the SMILES 'Q',
file '<string>', line 3, record #3: first line is 'Q Q-ane'
```

Neither does CDK:

```
>>> from chemfp import cdk toolkit
>>> with cdk_toolkit.read_ids_and_molecules_from_string(content, "smi") as reader:
    for id, mol in reader:
       print(id)
. . .
methane
pentavalent nitrogen
org.openscience.cdk.io.iterator.IteratingSMILESReader ERROR: Error while reading the
→SMILES from: Q Q-ane, org.openscience.cdk.exception.InvalidSmilesException: could not
⇒parse 'Q Q-ane', unexpected character:
org.openscience.cdk.io.iterator.IteratingSMILESReader ERROR: Q Q-ane
org.openscience.cdk.io.iterator.IteratingSMILESReader ERROR: ^
Traceback (most recent call last):
 File "<stdin>", line 2, in <module>
 File "/Users/dalke/cvses/cfp-3x/docs/chemfp/_cdk_toolkit.py", line 498, in _iter_read_
⇒smiles ids and molecules cdk
   error_handler.error("CDK cannot parse a SMILES record", location)
  File "/Users/dalke/cvses/cfp-3x/docs/chemfp/io.py", line 112, in error
    _compat.raise_tb(ParseError(msg, location), None)
 File "<string>", line 1, in raise_tb
chemfp.ParseError: CDK cannot parse a SMILES record, file '<string>', line 3, record #3:
→first line is 'Q Q-ane'
```

To round things out, OEChem accepts pentavalent nitrogen and skips the bad SMILES at a lower level than what chemfp uses, so there's no exception:

```
>>> from chemfp import openeye_toolkit
>>> with openeye_toolkit.read_ids_and_molecules_from_string(content, "smi") as reader:
... for id, mol in reader:
... print(id)
...
```

```
methane
pentavalent nitrogen
Warning: Problem parsing SMILES:
Warning: Q Q-ane
Warning: ^

Warning: Error reading molecule "" in Canonical stereo SMILES format.
uranium
```

I'll emphasize that point. The openeye\_toolkit uses OEChem's high-level reader, which provides no information about if OEChem skipped a record with a failure. Chemfp therefore cannot provide more information about the failures, whether as an exception or an improved error message.

I'm certain that nearly everyone wants the reader to ignore the few records that can't be parsed by the underlying toolkit. The readers and writers support the *errors* option. The default value of "strict" tells chemfp to raise an exception when it detects a parse failure, and "ignore" tells it to ignore the error and go on to the next record:

```
>>> with rdkit toolkit.read ids and molecules from string(
                  content, "smi", errors="ignore") as reader:
       for id, mol in reader:
           print(id)
. . .
methane
[16:13:45] Explicit valence for atom # 1 N, 5, is greater than permitted
[16:13:45] SMILES Parse Error: syntax error for input: 'Q'
>>> with openbabel_toolkit.read_ids_and_molecules_from_string(
                  content, "smi", errors="ignore") as reader:
        for id, mol in reader:
           print(id)
. . .
methane
pentavalent nitrogen
uranium
>>> with cdk toolkit.read ids and molecules from string
                  content, "smi", errors="ignore") as reader:
      for id, mol in reader:
       print(id)
. . .
methane
pentavalent nitrogen
org.openscience.cdk.io.iterator.IteratingSMILESReader ERROR: Error
while reading the SMILES from: Q Q-ane, org.openscience.cdk.exception.
→InvalidSmilesException:
could not parse 'Q Q-ane', unexpected character:
org.openscience.cdk.io.iterator.IteratingSMILESReader ERROR: Q Q-ane
org.openscience.cdk.io.iterator.IteratingSMILESReader ERROR: ^
uranium
```

The "strict" default comes from my long-held belief that it's better to be strict first, and detect problems early, than to let them intrude. My resolve is weakening, because it's been rare to find that I can make use of that information. The biggest counter-example is when I specify one format but the file is actually in

another format, in which case the reader skips a lot of garbage. For example, a SMILES reader, pointed to a SD file or a compressed SMILES file, will try hard to make sense of the data and end up ignoring almost everything. I haven't decided if I will change the default policy.

I've also found that the toolkits aren't that helpful at identifying which record failed. Take a look at the RDKit warning:

```
[16:13:45] Explicit valence for atom # 1 N, 5, is greater than permitted
```

It says that I did this in the late afternoon, and the reason for the failure, but says very little about the record with the problem.

To help improve this, and to send still more garbage, err, I mean helpful messages to stderr, chemfp supports a "report" errors value. It's the same as "ignore" except that it also displays more details about the failure location:

```
>>> with rdkit_toolkit.read_ids_and_molecules_from_string(
                  content, "smi", errors="report") as reader:
        for id, mol in reader:
. . .
            print(id)
. . .
methane
[16:14:52] Explicit valence for atom # 1 N, 5, is greater than permitted
ERROR: RDKit cannot parse the SMILES 'CN(C)(C)(C)C', file '<string>', line 2, record #2:
\rightarrow first line is 'CN(C)(C)(C)C pentavalent nitrogen'. Skipping.
[16:14:52] SMILES Parse Error: syntax error for input: 'Q'
ERROR: RDKit cannot parse the SMILES 'Q', file '<string>', line 3, record #3: first line_
⇒is 'Q Q-ane'. Skipping.
uranium
>>> with openbabel_toolkit.read_ids_and_molecules_from_string(
                  content, "smi", errors="report") as reader:
        for id, mol in reader:
. . .
            print(id)
. . .
methane
pentavalent nitrogen
ERROR: Open Babel cannot parse the SMILES 'Q', file '<string>', line 3, record #3: first
→line is 'Q Q-ane'. Skipping.
uranium
>>> with cdk_toolkit.read_ids_and_molecules_from_string(
                  content, "smi", errors="report") as reader:
       for id, mol in reader:
. . .
            print(id)
. . .
methane
pentavalent nitrogen
org.openscience.cdk.io.iterator.IteratingSMILESReader ERROR:
Error while reading the SMILES from: Q Q-ane, org.openscience.cdk.exception.
→ InvalidSmilesException:
could not parse 'Q Q-ane', unexpected character:
org.openscience.cdk.io.iterator.IteratingSMILESReader ERROR: Q Q-ane
org.openscience.cdk.io.iterator.IteratingSMILESReader ERROR:
ERROR: CDK cannot parse a SMILES record, file '<string>', line 3, record #3: first line
⇒is 'Q Q-ane'. Skipping.
uranium
```

The quality of the error message depends on the toolkit and the format. The best messages are for the Open Babel and RDKit SMILES readers and InChI readers, because I decided to have chemfp identify the records for those formats itself, instead of using the underlying toolkits to read the file. Chemfp still uses the underlying toolkit to convert the individual record into a native toolkit molecule.

I did this because I found the SMILES and InChI reader performance was the same, and by writing my own parsers I had the ability to report line numbers and improve the error messages.

The examples so far used the read\_ids\_and\_molecules\_from\_string function. The read\_molecules\_from\_string function also supports the errors option, with the same meaning.

```
>>> sizes = []
>>> with openbabel_toolkit.read_molecules_from_string(
... content, "smi", errors="report") as reader:
... for mol in reader:
... sizes.append(mol.NumAtoms())
...
ERROR: Open Babel cannot parse the SMILES 'Q', file '<string>', line 3, record #3: first_____
_line is 'Q Q-ane'. Skipping.
>>> sizes
[1, 6, 1]
```

## 6.34 Handling errors when reading molecules from a file

In this section you'll learn how to how to ignore errors and improve error reporting when reading from SD file, rather then accept the default of raising an exception and stopping. The examples will use an SD file, but the same principles apply to any format.

In the previous section you learned that when the readers encounter a error, the default behavior is to raise a Python exception and how to use the error parameter to ignore those errors or to provide a more detailed error report.

The file-based readers, <code>chemfp.toolkit.read\_molecules()</code> and <code>chemfp.toolkit.read\_ids\_and\_molecules()</code>, can be configured the same way, that is:

```
# When there is an error, raise an exception and stop (this is the default)
T.read_molecules(filename)
T.read_molecules(filename, errors="strict")
T.read_ids_and_molecules(filename)
T.read_ids_and_molecules(filename, errors="strict")

# When there is an error, go on to the next record
T.read_molecules(filename, errors="ignore")
T.read_ids_and_molecules(filename, errors="ignore")

# When there is an error, print an error message to stderr then
# go on to the next record
T.read_molecules(filename, errors="report")
T.read_ids_and_molecules(filename, errors="report")
```

To show it in action, I'll construct an SD file with three records. The first will contain a trivalent oxygen, the second a corrupt record, and the third will be atomic nitrogen. I'll use OEChem to help me make the file.

```
from chemfp import openeye_toolkit as T
mol1 = T.parse_molecule("O#C trivalent", "smi") # RDKit won't like this
mol2 = T.parse_molecule("[U] Q-record", "smi") # I'll corrupt this record
mol3 = T.parse_molecule("[N] nitrogen", "smi") # This one is fine
with T.open_molecule_writer_to_string("sdf") as writer:
    writer.write_molecules([mol1, mol2, mol3])
content = writer.getvalue()
# replace the "U" with the nonsense "Qq"
content = content.replace("U", "Qq")
# Save
open("bad_data.sdf", "w").write(content)
```

Here's what the output file bad\_data.sdf it looks like, so you can copy&paste if you wish:

```
trivalent
            -OEChem-04251716112D
                                                                                      0 0 0 0 0 0999 V2000
            2 1 0
                        0.0000
                                                                                        0.0000
                                                                                                                                                     0.0000 \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; \; 0 \; 
                        1.0000
                                                                                        0.0000
                                                                                                                                                        0.0000 C 0 0 0 0 0 0 0 0 0 0 0
            1 2 3 0 0 0 0
M END
$$$$
Q-record
            -OEChem-04251716112D
           1 0 0
                                                                                        0 0 0 0 0 0999 V2000
                                                                                                                                                       0.0000 Qq 0 0 0 0 0 0 0 0 0 0 0
                        0.0000
                                                                                        0.0000
M END
$$$$
nitrogen
           -OEChem-04251716112D
            1 0 0
                                                                                        0 0 0 0 0 0999 V2000
                        0.0000
                                                                                        0.0000
                                                                                                                                                        0.0000 N 0 0 0 0 0 15 0 0 0 0 0
M END
$$$$
```

I'll try to read that file using the native RDKit reader, which skips records it can't parse:

```
>>> from rdkit import Chem
>>> reader = Chem.ForwardSDMolSupplier("bad_data.sdf")
>>> ids = [mol.GetProp("_Name") for mol in reader if mol is not None]
[16:40:57] Explicit valence for atom # 0 0, 3, is greater than permitted
[16:40:57] ERROR: Could not sanitize molecule ending on line 8
[16:40:57] ERROR: Explicit valence for atom # 0 0, 3, is greater than permitted
[16:40:57]

****
Post-condition Violation
Element 'Qq' not found
Violation occurred on line 91 in file /Users/dalke/ftps/rdkit-Release_2020_03_1/Code/
GraphMol/PeriodicTable.h
```

```
Failed Expression: anum > -1
****

[16:40:57] ERROR: Element 'Qq' not found
[16:40:57] ERROR: moving to the beginning of the next molecule
>>> ids
['nitrogen']
```

As expected, RDKit could only extract one record of the three. It helpfully points out the line number of the records it couldn't parse (lines 8 and 14)

Now I'll do the same using chemfp's rdkit\_toolkit interface and the default error handler, which is strict:

```
>>> from chemfp import rdkit_toolkit
>>> ids = []
>>> for id, mol in rdkit_toolkit.read_ids_and_molecules("bad_data.sdf"):
... ids.append(id)
...
[16:41:47] Explicit valence for atom # 0 0, 3, is greater than permitted
Traceback (most recent call last):
File "<stdin>", line 1, in <module>
File "/Users/dalke/cvses/cfp-3x/docs/chemfp/_rdkit_toolkit.py", line 1340, in _iter_
--read_sdf_structures
    error_handler.error("Could not parse molecule block", location)
File "/Users/dalke/cvses/cfp-3x/docs/chemfp/io.py", line 112, in error
    _compat.raise_tb(ParseError(msg, location), None)
File "<string>", line 1, in raise_tb
chemfp.ParseError: Could not parse molecule block, file 'bad_data.sdf', line 1, record
--#1: first line is 'trivalent'
```

It stops at the first error and raise an exception. The exception contains some information about the error location, including the filename, line number, record number, and the contents of the first line of the file.

How does chemfp get that information? Under the covers chemfp uses its own parser, from the <code>text\_toolkit</code> to read each record, then passes that record to RDKit to turn the record into a molecule. This gives chemfp a bit more control over error reporting. Originally this was also faster than using RDKit's own <code>ForwardSDMolSupplier</code>, but now chemfp is about 10% slower. A future implementation may offer a runtime choice of which implementation to use, in case you want better performance at the expense of less detailed error information.

Pass in either "ignore" or "report" as the errors option if you want chemfp to skip records with an error keep on processing. I'll use "report" to show what the error reporting looks like:

```
****
Post-condition Violation
Element 'Qq' not found
Violation occurred on line 91 in file /Users/dalke/ftps/rdkit-Release_2020_03_1/Code/

GraphMol/PeriodicTable.h
Failed Expression: anum > -1

****

[16:42:23] Element 'Qq' not found
ERROR: Could not parse molecule block, file 'bad_data.sdf', line 10,
record #2: first line is 'Q-record'. Skipping.
```

RDKit's own error messages from ForwardSDMolSupplier, like "Unexpected error hit on line 14" / "moving to the beginning of the next molecule", have disappeared, because chemfp handles record extraction. The sanitization error message about explicit valence remains because RDKit still does that work.

Note also that under Python 2.7 chemfp returns a Unicode string for the id, rather than the byte string that the native RDKit API returns.

That was RDKit. What about Open Babel?

Open Babel reads all three records even in strict mode. Interestingly, Open Babel turns the 'Qq' atom into a "\*" atom, with atomic number 0. To double check, I'll read the list of molecules, then write them all out as SMILES:

```
>>> with openbabel_toolkit.read_molecules("bad_data.sdf") as reader:
...    mols = [openbabel_toolkit.copy_molecule(mol) for mol in reader]
...
>>> len(mols)
3
>>> with openbabel_toolkit.open_molecule_writer(None, "smi") as writer:
...    writer.write_molecules(mols)
...
C#[0] trivalent
* Q-record
[N] nitrogen
```

OEChem also parses that "Qq" record as an atom with atomic number of 0, and it also doesn't give me a warning message:

```
"bad_data.sdf", errors="strict") as reader:
... for id, mol in reader:
... print("Read", repr(id), [a.GetAtomicNum() for a in mol.GetAtoms()])
...
Read 'trivalent' [8, 6]
Read 'Q-record' [0]
Read 'nitrogen' [7]
```

I totally didn't expect the toolkits to parse an unknown atom type like "Qq"!

In any case, OEChem will skip records which it could not parse, and there's no easy way for chemfp to get that information, so in practice the "strict" and "report" options are meaningless.

Finally, what about CDK?

```
>>> from chemfp import cdk_toolkit
>>> with cdk_toolkit.read_ids_and_molecules(
... "bad_data.sdf", "sdf", errors="strict") as reader:
... for id, mol in reader:
... print("Read", repr(id), "first atom:", list(mol.atoms())[0].getAtomicNumber())
...
Read 'trivalent' first atom: 8
Read 'Q-record' first atom: 0
Read 'nitrogen' first atom: 7
```

It accepts the "Qq" atom type! That's because CDK default to a RELAXED parser mode. I'll change that reader\_args to STRICT:

# 6.35 Ignore errors in create\_string() and create\_bytes()

In this section you'll learn how to ignore errors when converting a molecule into a string or byte record.

Some molecules cannot be represented in some formats. The easiest example is the molecule from the SMILES "\*", which contains a single atom with the atomic number 0 and cannot be represented in InChI:

```
>>> from chemfp import rdkit_toolkit as T
>>> mol = T.parse_molecule("*", "smistring")
>>> T.create_string(mol, "smistring")
'[*]'
>>> T.create_string(mol, "inchistring")
```

```
[16:47:59] ERROR: Unknown element '*'

Traceback (most recent call last):

File "<stdin>", line 1, in <module>

File "chemfp/rdkit_toolkit.py", line 418, in create_string

return _toolkit.create_string(mol, format, id, writer_args, errors)

File "chemfp/base_toolkit.py", line 1389, in create_string

return self._create_string_impl(format_config, mol, id, writer_args, error_handler)

File "chemfp/base_toolkit.py", line 1392, in _create_string_impl

return format_config.create_string(mol, id, writer_args, error_handler)

File "chemfp/_rdkit_toolkit.py", line 1709, in create_string

error_handler.error("RDKit cannot create the InChI string")

File "chemfp/io.py", line 112, in error

_compat.raise_tb(ParseError(msg, location), None)

File "<string>", line 1, in raise_tb

chemfp.ParseError: RDKit cannot create the InChI string
```

By default the <code>chemfp.toolkit.create\_string()</code> and <code>chemfp.toolkit.create\_bytes()</code> functions will raise an exception if the molecule cannot be converted into the given record format. Use the <code>errors</code> parameter to specify that behavior. Just like with file reading, the default value is "<code>strict</code>", "<code>ignore</code>" will return None if there was an error, and "<code>report</code>" will return None and also print some information about the failure to stderr.

The following uses "ignore":

```
>>> from __future__ import print_function # Only needed in Python 2
>>> import chemfp
>>> for toolkit in ("openbabel", "rdkit", "openeye", "cdk"):
     T = chemfp.get_toolkit(toolkit)
     mol = T.parse molecule("*", "smistring")
     result = T.create_string(mol, "inchistring", errors="ignore")
     print(toolkit, "returned", repr(result))
_____
*** Open Babel Warning in InChI code
 #0 :Unknown element(s): *
*** Open Babel Error in InChI code
 InChI generation failed
openbabel returned None
[16:49:04] ERROR: Unknown element '*'
rdkit returned None
Warning: Unable to create InChI from molecule '' with wild card atoms:
→OEAtomBase::GetAtomicNum() == 0.
openeye returned None
cdk returned None
```

The following uses "report". You can see the only addition is the new line 'ERROR: Open Babel cannot create the InChI string. Skipping.' For a bit of variation, I also changed things to use create\_bytes instead of create\_string:

```
>>> from chemfp import openbabel_toolkit as T
>>> mol = T.parse_molecule("*", "smistring")
>>> result = T.create_bytes(mol, "inchistring", errors="report")
```

I'll do the same using the CDK toolkit:

```
>>> from chemfp import cdk_toolkit as T
>>> mol = T.parse_molecule("*", "smistring")
>>> result = T.create_bytes(mol, "inchistring", errors="report")
ERROR: CDK cannot create the InChI string. Skipping.
```

## 6.36 Ignore errors when writing molecules

In this section you'll learn how to ignore errors and improve error reporting when writing a file, rather than accept the default of raising an exception and stopping. You will need a copy of ChEBI\_lite.sdf.gz.

It's not unusal for there to be a few input records which cannot be parsed into a molecule. It's much less common to come across a molecule which cannot be turned into a record. The SMILES and SD file formats are able to handle a wide range of chemistry. Even R-groups, which can't directly be expressed as SMILES, can be represented in one of several conventions, like [\*:1] for R1.

There are no such conventions for InChI. As you saw in the previous section, it's easy to make a molecule to InChI converter fail if the structure contains a "\*" atom.

The functions chemp.toolkit.open\_molecule\_writer(), chemp.toolkit.open\_molecule\_writer\_to\_string(), and chemp.toolkit.open\_molecule\_writer\_to\_bytes() return a molecule writer. This can be used to write a single molecule at a time, or to write molecule multiples from an iterator.

What happens if I try to convert the ChEBI file into an InChI file using OEChem?

```
File "<string>", line 1, in raise_tb chemfp.ParseError: OEChem cannot create the InChI string, file 'chebi.inchi', record #3
```

The third record could not be converted to an InChI string, and the warning message that OEChem printed to the termal shows that the molecule contained a wildcard atom, that is, the "\*" atom. But, did it really?

```
>>> reader = T.read_molecules("ChEBI_lite.sdf.gz")
>>> for i in range(3):
... mol = next(reader)
... print(T.create_string(mol, "smistring"))
...
clcc(c(cc1[C@@H]2[C@@H](Cc3c(cc(cc302)0)0)0)0)0
C[C@]12CC[C@H](C1)C(C2=0)(C)C
*C(=0)0C(C0)C0[R1]
```

That shows "R1", not an R-group. What's going on? "R1" isn't even a valid SMILES.

This is an OEChem extension to SMILES. The default output SMILES flavor includes the flag "RGroups", which

[c]ontrols whether atoms with atomic number zero (as determined by the OEAtomBase::GetAtomicNum method), and a non-zero map index (as determined by the OEAtomBase::GetMapIdx method) should be displayed using the [R1] notation. In this notation, the integer value following the R corresponds to the atom's map index. When this flag isn't set, such atoms are written in the Daylight convention [\*:1]. — OEChem documenation

I'll redo the loop but this time disable the RGroup using the writer\_args option to set the flavor to "Default, -RGroups", that is, the default value but without RGroups being set:

```
>>> reader = T.read_molecules("ChEBI_lite.sdf.gz")
>>> for i in range(5):
... mol = next(reader)
... print(T.create_string(mol, "smistring",
... writer_args={"flavor": "Default,-RGroups"}))
...
c1cc(c(cc1[C@@H]2[C@@H](Cc3c(cc(cc302)0)0)0)0)0
C[C@]12CC[C@H](C1)C(C2=0)(C)C
*C(=0)0C(C0)CO[*:1]
C[C@]12CC[C@@H]3c4cc(cc4CC[C@H]3[C@@H]1C[C@H](C2=0)0)0
c1cc(c(c(c1)C1)C#N)C1
```

That indeed gives [\*:1] which is the wildcard atom that InChI complains about.

The molecule writers support the same errors option as the molecule readers. The default value is "strict", which means to raise an exception. To ignore errors, use "ignore", and to ignore errors except to report a message to standard out, use "report".

The first few and last few lines of output are:

```
Warning: Unable to create InChI from molecule '' with wild card atoms: U
→OEAtomBase::GetAtomicNum() == 0.
ERROR: OEChem cannot create the InChI string, file 'chebi.inchi', record #3. Skipping.
Warning: Unsupported Sgroup information ignored
Warning: Unsupported Sgroup information ignored
Warning: Unable to create InChI from molecule '' with wild card atoms:
→OEAtomBase::GetAtomicNum() == 0.
ERROR: OEChem cannot create the InChI string, file 'chebi.inchi', record #13. Skipping.
Warning: Stereochemistry corrected on atom number 2 of
Warning: Unable to create InChI from molecule '' with wild card atoms:
→OEAtomBase::GetAtomicNum() == 0.
ERROR: OEChem cannot create the InChI string, file 'chebi.inchi', record #133. Skipping.
ERROR: OEChem cannot create the InChI string, file 'chebi.inchi', record #94443.
→Skipping.
Warning: Stereochemistry corrected on atom number 8 of
Warning: Stereochemistry corrected on atom number 13 of
Warning: Stereochemistry corrected on atom number 36 of
```

where the lines starting "ERROR: OEChem" come from chemfp, and the others come from OEChem at a lower-level. (Alas, the "report" isn't as helpful as it should be. I would like it to include the output id in the error message, but all it gives is the record number. Perhaps it will be in the next release?)

All told, there were 107205 of which 98631 could be written out. I got these numbers from the writer's location property (see *Location information: filename, record\_format, recno and output\_recno*, below). Its recno is the number of records sent to the writer, and output\_recno is the number of records actually written:

```
>>> writer.location.recno
107205
>>> writer.location.output_recno
98631
```

### 6.37 Reader and writer format metadata

In this section you'll learn about the format metadata attribute of the readers and writers. You will need Compound\_099000001\_099500000.sdf.gz from PubChem if you want to reproduce this for yourself.

Each reader and writer has a metadata attribute, which stores some information about the parameters used to open it:

The metadata for a structure reader and writer is a *chemfp.base\_toolkit.FormatMetadata* instances, and not the *chemfp.Metadata* for a fingerprint reader and writer.

The *filename* attribute is best effort at a string representation of the source or destination. It can either be the original filename (if there is one), the strings "<stdin>" or "<stdout>" for stdin/stout, the string "<string>" if reading or writing to memory, the source or destination's "name" attribute if a file object, or None if all else fails.

The record\_format attribute is the format name for the record, which is the same as the input file format except without any compression. As you can see in the above example, the "sdf.gz" reader has a record\_format of "sdf". This parameter is useful when you want use the text\_toolkit to extract records because you pass the text reader's record format as the format for the chemistry toolkit's toolkit.parse\_molecule().

The args attribute is the processed reader\_args or writer\_args, without any namespacing. For now it's mostly available for debugging purposes, so you can see how the toolkit layer actually processed your arguments. In the future there will be a way to turn this into a text settings dictionary.

# 6.38 Location information: filename, record\_format, recno and out-put\_recno

In this section you'll learn the basics of the *chemfp.io.Location* API, you'll learn how to get the location object for each reader and writer, and you'll learn about the recno and output\_recno location attributes.

(See the next section for details about the lineno, offsets, record, and other location properties which are not available for every toolkit format.)

The reader and writers track information about the current state of the reader and writer. Some of this information is more generally useful, and available through the location attribute of each reader and writer:

```
>>> from chemfp import rdkit_toolkit as T # use your toolkit of choice
>>> content = "C methane\n0=0 oxygen\n"
>>> reader = T.read_molecules_from_string(content, "smi")
>>> reader.location
Location('<string>')
>>> loc = reader.location
>>> loc.filename
'<string>'
>>> loc.record_format
'smi'
```

If there is no actual filename then filename is "<string>" for string-based I/O, "<stdin>" when reading from stdin, and "<stdout>" when writing to stdout. (The latter two occur when the source or destination parameter, respectively, are None.) The record\_format is the record format name, without any compression suffix:

```
>>> writer = T.open_molecule_writer("example.sdf.gz")
>>> writer.location.filename
'example.sdf.gz'
>>> writer.location.record_format
'sdf'
>>> writer.close()
```

All of the toolkit readers and writers support the **recno** location property, which is the number of records which have been read or written. A recno of 0 means that no records have been read:

```
>>> reader = T.read_molecules_from_string(content, "smi")
>>> loc = reader.location
>>> loc.recno
0
>>> next(reader)
<rdkit.Chem.rdchem.Mol object at 0x10fb06e50>
>>> loc.recno
1
>>> next(reader)
<rdkit.Chem.rdchem.Mol object at 0x10fb06ec0>
>>> loc.recno
2
```

While you could use the recno property for simple enumeration, as in the following:

```
>>> from __future__ import print_function # Only needed in Python 2
>>> with T.read_ids_and_molecules_from_string(content, "smi") as reader:
... loc = reader.location
... for id, mol in reader:
... print("record number:", loc.recno, "id:", id)
...
record number: 1 id: methane
record number: 2 id: oxygen
```

I would prefer that you write it with the "enumerate()" function, as in:

```
>>> with T.read_ids_and_molecules_from_string(content, "smi") as reader:
... for recno, (id, mol) in enumerate(reader, 1):
... print("record number:", recno, "id:", id)
...
record number: 1 id: methane
record number: 2 id: oxygen
```

The enumerate() function is both faster and more expected for this sort of code. The recno property exists more to help with error reporting, and to report summary information, like:

```
>>> print("Read", reader.location.recno, "records")
Read 2 records
```

The output writers distinguish between recno, which is the number of molecules that chemfp tried to save, and output\_recno, which is the number of molecules that could actually be saved. This occurs because some molecules cannot be written to a given format, like the SMILES "\*" which has no InChI representation:

```
*** Open Babel Warning in InChI code
 #0 :Unknown element(s): *
*** Open Babel Error in InChI code
 InChI generation failed
Traceback (most recent call last):
 File "<stdin>", line 1, in <module>
 File "chemfp/base_toolkit.py", line 271, in write_molecule
    _compat.raise_tb(err[0], err[1])
 File "<string>", line 1, in raise_tb
 File "chemfp/_openbabel_toolkit.py", line 1348, in _gen_write_delimited_structures
   error_handler.error("Open Babel cannot create the %s string"
 File "chemfp/io.py", line 112, in error
    _compat.raise_tb(ParseError(msg, location), None)
 File "<string>", line 1, in raise tb
chemfp.ParseError: Open Babel cannot create the InChI string, file 'example.inchi', __
⇒record #2
>>> writer.location.recno
>>> writer.location.output_recno
```

## 6.39 Location information: record position and content

In this section you'll learn how to get position information for each record and information about the content of each record. You will need the RDKit toolkit or Open Babel toolkit. (Unfortunately for me, OEChem doesn't have a way to get this information, and my hybrid parser with improved error reporting proved to be much slower than OEChem's native performance.) You will also need Compound 099000001 099500000.sdf.gz from PubChem.

(See the previous section for details about the filename, record\_format, recno and output\_recno location properties, which are available for every toolkit format.)

Sometimes you want to know where a record is located in a file. You might want to report that the unusable record started on line 12345 of a given file, or you might want to index a file to implement random access lookup.

The underlying toolkits do not implement this functionality. Instead, chemfp includes its own SMILES and SDF file readers. These know enough about the formats to extract a single record, then pass the record to the toolkit to turn into a molecule. This lets chemfp track the line number of the start of the record, its byte range, the text of the current record, and other details.

Timings show that the hybrid parser for the SMILES formats are no slower than the native RDKit and Open Babel readers, and that the hybrid SDF parser a bit slower than RDKit's native parser (about 10%) and slower than Open Babel's native parser. In all cases, OEChem's native parsers leave chemfp in the dust.

As a consequence, the <code>rdkit\_toolkit</code> and <code>openbabel\_toolkit</code> SMILES readers track more detailed record information, but the <code>openeye\_toolkit</code> one does not. (The <code>text\_toolkit</code> of course always tracks that information.) Here is an example which works for <code>rdkit\_toolkit</code> and <code>openbabel\_toolkit</code>:

```
>>> from __future__ import print_function # Only needed in Python 2
>>> from chemfp import openbabel_toolkit as T # or rdkit_toolkit
```

```
>>> content = "C methane\n0=0 oxygen\n"
>>> reader = T.read ids and molecules from string(content, "smi")
>>> loc = reader.location
>>> for id, mol in reader:
       print("id:", repr(id), "lineno:", loc.lineno, "byte range:", loc.offsets)
       print("
                 record content:", repr(loc.record))
                first line:", repr(loc.first_line))
        print("
id: 'methane' lineno: 1 byte range: (0, 10)
  record content: b'C methane\n'
  first line: 'C methane'
id: 'oxygen' lineno: 2 byte range: (10, 21)
  record content: b'0=0 oxygen\n'
  first line: '0=0 oxygen'
>>> content[0:10]
'C methane\n'
>>> content[10:21]
'0=0 oxygen\n'
```

(Note: if the input record is a Unicode string then it will be converted into a UTF-8 encoded byte string. The start and end positions are coordinates in the encoded byte string, not the text string.)

The *location* instance of the rdkit\_toolkit SDF reader gives access to many details about the current parser state:

```
>>> from chemfp import rdkit_toolkit
>>> reader = rdkit_toolkit.read_molecules("Compound_099000001_099500000.sdf.gz")
>>> next(reader)
<rdkit.Chem.rdchem.Mol object at 0x1104c9830>
>>> reader.location.lineno
>>> reader.location.offsets
(0, 6709)
>>> reader.location.first_line
'99000039'
>>> next(reader)
<rdkit.Chem.rdchem.Mol object at 0x1104c97c0>
>>> reader.location.lineno
>>> reader.location.offsets
(6709, 14560)
>>> reader.location.first_line
'99000230'
```

The openbabel\_toolkit and openeye\_toolkit implementations by default don't track this level of detail, because their native readers are faster than when I can manage in a hybrid reader. Consequently, those values are None:

```
>>> print(reader.location.lineno)
None
>>> print(reader.location.offsets)
None
>>> print(reader.location.first_line)
None
```

There is experimental support to use Open Babel in hybrid mode. The reader\_args supports an "implementation" option. The default of None, or "openbabel", tells chemfp to use Open Babel's native parser, while specifying "chemfp" tells it to use chemfp's own SDF record parser:

If user-defined selection of the back-end implementation works well, I may add similar support for the openeye\_toolkit, for those who want the increased level of location detail despite the large performance impact.

The RDKit "sdf" reader always uses the hybrid. This is for historical reasons. The hybrid solution was once always faster than the native ForwardSDMolSupplier. That has since changed, and ForwardSDMolSupplier is about 10% faster. At some point I will add an 'implementation' option so you can switch between performance and improved error reporting.

## 6.40 Writing your own error handler (Experimental)

In this section you'll learn how to write your own error handler. This is an advanced topic. Bear in mind that this is highly experimental and very likely to change. I hope you can provide feedback about how to improve it.

In earlier sections you learned that when the errors parameter is "strict", the parser will raise an exception if there's a problem with a record. When it's "ignore", the record parsers return None as the molecule, while the file and string readers skip the failing record. When it's "report", the result is the same as "ignore" except that extra information about the failure is written to stderr.

The errors parameter can also take an object which implements the "errors()" method as in the following:

```
import sys
class OopsHandler(object):
    def error(self, msg, location=None):
        if location is None:
```

```
sys.stderr.write("Oops! %s. Skipping.\n" % (msg,))
else:
    sys.stderr.write("Oops! %s, %s. Skipping.\n" % (msg, location.where()))
```

The msg is a string describing the error, and location contains the *chemfp.io.Location* for the given record. Here's what it looks like in action:

```
>>> from __future__ import print_function # Only needed in Python 2
>>> import sys
>>> from chemfp import rdkit_toolkit as T
>>> T.parse_molecule("Q", "smistring", errors=OopsHandler())
>>> T.parse_molecule("Q", "smistring", errors=OopsHandler())
[10:54:57] SMILES Parse Error: syntax error while parsing: Q
[10:54:57] SMILES Parse Error: Failed parsing SMILES 'Q' for input: 'Q'
Oops! RDKit cannot parse the SMILES string 'Q'. Skipping.
>>> for mol in T.read molecules from string("Q Q-ane\nC methane\n", "smi",
                  errors=OopsHandler()):
     print("Processed", mol)
[10:55:21] SMILES Parse Error: syntax error while parsing: Q
[10:55:21] SMILES Parse Error: Failed parsing SMILES 'Q' for input: 'Q'
Oops! RDKit cannot parse the SMILES 'Q', file '<string>', line 1, record #1: first line
⇒is 'Q Q-ane'. Skipping.
Processed <rdkit.Chem.rdchem.Mol object at 0x109486670>
```

The location's *where()* method tries to give useful information based on the location's filename, line number, record number, and the first line of the record (up to the first 40 characters).

It's easy to see how to modify this to send the errors to a logger, or save them up to display in a GUI.

For the hybrid parsers, which give access to the raw record, you can do more advanced processing, like extract the title lines of any SDF record which RDKit can't handle. The following will make an SDF-formatted string containing three records, where the second record is a 5-valent nitrogren that RDKit can't parse. It will then try to parse the string, and store the ids for records which couldn't be parsed.

The content of sdf\_content is:

```
methane
    RDKit
 1 0 0 0 0 0 0 0 0 0999 V2000
            0.0000
                    0.0000 C
   0.0000
                            0 0 0 0 0 0 0 0 0 0 0
M END
$$$$
pentavalent N
    RDKit
 6 5 0 0 0 0 0 0 0 0999 V2000
   0.0000
            0.0000
                    0.0000 C
                                0
                                   0
                                     0
                                        0
                                           0
                                             0
                                                0
   0.0000
            0.0000
                    0.0000 N
                              0
                                0
                                   0 0
                                        0
                                           0
                                             0
                                                0
                                                   0
   0.0000
            0.0000
                    0.0000 C
                                  0
                                     0
                                        0
                                           0
                                             0
                    0.0000 C
                                           0
   0.0000
            0.0000
                              0 0 0 0 0
                                             0
                                                0
                                                   0
   0.0000
            0.0000
                    0.0000 C
                              0 0 0
                                     0
                                        0
                                           0
                                             0
                                                0
                                                   0
   0.0000
            0.0000
                    0.0000 C
                              0 0 0 0 0 0
                                               0
 1 2 1 0
 2 3 1 0
 2 4 1 0
 2 5 1 0
 2 6 1 0
M END
$$$$
oxygen
    RDKit
 2 1 0 0 0 0 0 0 0 0999 V2000
   0.0000
            0.0000
                    0.0000 D
                              0 0
                                  0 0 0 0 0 0 0 0 0
   0.0000
            0.0000
                    0.0000 D
                              0 0 0 0 0 0 0 0 0 0 0
 1 2 2 0
M END
$$$$
```

and the output from the above is:

```
[10:59:59] Explicit valence for atom # 1 N, 5, is greater than permitted Could not parse: ['pentavalent N']
```

The fingerprint type documentation includes another example of how to write an error handler.

#### 6.41 A Babel-like structure format converter

In this section you'll learn how to use the chemfp toolkit API to create a Babel-like structure file format converter. This section goes into more details of how to develop real-world software using chemfp.

Pat Walters and Matt Stahl started Babel in the 1990s as a command-line program to convert from one chemical structure format to another. This developed over the years, and after a major rewrite became the LGPL toolkit "OELib", OpenEye's first commercial chemistry toolkit. OpenEye's next rewrite lead to OEChem, a proprietary chemistry toolkit. OELib was still available, and others continued to develop it. It became Open Babel, and structure file format conversion continues to be Open Babel's forte.

A full Babel-like program includes features to add and remove hydrogens of different sorts, select or reject structures based on substructure or other features, add 2D or 3D coordinates, and more. You cannot use chemfp for that. All chemfp can do is read structure files into a given toolkit's molecule object, and write molecule objects to a given format.

Even that basic ability is useful. I'll explain how to write such a converter yourself. I'll use as my example file the following, "example.smi":

```
c1ccccc10 phenol
C methane
O=O molecular oxygen
```

Here's a minimal conversion program to convert the above into "example.sdf":

```
from chemfp import rdkit_toolkit as T # use your toolkit of choice

reader = T.read_molecules("example.smi")
writer = T.open_molecule_writer("example.sdf")
writer.write_molecules(reader)
```

That code depends on Python's garbage collection to close the output file handle. This is fine for a script, but a longer running program may want to have more explicit control over closing the file handle and use a context manager (see *Reader and writer context managers*):

```
from chemfp import rdkit_toolkit as T # use your toolkit of choice
with T.read_molecules("example.smi") as reader:
    with T.open_molecule_writer("example.sdf") as writer:
        writer.write_molecules(reader)
```

With that we have enough to build our first Babel program, which takes the input and output filenames on the command-line. I'll call this program "cbabel.py", for "chemfp babel", and have it implement the command-line

```
usage: cbabel.py [-h] input_filename output_filename
```

I'll use argparse from Python's standard library to handle command-line argument processing. The "nargs=1" in the following says that the <code>input\_filename</code> and <code>output\_filename</code> must exist, and only one

filename is allowed. Argparse will save those in a list of size 1, which is why I use [0] to get the actual string I'm interested in:

```
import argparse
from chemfp import rdkit_toolkit as T

parser = argparse.ArgumentParser(
    description = "A minimial chemical structure file converter"
    )
parser.add_argument("input_filename", nargs=1, help="input filename")
parser.add_argument("output_filename", nargs=1, help="output filename")
args = parser.parse_args()

with T.read_molecules(args.input_filename[0]) as reader:
    with T.open_molecule_writer(args.output_filename[0]) as writer:
    writer.write_molecules(reader)
```

I'll convert the SMILES into canonical SMILES:

```
% python cbabel.py example.smi example.can
% cat example.can
Oc1ccccc1 phenol
C methane
O=O molecular oxygen
```

The only change is that the phenol went from c1ccccc10 to Oc1ccccc1.

I'll add the ability to read from stdin and stdout. I'll say that if the input filename is "-" then it will read from stdin, and if the output filename is "-" then it will write to stdout. (If you have a file named "-" then you'll have to specify "./-" to read or write to it.):

```
import argparse
from chemfp import rdkit_toolkit as T
parser = argparse.ArgumentParser(
   description = "A minimial chemical structure file converter"
parser.add argument("input filename", nargs=1, help="input filename")
parser.add_argument("output_filename", nargs=1, help="output filename")
args = parser.parse_args()
# Support "-" as stdin/stdout by mapping it to None,
# which tells chemfp to use stdin/stout
input_filename = args.input_filename[0]
if input_filename == "-":
    input_filename = None
output_filename = args.output_filename[0]
if output filename == "-":
    output_filename = None
with T.read_molecules(input_filename) as reader:
```

```
with T.open_molecule_writer(output_filename) as writer:
    writer.write_molecules(reader)
```

There's a limitation with this! When the input or output format is None, chemfp can't figure out the format based on the filename, so will assume that it's a SMILES file. When I run the above I get SMILES output:

```
% python cbabel.py example.smi -
0c1cccc1 phenol
C methane
0=0 molecular oxygen
```

But what if I want SDF output? I need a way to specify the input and output file formats on the command-line. I'll use the -i and -o options to specify those:

```
from __future__ import print_function # Only needed in Python 2
import argparse
from chemfp import rdkit_toolkit as T
parser = argparse.ArgumentParser(
   description = "A minimial chemical structure file converter"
parser.add_argument("-i", metavar="FORMAT", dest="input_format",
                    help="input format name", default=None)
parser.add_argument("-o", metavar="FORMAT", dest="output_format",
                    help="output format name", default=None)
parser.add_argument("input_filename", nargs=1, help="input filename")
parser.add_argument("output_filename", nargs=1, help="output filename")
args = parser.parse_args()
# Support "-" as stdin/stdout by mapping it to None,
# which tells chemfp to use stdin/stout
input_filename = args.input_filename[0]
if input_filename == "-":
    input_filename = None
output filename = args.output filename[0]
if output_filename == "-":
    output_filename = None
with T.read_molecules(input_filename, args.input_format) as reader:
   with T.open_molecule_writer(output_filename, args.output_format) as writer:
        writer.write_molecules(reader)
```

Now I can specify that I want stdout to be in SDF format:

```
% python cbabel.py -o sdf example.smi - | head -5
phenol
    RDKit

7 7 0 0 0 0 0 0 0999 V2000
    0.0000 0.0000 C 0 0 0 0 0 0 0 0 0 0
```

In practice, required command-line arguments make life more difficult. For a simple program like this, required arguments are not a problem, but what if I want to add a command to list the available formats? That option doesn't need an input or output filename, but argparse will enforce that requirement anyway.

There are a couple of ways to solve the problem. The correct one is to use an argparse Action but that's complicated. An easier one for this case is to let "-" be the default input and output filename. That's easily done by changing:

```
parser.add_argument("input_filename", nargs=1, help="input filename")
parser.add_argument("output_filename", nargs=1, help="output filename")
```

to:

As a result I can add a new --help-formats argument:

along with the handler for it, which prints information about the toolkit (its name and version string) and each of the formats. Some of the formats, like "smistring", don't have an I/O format (for that, use "smi"), so I need to filter those out. Also, some of the formats, like "inchikey", are output only, and some of the toolkit have formats that they read but don't write, so I give more details about those:

```
args = parser.parse_args()

if args.help_formats:
    print("Available I/O formats for toolkit %s (%s)" % (T.name, T.software))
    for format in T.get_formats():
        if not format.supports_io: # skip formats like "smistring" and "inchistring"
            continue
        if not format.is_output_format:
            msg = " (input only)"
        elif not format.is_input_format:
            msg = " (output only)"
        else:
            msg = ""
            print(" %s%s" % (format.name, msg))
        raise SystemExit(0)
```

For my version of RDKit I get:

```
% python cbabel.py --help-formats
Available I/O formats for toolkit rdkit (RDKit/2020.03.1)
smi
can
usm
sdf
fasta
mol2 (input only)
pdb
```

```
xyz (output only)
mae (input only)
inchi
inchikey (output only)
```

If I used openeye\_toolkit instead of rdkit\_toolkit I get:

```
Available I/O formats for toolkit openeye (OEChem/20191016)
smi
usm
 can
sdf
skc (input only)
mol2
mol2h
sln (output only)
mmod
pdb
xyz
 cdx
mopac (output only)
mf (output only)
oeb
inchi
inchikey (output only)
 cif
mmcif
fasta
 csv
 json
```

The code so far requires RDKit, but chemfp supports OEChem, Open Babel, and CDK. Why not add the command-line argument --toolkit to specify an alternate toolkit?

I 'll tell argparse that there's a new --toolkit argument, which defaults to "rdkit" and also allows "openeye" and "openbabel":

I can no longer import the toolkit directly, which I did as:

```
from chemfp import rdkit_toolkit as T
```

because that line requires that RDKit be installed. Otherwise it will raise an ImportError exception. While that might be reasonable if the user wanted to use the rdkit toolkit, it's not reasonable if the user wanted to use the Open Babel toolkit and didn't care to know that RDKit isn't available.

Instead of a direct import, I'll use <code>chemfp.get\_toolkit()</code> to get the named toolkit. It raises a ValueError with a useful error message if the toolkit isn't available or is unknown. If that happens, I'll exit, and use that message as the explanation:

After a bit of experimentation I found a small SMILES string which gives a different canonicalization for each of the supported toolkits, which I present as evidence that it really is using a different toolkit:

```
% echo "NCC(N)O example" | python cbabel.py --toolkit openbabel
NCC(O)N example
% echo "NCC(N)O example" | python cbabel.py --toolkit rdkit
NCC(N)O example
% echo "NCC(N)O example" | python cbabel.py --toolkit openeye
C(C(N)O)N example
% echo "NCC(N)O example" | python cbabel.py --toolkit cdk
C(C(N)O)N example
```

Here's the final code, so you can see how everything works in context:

```
import argparse
import chemfp
parser = argparse.ArgumentParser(
   description = "A minimial chemical structure file converter"
parser.add_argument("-i", metavar="FORMAT", dest="input_format",
                    help="input format name", default=None)
parser.add_argument("-o", metavar="FORMAT", dest="output_format",
                    help="output format name", default=None)
## parser.add_argument("input_filename", nargs=1, help="input filename")
## parser.add_argument("output_filename", nargs=1, help="output filename")
parser.add_argument("--toolkit", metavar="NAME",
                    choices=("rdkit", "openeye", "openbabel", "cdk"),
                    help="toolkit name", default="rdkit")
parser.add_argument("--help-formats", action="store_true",
                    help="list the available file formats")
parser.add_argument("input_filename", nargs="?", default="-",
                    help="input filename")
parser.add_argument("output_filename", nargs="?", default="-",
                    help="output filename")
args = parser.parse_args()
   T = chemfp.get_toolkit(args.toolkit)
except ValueError as err:
   raise SystemExit("Cannot use toolkit %s: %s" % (
        args.toolkit, err))
```

```
if args.help_formats:
  print("Available I/O formats for toolkit %s (%s)" % (T.name, T.software))
  for format in T.get formats():
    if not format.supports io: # skip formats like "smistring" and "inchistring"
      continue
    if not format.is_output_format:
      msg = " (input only)"
   elif not format.is_input_format:
      msg = " (output only)"
   else:
      msg = ""
   print(" %s%s" % (format.name, msg))
  raise SystemExit(0)
# Support "-" as stdin/stdout by mapping it to None,
# which tells chemfp to use stdin/stout
input_filename = args.input_filename[0]
if input_filename == "-":
    input_filename = None
output_filename = args.output_filename[0]
if output_filename == "-":
   output_filename = None
with T.read_molecules(input_filename, args.input_format) as reader:
   with T.open_molecule_writer(output_filename, args.output_format) as writer:
        writer.write_molecules(reader)
```

Amazing how the original four lines of code expands to 55. It would be even more if I added full error reporting instead of letting Python throw an exception on errors.

Speaking of errors, you may want to use hard-coded values of errors="ignore" or errors="report" to have the parser skip records that the toolkit doesn't understand, or perhaps pass in that information as a command-line argument named --errors, with the possible choices of "strict", "report", or "ignore".

You might also add the -R and -W options to set the reader args and writer args for the formats, but that's more complicated than I wanted to describe in this context. See the next section for a description of how to do it.

# 6.42 argparse text settings to reader and writer args

In this section you'll learn how to use argparse to handle reader args and writer args in the same style that chemfp does.

The previous section showed how to create a Babel-like structure format conversion program and how to use Python's argparse library for command-line processing. That section was getting too long to describe how to support command-line configuration of the reader args and writer args. In this section I'll start with a smaller version of the same code. This one requires an input filename and an output filename on the command-line, and lets the user specify the toolkit:

```
# I put this into a file named "convert.py"
import argparse
```

I'll walk through the process of how to add support for the -R and -W options, to make it possible to say:

```
python convert.py example.smi example.can --toolkit rdkit -R delimiter=space -W_{\square} \hookrightarrow allBondsExplicit=true
```

#### 6.42.1 How to get from the command-line to reader and writer arguments

This requires a few conversions. I need to turn the command-line arguments into reader and writer text settings dictionaries, then convert the text settings into reader\_args and and writer\_args dictionaries, before finally passing the reader\_args and writer\_args to the molecule readers and writers. (See *Convert text settings into reader and writer arguments* for more details about converting text settings to reader and writer arguments.)

I'll use argparse to place the -R and -W option values into separate lists of KEY=VALUE strings, and create a new function which splits them apart on the "=" to get a dictionary of text settings. Then I'll use the Format object to convert the text settings into the correct reader\_args and writer\_args. The steps will look something like this:

```
>>> from chemfp import rdkit_toolkit as T
>>>
>>> format = T.get_format("smi")  # Specify the format and user-defined settings
>>> reader_settings = ["delimiter=space"]
>>> writer_settings = ["allBondsExplicit=true"]
>>>
>>> # The 'parse_text_settings' function doesn't yet exist. It will convert
... # the list of reader_settings into a dictionary of string values.
...
>>> reader_text_settings = parse_text_settings("-R", reader_settings)
>>> reader_text_settings
{'delimiter': 'space'}
```

```
>>>
>>> # Ask the format to turn the string values into string objects
...
>>> format.get_reader_args_from_text_settings(reader_text_settings)
{'delimiter': 'space'}
>>>
>>> # Do the same for the writer arguments
...
>>> writer_text_settings = parse_text_settings("-W", writer_settings)
>>> writer_text_settings
{'allBondsExplicit': 'true'}
>>> format.get_writer_args_from_text_settings(writer_text_settings)
{'allBondsExplicit': True}
```

For the actual code the input format may be different than the output format. By the way, if you look closely you'll see how "allBondsExplicit" in the text settings has a value of "true", and the string was converted to the Python object True to be a writer\_arg.

To start! First, I need a way to read the list of -R and -W options. I'll ask argparse to save them into a list, for later post-processing to get the right values:

This will parse all of the -R terms, like "-R delimiter=space", into the reader\_settings list, and "-W allBondsExplicit=true" into the writer settings list, such that:

```
args.reader_settings == ["delimiter=space"]
args.writer_settings == ["allBondsExplicit=true"]
```

For that matter, it will also support "-R abc", and put it into the *reader\_settings* list even though it doesn't have a "=" in it. I also need to go through and figure out if any terms are incorrect, and report the problem. I'll make a function for this, along with a parameter so any error message can report if a problem comes from the -R or -W command-line flag:

This gives me two text settings dictionaries, where the keys and values are both strings. I'll use the respective *Format* object to convert a text setting dictionary into the correct reader and writer arguments dictionary:

```
input_format = T.get_input_format_from_source(source)
reader_args = input_format.get_reader_args_from_text_settings(reader_text_settings)
output_format = T.get_output_format_from_destination(destination)
writer_args = input_format.get_writer_args_from_text_settings(writer_text_settings)
```

All that's left is to pass the *reader\_args* and *writer\_args* to the reader and writer. Since I already have the input and output format objects, I'll pass those in as well, rather than have them guess again based on the source and destination names:

```
with T.read_molecules(source, input_format, reader_args=reader_args) as reader:
    with T.open_molecule_writer(destination, output_format, writer_args=writer_args) as 
    →writer:
    writer.write_molecules(reader)
```

#### 6.42.2 Converter with -R and -W support

Here's how it looks when I put it all together:

```
# I put this into a file named "convert.py"
from future import print function # Only needed for Python 2
import argparse
import chemfp
parser = argparse.ArgumentParser(
   description = "Experiment with -R and -W options"
parser.add_argument("--toolkit", metavar="NAME",
                    choices=("rdkit", "openeye", "openbabel", "cdk"),
                    help="toolkit name", default="rdkit")
parser.add_argument("-R", metavar="KEY=VALUE", dest="reader_settings", action="append",
                   help="specify a reader argument", default=[])
parser.add_argument("-W", metavar="KEY=VALUE", dest="writer_settings", action="append",
                   help="specify a writer argument", default=[])
parser.add_argument("input_filename", nargs=1, help="input filename")
parser.add_argument("output_filename", nargs=1, help="output filename")
def parse text settings(flag, terms):
 text settings = {}
  for term in terms:
   left, mid, right = term.partition("=")
    if mid != "=":
     parser.error("%s setting %r must be of the form KEY=VALUE" %
                   (flag, term))
   text_settings[left] = right
  return text_settings
args = parser.parse args()
T = chemfp.get_toolkit(args.toolkit)
source = args.input_filename[0]
destination = args.output_filename[0]
```

```
input_format = T.get_input_format_from_source(source)
reader_text_settings = parse_text_settings("-R", args.reader_settings)
reader_args = input_format.get_reader_args_from_text_settings(reader_text_settings)

output_format = T.get_output_format_from_destination(destination)
writer_text_settings = parse_text_settings("-W", args.writer_settings)
writer_args = input_format.get_writer_args_from_text_settings(writer_text_settings)

with T.read_molecules(source, input_format, reader_args=reader_args) as reader:
    with T.open_molecule_writer(destination, output_format, writer_args=writer_args) as_u
    writer:
    writer.write_molecules(reader)
```

Let's see it in action. I'll ask RDKit to include all of the bonds in the output SMILES, including the aromatic bonds, and I'll ask it to use the space character as the SMILES delimiter:

```
% python convert.py example.smi example_output.smi --toolkit rdkit -R delimiter=space -W
→allBondsExplicit=true
% cat example_output.smi
0-c1:c:c:c:c:c:1 phenol
C methane
0=0 molecular
```

The lack of "oxygen" in "molecular oxygen" shows that the input SMILES reader used the "space" delimiter instead of the default "to-eol" delimiter, just as I requested.

The -R and -W settings can also be qualified. (See *Qualified reader and writer parameters names*.) I'll have Open Babel and OEChem use different delimiter styles to get different results:

```
% python convert.py example.smi example_ob_output.smi --toolkit openbabel \
    -R "openbabel.*.delimiter=to-eol" -R "openeye.*.delimiter=whitespace"
% cat example_ob_output.smi
Oc1ccccc1 phenol
C methane
O=O molecular oxygen
%
% python convert.py example.smi example_oe_output.smi --toolkit openeye \
    -R "openbabel.*.delimiter=to-eol" -R "openeye.*.delimiter=whitespace"
% cat example_oe_output.smi
c1ccc(cc1)O phenol
C methane
O=O molecular
```

#### 6.42.3 List the reader and writer arguments for the given formats

Finally, it's difficult to remember all of the available settings for each input and output format. I'll add a --list-args command-line option which shows the available options, and for each option show the current setting, along with an indicator if the current setting is the default value for that format or if the setting comes from the command-line option.

I need argparse to know about the new option:

and for the rest I replace the last three lines of the earlier code with:

```
if args.help args:
  # Make a helper function to display the arguments
  def report_args(format, msg, default_args, specified_args):
   print("%s %s:" % (format.name, msg))
    # Merge the arguments; command-line overrides defaults;
   all_args = default_args.copy()
   all_args.update(specified_args)
   for name, value in sorted(all_args.items()):
        # Was the name specified via -R/-W or is it a default?
       where = "from command-line" if name in specified args else "default value"
       print("
                    %s: %r (%s)" % (name, value, where))
  report_args(input_format, "reader arguments (-R)",
              input_format.get_default_reader_args(), reader_args)
  report_args(output_format, "writer arguments (-W)",
              output_format.get_default_writer_args(), writer_args)
else:
  with T.read molecules(source, input format, reader args=reader args) as reader:
   with T.open_molecule_writer(destination, output_format, writer_args=writer_args) as_
      writer.write_molecules(reader)
```

(See Get the default reader\_args or writer\_args for a format for more details on the default reader and writer arguments.)

With those changes, the output using the new --list-args is:

```
% python convert.py example.smi example_output.smi --toolkit rdkit \
?    -R delimiter=space -W allBondsExplicit=true --list-args
smi reader arguments (-R):
    delimiter: 'space' (from command-line)
    has_header: False (default value)
    sanitize: True (default value)
smi writer arguments (-W):
    allBondsExplicit: True (from command-line)
    allHsExplicit: False (default value)
    canonical: True (default value)
    cxsmiles: False (default value)
    delimiter: None (default value)
    isomericSmiles: True (default value)
    kekuleSmiles: False (default value)
```

## 6.43 Creating a specialized record parser

In this section you'll learn how to make a specialized function to parse an record into a toolkit molecule. This function is somewhat faster than calling the more general purpose toolkit.parse\_id\_and\_molecule() and might be used when you need to convert a lot of individual records into a molecule.

Sometimes you need to parse a lot of records which don't come from a file. For example, substructure search is typically split into a screening stage based on substructure fingerprints, followed by the atom-by-atom substructure search. The screening stage returns identifiers and the substructure search takes molecules, so in between them is code to look up a record based on its id and convert the result to a molecule.

Assuming a database record API where "db[id]" returns the record for a given id, that lookup function might look like this:

```
def get_molecules(db, id_iter, toolkit, format, reader_args=None):
    for id in id_iter:
        record = db[id]
        mol = toolkit.parse_molecule(record, format, reader_args=reader_args)
        yield mol
```

(A more complex implementation should handle when the record id doesn't exist, or can't be converted into a molecule.)

This isn't as fast as it could be. The <code>toolkit.parse\_molecule()</code> function validates that the <code>format</code> and <code>reader\_args</code> are correct and figures out the right parameters for the underlying toolkit code. It's a waste of time to redo those checks for every single call.

The function also promises that the caller will get a new molecule each time. That promise isn't needed for substructure screening. Timing tests with OEChem show that reusing the same molecule is faster than creating a new one. For example, this OEChem code:

```
mol = OEGraphMol()
for i in range(100000):
    OEParseSmiles(mol, "c1ccccc1Oc1ccccc1")
    mol.Clear()
```

takes about 60% of the time as this code:

```
for i in range(100000):
    mol = OEGraphMol()
    OEParseSmiles(mol, "c1ccccc1Oc1ccccc1")
```

(Bear in mind that this code isn't doing aromaticity perception, which roughly halves the performance.)

The function toolkit.make\_id\_and\_molecule\_parser() returns a specialized function to parse records, based on the specified parameters:

```
>>> from chemfp import rdkit_toolkit as T
>>> parser = T.make_id_and_molecule_parser("smi")
>>> parser("c1ccccc10 phenol")
('phenol', <rdkit.Chem.rdchem.Mol object at 0x11254b7b0>)
```

For RDKit it's about 10-15% faster to use the specialized function instead of the general purpose toolkit.  $parse\_molecule()$ :

```
>>> from __future__ import print_function # Only needed in Python 2
>>> from chemfp import rdkit_toolkit as T
>>> import time
>>>
>>> smiles = "c1ccccc1Oc1ccccc1"
>>> if 1:
... t1 = time.time()
```

The toolkit.make\_id\_and\_molecule\_parser() function parameters are almost identical to the ones in toolkit.parse\_id\_and\_molecule(), and with the same meaning. The only difference is that make\_id\_and\_molecule\_parser does not support the record parameter. Instead, it returns a function which takes the record and returns the (id, toolkit molecule) pair:

WARNING: The function that make\_id\_and\_molecule\_parser() returns may reuse the underlying molecule object. Calling the function again may change the molecule returned in previous call:

RDKit doesn't support molecule reuse so rdkit\_toolkit returns a new molecule. Open Babel does support reuse and openbabel\_toolkit will reuse the molecule. However, my tests using Open Babel show a barely detectable performance improvement if I reuse a molecule vs. creating a new one each time. Future versions of chemfp may change the default, and may add an implementation option to specify if a new molecule should be returned each time.

In multithreaded code you should create a new parser for each thread.

You might have noticed there is no "make\_molecule\_parser()". While it would be useful, it takes time to develop, test, and document, and it wasn't useful enough for this release. Let me know if you would like it in the future.

#### 6.44 Molecule API: Get and set the molecule id

In this section you'll learn how to get and set the molecule id for a toolkit molecule.

Sometimes you want to get or set toolkit molecule id. This should be pretty rare because the input routines all support a way to get the identifier in parallel with the molecule, and the output routines all support a way to specify an identifier.

One exception is if you read molecules from an SD file where you want to use one of the SD tag values as the identifier rather than the title line at the top of the record. This can occur with the ChEBI data set:

```
>>> from chemfp import rdkit_toolkit as T
>>> reader = T.read_ids_and_molecules("ChEBI_lite.sdf.gz", id_tag="ChEBI ID")
>>> next(reader)
('CHEBI:90', <rdkit.Chem.rdchem.Mol object at 0x1152648f0>)
>>> id, mol = _
>>> id
'CHEBI:90'
>>> mol
<rdkit.Chem.rdchem.Mol object at 0x1152648f0>
>>> mol.GetProp(" Name")
>>> print(reader.location.record[:34])
b'\n Marvin 01211310252D
>>> print(reader.location.record.decode("utf8")[:200])
 Marvin 01211310252D
22 24 0 0 0 0
                             999 V2000
   -2.8644
                       0.0000 C
                                  0 0 0 0 0 0
            -0.2905
                       0.0000 C
  -2.8656
            -1.1176
                                  0 0 0 0 0
                                                   0
```

Note: the location.record is a byte string. The decode("utf8") step is to make it easier to display under Python 3.

The above used the RDKit-specific way to get the special "\_Name" property and show that it's the empty string. The location object for the rdkit\_toolkit SDF reader is able to show the raw text for the current record. In the above I used the location record to show that the record indeed has no title line.

I might want to tie that id directly to the molecule. For example, a lot of people write code which assume that the molecule's name or title is the identifier, because only ChEBI and a scant handful of other databases use an alternative convention. You can use chemfp to get the appropriate id, then set the correct molecular property.

If I know it's an RDKit molecule then I could do:

```
mol.SetProp("_Name", id)
```

This is not portable. OEChem and Open Babel call this a "title", and use the molecule's "GetTitle()" and "SetTitle()" accession methods to get and set it. For those toolkits I would need to do:

```
mol.SetTitle(id)
```

As part of chemfp's limited molecule API, each chemfp toolkit layer implements a portable helper function named "get\_id()" to get the toolkit-appropriate "identifier", and "set\_id()" to set it. The following shows an example of converting the title of a SMILES record to upper-case, and generating the corresponding canonical SMILES:

```
>>> from __future__ import print_function # Only needed in Python 2
>>> import chemfp
>>> for toolkit_name in ("rdkit", "openeye", "openbabel", "cdk"):
...    T = chemfp.get_toolkit(toolkit_name)
...    mol = T.parse_molecule("c1ccccc10 phenol", "smi")
...    T.set_id(mol, T.get_id(mol).upper())
...    smiles = T.create_string(mol, "smi")
...    print(toolkit_name, "->", repr(smiles))
...
rdkit -> 'Oc1ccccc1 PHENOL\n'
openeye -> 'c1ccc(cc1)O PHENOL\n'
openbabel -> 'Oc1ccccc1 PHENOL\n'
cdk -> 'C1=CC=C(C=C1)O PHENOL\n'
```

Please note that this could be written more succinctly by passing the id directly to the *chemfp.toolkit*. *create\_string()* function, as:

```
>>> from __future__ import print_function # Only needed in Python 2
>>> import chemfp
>>> for toolkit_name in ("rdkit", "openeye", "openbabel", "cdk"):
...    T = chemfp.get_toolkit(toolkit_name)
...    id, mol = T.parse_id_and_molecule("c1ccccc10 phenol", "smi")
...    smiles = T. create_string(mol, "smi", id=id.upper())
...    print(toolkit_name, "->", repr(smiles))
...
rdkit -> 'Oc1ccccc1 PHENOL\n'
openeye -> 'c1ccc(cc1)0 PHENOL\n'
openbabel -> 'Oc1ccccc1 PHENOL\n'
cdk -> 'C1=CC=C(C=C1)0 PHENOL\n'
```

Note: I may add support for an optional id\_tag, as in:

```
T.get_id(mol, id_tag="ChEBI id") # Currently not valid chemfp code!
```

If you think this would be useful, please let me know about your use case.

Finally, if you want the output record as a UTF-8 encoded byte string rather than a Unicode string then use *chemfp.toolkit.create\_bytes()* instead of create\_string().

# 6.45 Molecule API: Copy a molecule

In this section you'll learn how to make a copy of a native toolkit molecule.

The chemfp file readers may clear and reuse the underlying toolkit molecule. This is a problem if you want to load all of the molecules from a data set into memory:

```
>>> mols[0] is mols[1]
True
>>> openeye_toolkit.create_string(mols[0], "smistring")
''
>>> openeye_toolkit.create_string(mols[1], "smistring")
''
```

You can see that the openeye\_toolkit reader reuses the same OEGraphMol, and that the molecule is cleared at the end of parsing.

In the future there may be a *reader\_args* parameter to tell the reader to make a new molecule for each term. Until that possible future happens, one work-around is to make a copy of the molecule using the respective chemfp toolkit's *toolkit.copy\_molecule()* function:

The various writers may also modify the molecule, for example, by temporarily changing the molecule id or by reperceiving aromaticity. If this is a problem then you can use the copy\_molecule() as a way to work around it.

This is definitely a work-around solution because it's currently impossible to know if a copy is needed or not. The fail-safe solution is to always copy, which will lead to extra copies and slower code when using the rdkit\_toolkit. Other more complicated workarounds might be faster, but the real solution that I hope to implement in the future is to specify the requested behavior as a parameter.

## 6.46 Molecule API: Working with SD tags

In this section you'll learn how to work with SD tag data.

Chemfp supports a limited cross-toolkit API for working with SD tags. You can get a value for a single tag, the list of all tags and values, and add (and potentially replace) a tag with a given name.

NOTE: This is not a general-purpose SD tag API.

The two main goals of the SD tag API are to get a tag's value (most likely for use as an identifier) and to add a fingerprint or similarity search result to a molecule. This can be done with the toolkit's toolkit.add\_tag() and toolkit.get\_tag() functions:

```
>>> T.add_tag(mol, "score", "0.9851")
>>> T.get tag(mol, "score")
'0.9851'
>>> print(T.create string(mol, "sdf"))
oxygen
    RDKit
 2 1 0 0 0 0 0 0 0 0999 V2000
   0.0000
            0.0000
                      0.0000 0
                                0 0
                                     0 0 0
                                             0 0
                                                  0
   0.0000
            0.0000
                      0.0000 0
                                0 0 0 0 0 0 0 0
 1 2 2 0
M END
> <score>
0.9851
$$$$
```

If a given tag already exists then add\_tag() may replace the existing value, or it may add a second tag with the same name. (Eg, rdkit\_toolkit currently replaces an existing tag while openeye\_toolkit creates a second entry.) Chemfp does no additional error checking, so please be careful about the use of ">" and newline characters in the tag value.

It is sometimes useful to get all of the tags and corresponding values. The toolkit's toolkit.  $get\_tag\_pairs()$  function returns these as a list of 2-element tuples, where the first term is the tag name and the second is the value:

```
>>> T.add_tag(mol, "best_id", "ABC00000123")
>>> T.add_tag(mol, "text", "This continues\nacross multiple\nlines")
>>> T.get_tag_pairs(mol)
[('score', '0.9851'), ('best_id', 'ABC00000123'), ('text', 'This continues\nacross_u
→multiple\nlines')]
>>> print(T.create_string(mol, "sdf"))
oxygen
    RDKit
 2 1 0
          0 0 0 0 0 0 0999 V2000
   0.0000
             0.0000
                      0.0000 D
                                0 0 0 0 0
                                              0 0 0 0 0 0 0
   0.0000
             0.0000
                      0.0000 0
                               0 0 0 0 0 0 0 0 0 0 0
 1 2 2 0
M END
> <score>
0.9851
> <best id>
ABC00000123
> <text>
This continues
across multiple
lines
$$$$
```

If there are multiple tags with the same name then <code>get\_tag()</code> arbitrarily decides which value to return. The <code>get\_tag\_pairs()</code> function includes duplicates if the underlying toolkit supports it.

## 6.47 Add fingerprints to an SD file using a toolkit

In this section you'll learn how to add a fingerprint as a tag to the structures in an SD file using a chemistry toolkit.

The FPS and FPB fingerprint file formats store the record id and the fingerprint, but not the original structure. The most common way to tie the structure to a fingerprint is to use an SD file, and store the fingerprint as one of the tag values. (Another is to create a SMILES file variant, also called a CSV file, with the fingerprint as a new column.)

The following will parse an SD file, and for each molecule it will compute the MACCS fingerprints and add the base64-encoded fingerprint to the molecule using the unimaginative tag name "FP". It will save the results to the file named "example.sdf", which is equally unimaginative:

```
import sys
import base64
import chemfp
# Portable code to convert a fingerprint to a string
# which the underlying toolkits will accept.
# b64encode returns a byte string, which is fine for
# all toolkits under Python 2.
if sys.version_info.major == 2:
  b64encode = base64.b64encode
else:
  # Under Python 3, RDKit and Open Babel accept a byte string.
  # OEChem does not. Always convert to Unicode.
  def b64encode(s):
   return base64.b64encode(s).decode("ascii")
# Select your toolkit of choice
fptype = chemfp.get fingerprint type("OpenEye-MACCS166")
#fptype = chemfp.get fingerprint type("OpenBabel-MACCS")
#fptype = chemfp.get_fingerprint_type("RDKit-MACCS166")
T = fptype.toolkit
reader args = {"rdkit.sdf.removeHs": False}
with T.read_molecules("Compound_099000001_099500000.sdf.gz",
                      reader_args=reader_args) as reader:
  with T.open_molecule_writer("example.sdf") as writer:
   for mol in reader:
      fp = fptype.compute_fingerprint(mol)
     T.add_tag(mol, "FP", b64encode(fp))
     writer.write_molecule(mol)
```

This is a very general purpose solution. It's easy to change the fingerprint type, or switch the input to a SMILES file or other supported structure file format.

(Unfortunately, there is no general purpose base64 encoder which works across all toolkits and both Python 2 and Python 3. Hence the complicated code to do the right thing.)

What it doesn't do is preserve all of the details of the input records. It converts the input record into a molecule, and back out to a new record, and the intermediate record doesn't keep all of the details.

For example, if I use OpenEye-MACCS166 and compare the first record of the original with the first record of the transformed output then the diff comparison is:

```
2c2
< -0EChem-04292009532D
---
> -0EChem-06182011512D
221a222,224
> > <FP>
> AAAEAAAAMAABwEBOk+GQU9yga24b
>
```

This says that the second line changed, and three new lines were added at line 221

The second line contains a date stamp, so this isn't a big change, and the three new lines are the ones I requested. This doesn't look like much of a change, but that's because OEChem was used to make the record in the first place. Open Babel and RDKit have their own set of differences from the OEChem output defaults. For example, RDKit will sort the SD tags alphabetically.

I wanted to compare the original OEChem-based PubChem record to the output record from RDKit. I commented/uncommented the fingerprint names to use RDKit instead of OEChem. When I did this originally (since fixed), I noticed that the atom and bond counts line changed.

The first problem I noticed, before I fixed it, is that the atom and bond counts line changed. The original record has 46 atoms and 49 bonds:

```
46 49 0 1 0 0 0 0999 V2000
```

while the RDKit output said there are only 28 atoms and 31 bonds:

```
28 31 0 0 1 0 0 0 0999 V2000
```

What happened is that RDKit by default will convert explicit hydrogens to implicit hydrogens as part of the input process, while OEChem does not.

I can disable that in RDKit using the removeHs reader\_arg, which is in the code I showed earlier:

```
reader_args = {"rdkit.sdf.removeHs": False}
```

With removeHs disabled, the RDKit atom counts match the original atom counts. There are still a few differences in the molblock.

- RDKit places a "0" in the obsolete 4th field of the counts line, while OEChem leaves it empty.
- RDKit uses the CHG property block and does not include duplicate charge information in the atom line. The PubChem file only stores charge information in the atom line.
- RDKit leaves the last three fields empty, while PubChem uses 0. These fields are respectively 'obsolete', used for "SSS queries only", and used for "Reaction, Query".

That aside, the MACCS fingerprints should be the same, right?

They are not. The RDKit (and Open Babel and CDK) MACCS keys implementations assume that all hydrogens are implicit. If there are explicit hydrogens then they will likely give a different fingerprint. If

you run the above code using RDKit, with and without removeHs, you'll see two different values for FP:

```
AAAEAAAAMAABxABOk+GwU9zhb24f # RDKit, removeHs=False
AAAEAAAAMAABwABOk2GwUdzhZ24f # RDKit, removeHs=True
```

See MACCS dependency on hydrogens for a more detailed description of the problem.

I'm left with the unfortunate situation where I can't preserve the explicit hydrogens without affecting the MACCS fingerprints. I think the right solution is to fix the SMARTS patterns that RDKit and others use (which is a goal of chemfp's own RDMACCS fingerprints).

Another solution for this is to use the *text\_toolkit* to preserve the input SDF record syntax, and combine it with a chemistry toolkit to get the molecule you want.

Text toolkit examples

The text toolkit separates record parsing from chemical parsing. It understands the basic text structure of SDF and SMILES-based files and records, but not chemistry. It's designed with the following use cases in mind:

- add tag data to an input SDF record but keep everything else unchanged. This preserves data which might be lost by converting to then from a chemical toolkit molecule.
- synchronize operations between multiple toolkits; For example, consider a hybrid fingerprint using both OEChem and RDKit. The individual RDKit and OEChem SDF readers may get out of synch when on toolkit can't parse a record which the other can. In that case, use the text toolkit to read the records then pass the record to the chemistry toolkit.
- extract tags from an SD file. Chemfp's sdf2fps uses the text toolkit to get the id and the tag value which contains the fingerprint.

The text toolkit implements the chemistry toolkit API, except that instead of real molecule objects it uses a thin wrapper around the text for each wrapper. This chapter uses many of the concepts developed in the chapter on *Toolkit API examples*.

# 7.1 Toolkits may modify the molecular structure

In this section you'll learn that a chemistry toolkit might change details of a structure record so the input record and output record have some differences, even though the molecular "essence" is preserved. This is meant as an example for why you might not want to work through a chemistry toolkit molecule for everything.

The section Add fingerprints to an SD file using a toolkit gave an example of using a toolkit to read an SD file, compute a MACCS fingerprint, add the fingerprint as a new SD tag, and save the result to a new SD file. This is a very common task.

A problem is that toolkits can apply various normalizations, like aromaticity perception, which change atom and bond aromaticity assignments. RDKit by default will also convert explicit hydrogens into implicit hydrogens. In that section, the input record had 46 atoms while RDKit generated an output record with 28

atoms. RDKit may also 'sanitize' the structures further (for example, convert 'neutral 5 coordinate Ns with double bonds to Os to the zwitterionic form').

While it's possible to configure RDKit to keep implicit hydrogens, the RDKit MACCS fingerprinter assumes there are no explicit hydrogens. You would need to make a copy of the molecule, remove the explicit hydrogens yourself, generate the fingerprint, and then add the fingerprint to the molecule which still has the explicit hydrogens.

Bear in mind that the number of explicit atoms and bonds is based on the molecular graph model, which is only one possible representation for the actual chemical molecule. While I said there was a semantic change, the 46 atom structure and the 28 atom structure are really the same structure, just at different levels of conceptualization.

# 7.2 Toolkits may modify SDF syntax

In this section you'll see that passing a structure file through a chemistry toolkit and back to the same format will likely make syntax changes to the record. While not as significant as the previous section, it may help persuade you that there are cases where you want to work with the original record as text rather than as a molecule.

You will need Compound\_099000001\_099500000.sdf.gz from PubChem.

I'll read an SD file to get the first record as a toolkit molecule, save the molecule to SDF format, and compare the original record with the new one. This is called a round-trip test. Will there be differences?

If I use the "openeye" toolkit and compare its output to the first record of the input then the difference is trivial:

```
2c2
< -0EChem-04292009532D
---
> -0EChem-06182012582D
```

This difference is shown in the diff utility's default format. The "2c2" means there was a change in line 2, and the changed line is also on line 2. The "<" indicates the line in the first file (in this case the original PubChem file) and the ">" indicates the line in the second file (in this case "example.sdf"). The "---" is to make it easier for humans to see break between the two files.

But what does that line mean? The "CTfile" ("connection table file") spec from MDL, err, I mean Accelry, err, I mean Symyx, err, I mean BIOVIA, gives the full details. The first two characters (both blank here) are

the user's initials, the next 8 characters (OpenEye uses "-" to pad out "OEChem") are the program name.

The next six character are the date, followed by 4 characters for the time. The PubChem record was created on 29 April 2020 at 09:33 while I did the transformation on 18 June 2020 at 12:58. The last two characters are the dimensionality; in this case the structure contains 2D coordinates.

PubChem used OEChem to make the file in the first place, so it's not too suprising that there weren't any differences. What about Open Babel? I changed the toolkit to "openbabel" and re-did the comparison. The first few lines of the diff are:

```
2c2
    -OEChem-04292009532D
<
  OpenBabel06182013012D
4c4
<
  46 49
                       0
                          0
                             0
                                0999 V2000
                   0
                       0
                          0
                             0
                                0999 V2000
```

The 2c2 change you know already, and you can see it was a few minutes between when I ran the OEChem code and the Open Babel code.

The change to line 4 is meaningless. If you look closely you'll see that OEChem has a blank in column 12 where Open Babel has a "0". The specification say that this field is obsolete, so I think you can do whatever you want there.

The next few lines are:

```
65c65
< 8 9 1 6 0 0 0
---
> 8 9 1 0 0 0 0
67c67
< 8 29 1 0 0 0 0
---
> 8 29 1 1 0 0 0
```

This says that OEChem interprets the bond between atoms 8 and 9 as "6" = "down" stereochemistry, while Open Babel says it's not stereo. On the other hand, OEChem interprets the bond bond atoms 8 and 29 as having no stereochemistry while Open Babel says it has "1" = "up" stereochemistry. Looks to me like two valid interpretations of the same thing.

The rest of the differences are trivial and semantically meaningless: Open Babel uses two spaces between the ">" and "<" of a data header line, while OEChem uses one space:

```
101c101
< > <PUBCHEM_COMPOUND_CID>
---
> > <PUBCHEM_COMPOUND_CID>
104c104
```

Finally, I'll use RDKit for the conversion. By default RDKit removes hydrogens, which would leave the result with 15 atoms. Unlike Open Babel, that action is configurable. I told RDKit to never remove hydrogens for any of its supported formats, via the reader args:

```
reader_args = {"rdkit.*.removeHs": False}
```

(I didn't actually need the "rdkit.\*." namespace prefix, but the "rdkit" helps as a reminder that this is an RDKit-specific option.)

There are the familiar changes in the second and fouth lines:

```
2c2
<
   -OEChem-04292009532D
>
      RDKit
                    2D
4c4
                             0999 V2000
<
  46 49 0
               1 0
                   0 0
                         0
  46 49
        0 0
             1 0
                   Ω
                      0 0
                             0999 V2000
```

RDKit doesn't include the timestamp so leaves that fields blank. (Then again, just how useful is the timestamp? On the third hand, the chemfp fingerprint formats include a timestamp as part of the metadata, so it's odd that I question having it in another format. On the fourth hand, OEChem supports the SuppressTimestamps option to disable including the timestamp.)

While I love knowing these sorts of details, none of these (except for the explicit hydrogens) affect the semantic interpretation. Still, I can think of cases where you want to preserve the original syntax, like if you have fragile code which expects a "0" at a certain field and will crash if there's a blank.

## 7.3 The text toolkit "molecules"

In this section you'll learn about the molecule-like object used by the text\_toolkit.

The text\_toolkit implements the standard toolkit API, which means it reads and writes "molecules". Remember that it isn't really a chemical molecule but more like a thin layer around a molecule record. Internally these are subclasses of a *TextRecord*, though I'll often refer to them as "text molecules" to distinguish them from the the actual record as a text string.

Every text molecule has an id attribute, which may be None if there is no identifier, and a *record* attribute containing the actual record as a string:

```
>>> from chemfp import text_toolkit
>>> mol = text toolkit.parse molecule("c1ccccc10 benzene", "smi")
>>> mol
SmiRecord(id='benzene', record=b'c1ccccc10 benzene', smiles='c1ccccc10',
encoding='utf8', encoding errors='strict')
           # a Unicode string
>>> mol.id
'benzene'
>>> mol.record # a byte string
b'c1ccccc10 benzene'
>>> text_toolkit.create_string(mol, "smistring")
'c1ccccc10'
>>> text_toolkit.create_string(mol, "smi")
'c1ccccc10 benzene\n'
>>> text_toolkit.create_bytes(mol, "smistring")
b'c1ccccc10'
>>> text_toolkit.create_bytes(mol, "smistring.zlib")
b'x\x9cK6L\x06\x01C\x7f\x00\x0fh\x03\x04'
>>>
>>> sdf record = (
```

```
methane n' +
     '\n' +
. . .
     '\n' +
     ' 1 0 0 0 0 0 0 0 0 0999 V2000\n' +
                 0.0000
    'M END\n' +
    '$$$$\n')
>>>
>>> sdf_mol = text_toolkit.parse_molecule(sdf_record, "sdf")
>>> sdf mol
SDFRecord(id_bytes=b'methane'(id='methane'),
record=b'methane\n\n 1 0 0 0 0 0 0 0 0999 V2000\n
                                                       0.0 ...',
encoding='utf8', encoding_errors='strict')
>>> sdf mol.id
'methane'
>>> sdf_mol.record[-20:]
b'0 0 0\nM END\n$$$\n'
```

The record is always uncompressed.

Each of the SMILES-based records has its own unique class:

```
>>> text_toolkit.parse_molecule("c1cccc10 benzene", "smi")
SmiRecord(id='benzene', record=b'c1ccccc10 benzene',
smiles='c1ccccc10', encoding='utf8', encoding_errors='strict')
>>> text_toolkit.parse_molecule("c1ccccc10 benzene", "can")
CanRecord(id='benzene', record=b'c1ccccc10 benzene',
smiles='c1ccccc10', encoding='utf8', encoding_errors='strict')
>>> text_toolkit.parse_molecule("c1ccccc10 benzene", "usm")
UsmRecord(id='benzene', record=b'c1ccccc10 benzene',
smiles='c1ccccc10', encoding='utf8', encoding_errors='strict')
>>> text_toolkit.parse_molecule("c1ccccc10 benzene", "smistring")
SmiStringRecord(id=None, record=b'c1ccccc10', smiles='c1ccccc10')
>>> text_toolkit.parse_molecule("c1ccccc10 benzene", "canstring")
CanStringRecord(id=None, record=b'c1ccccc10', smiles='c1ccccc10')
>>> text_toolkit.parse_molecule("c1ccccc10 benzene", "usmstring")
UsmStringRecord(id=None, record=b'c1ccccc10', smiles='c1ccccc10')
```

and for SMILES records you can access the SMILES directly through the smiles attribute:

```
>>> text_mol = text_toolkit.parse_molecule("C methane", "smistring")
>>> text_mol.smiles
'C'
```

Each text molecule also has a record\_format attribute, which is the format name for the record.

```
>>> text_mol.record_format
'smistring'
>>> sdf_mol.record_format
'sdf'
```

The record\_format values are "smi", "can", ..., "usmstring" for the SMILES formats or "sdf" for a file in SDF format. The record\_format will never have a compression suffix.

Unlike the chemistry-backed toolkits, the text\_toolkit has no real understanding of chemistry, only a limited knowledge of the format structure. It will parse an generate garbage:

```
>>> text_mol = text_toolkit.parse_molecule("garbage", "smi")
>>> text_toolkit.create_string(text_mol, "smi", id="and trash",
... writer_args={"delimiter": "tab"})
'garbage\tand trash\n'
```

The encoding and encoding\_errors parameters describe the character encoding of the record bytes, and how to handle errors in converting to or from that encoding. For details see the section *Unicode and other character encoding*.

# 7.4 The text toolkit implements the toolkit API

In this section you'll learn that the text toolkit is a pretty complete implementation of chemfp's toolkit API.

The text toolkit implements all of the standard toolkit API, except that it doesn't know how to convert between SMILES and SDF format. Here are some examples:

```
>>> from __future__ import print_function # Only needed for Python 2
>>> from chemfp import text_toolkit
>>> mol = text toolkit.parse molecule("C", "smistring")
>>> text_toolkit.get_id(mol) is None
>>> text toolkit.set id(mol, u"methane")
>>> text_toolkit.get_id(mol)
'methane'
>>> text_toolkit.create_string(mol, "smi")
'C methane\n'
>>> content = "C methane\nO=O molecular oxygen\n"
>>> with text_toolkit.read_ids_and_molecules_from_string(
             content, "smi") as reader:
       for id, mol in reader:
           print("#%d %r" % (reader.location.recno, id))
#1 'methane'
#2 'molecular oxygen'
>>> writer = text toolkit.open molecule writer("light.sdf")
>>> for mol in text_toolkit.read_molecules("Compound_099000001_099500000.sdf.gz"):
     mass = text_toolkit.get_tag(mol, "PUBCHEM_EXACT_MASS")
     mass = float(mass)
     if mass > 100.0:
       continue
     cid = text_toolkit.get_tag(mol, "PUBCHEM_COMPOUND_CID")
     print("Found", cid, mass)
     writer.write_molecule(mol)
Found 99109812 99.068414
Found 99109899 97.052764
Found 99118867 98.073165
```

```
Found 99118868 98.073165
Found 99123566 97.089149
Found 99151119 84.057515
Found 99151121 84.057515
Found 99162605 98.073165
Found 99162607 98.073165
>>> writer.close()
>>> for lineno, line in enumerate(open("light.sdf"), 1):
        print(repr(line))
        if lineno == 4:
            break
. . .
'99109812\n'
' -OEChem-04292009532D\n'
'\n'
' 16 17 0
               1 0 0 0 0 0999 V2000\n'
```

What you can't do with the text\_toolkit is convert from a SMILES-based format to SDF, or vice-versa. If you try you'll either get an exception or a meaningless molecule representation.

While you can seemingly convert between the SMILES formats, the text toolkit doesn't actually modify the SMILES term, so an input of "[238U]" will have a "canstring" (non-isomeric SMILES) of "[238U]":

```
>>> U = text_toolkit.parse_molecule("[235U]", "smistring")
>>> text_toolkit.create_string(U, "canstring")
'[235U]'
```

I don't know if I should make this more strict in the future, and prohibit conversion between "smi", "can", and "usm" formats.

# 7.5 Reading and adding SD tags with the text\_toolkit

In this section you'll learn how to get and set the title line and get and add tag values to an SDF record when you have the record as a block of text.

There are two ways to get or modify SD tags for an SDFRecord, which is the TextRecord subclass for files in SDF format. The first is through the standard toolkit API functions chemfp.toolkit.get\_tag(), chemfp.toolkit.get\_tag\_pairs(), and chemfp.toolkit.add\_tag():

```
>>> new_record = text_toolkit.create_string(mol, "sdf")
>>> print(new record)
methane
    RDKit
 1 0 0 0 0 0 0 0 0 0999 V2000
             0.0000 0.0000 C 0 0 0 0 0 0 0 0 0 0 0
   0.0000
M END
> <MW>
16.04246
$$$$
>>> new_mol = text_toolkit.parse_molecule(new_record, "sdf")
>>> text toolkit.get tag(new mol, "MW")
'16.04246'
>>> text_toolkit.get_tag_pairs(new_mol)
[('MW', u'16.04246')]
```

and the second is to use the corresponding methods of the text molecule:  $TextRecord.get\_tag()$ ,  $TextRecord.get\_tag\_pairs()$ , and  $TextRecord.add\_tag()$ :

```
>>> new_mol.get_tag_pairs()
[('MW', u'16.04246')]
>>> new_mol.get_tag("MW")
'16.04246'
>>>
>>> text_toolkit.get_tag_pairs(new_mol)
[('MW', u'16.04246')]
>>> new_mol.get_tag_pairs()
[('MW', u'16.04246')]
>>> new_mol.get_tag("MW")
'16.04246'
>>> new mol.add tag("NUM ATOMS", "5")
>>> print(text_toolkit.create_string(new_mol, "sdf")[-39:])
> <MW>
16.04246
> <NUM_ATOMS>
$$$$
```

Bear in mind that there is no way to delete a tag. This may be added in the future.

# 7.6 Synchronizing readers from different toolkits through the text toolkit

In this section you'll learn how to keep two different toolkit parsers synchronized by using the text toolkit to parse the records, then pass the record over to each toolkit to convert it to a molecule.

A structure file may have a couple of records which cannot be parsed by a toolkit, usually due to odd chemistry definitions. It's usually fine to skip those records, which is the purpose of the errors="ignore" setting. (See *Handling errors when reading molecules from a string* for more information about the *errors* parameter.)

Consider the following SMILES file with three lines:

```
% cat strange.smi
C methane
C--C ethane not for RDKit
CC ethane for everyone
```

The first and last are valid SMILES, but "C--C" is invalid. However, Open Babel will accept it, and OEChem will accept it because the default flavor does not add the "Strict" flavor flag. (See *OpenEye-specific SMILES reader\_args and writer\_args* for more information about OEChem flavors). As a result:

```
>>> from __future__ import print_function
                                            # Only needed for Python 2
>>> from chemfp import openeye_toolkit, rdkit_toolkit, openbabel_toolkit
>>> for id, mol in openeye toolkit.read ids and molecules("strange.smi", errors="ignore
"):
       print("openeye found", repr(id))
. . .
openeye found 'methane'
openeye found 'ethane not for RDKit'
openeye found 'ethane for everyone'
>>>
>>> for id, mol in rdkit_toolkit.read_ids_and_molecules("strange.smi", errors="ignore"):
        print("rdkit found", repr(id))
rdkit found 'methane'
[15:12:30] SMILES Parse Error: syntax error while parsing: C--C
[15:12:30] SMILES Parse Error: Failed parsing SMILES 'C--C' for input: 'C--C'
rdkit found 'ethane for everyone'
>>> for id, mol in openbabel_toolkit.read_ids_and_molecules("strange.smi", errors="ignore
"):
       print("openbabel found", repr(id))
openbabel found 'methane'
openbabel found 'ethane not for RDKit'
openbabel found 'ethane for everyone'
```

Sometime you want to work with multiple toolkits using the same input molecule. For example, you might want to compute a hybrid fingerprint, or make a model prediction where the descriptors come from different toolkits.

To do that, use the <code>text\_toolkit.read\_ids\_and\_molecules()</code> to read each record as a text molecule, and pass the actual record to the <code>toolkit.parse\_molecule()</code> for each toolkit to get a molecule. Because I specifed the "ignore" error handler, the molecule will be None if the record could not be parsed. (See <code>Specify alternate error behavior</code> for more details.):

```
.. code-block:: python
```

 $from \ chemfp \ import \ openeye\_toolkit, \ rdkit\_toolkit, \ openbabel\_toolkit \ from \ chemfp \ import \ text \ toolkit$ 

```
for id, text_mol in text_toolkit.read_ids_and_molecules("strange.smi", errors="ignore"):
    if openeye_toolkit.parse_molecule(text_mol.record, text_mol.record_format , errors="ignore"):
        print("openeye parsed", repr(id))
    else: print("openeye could not parse", repr(id))
    if rdkit_toolkit.parse_molecule(text_mol.record, text_mol.record_format , errors="ignore"):
        print("rdkit parsed", repr(id))
    else: print("rdkit could not parse", repr(id))
    if openbabel_toolkit.parse_molecule(text_mol.record, text_mol.record_format , errors="ignore"):
        print("openbabel parsed", repr(id))
    else: print("openbabel could not parse", repr(id))
```

The output from running the above is:

```
.. code-block:: none
```

openeye parsed 'methane' rdkit parsed 'methane' openbabel parsed 'methane' openeye parsed 'ethane not for RDKit' [15:13:45] SMILES Parse Error: syntax error while parsing: C-C [15:13:45] SMILES Parse Error: Failed parsing SMILES 'C-C' for input: 'C-C' rdkit could not parse 'ethane not for RDKit' openbabel parsed 'ethane not for RDKit' openeye parsed 'ethane for everyone' rdkit parsed 'ethane for everyone' openbabel parsed 'ethane for everyone'

The above works, but there's a lot of duplicate code, I don't like the layout for the output, and there's bit of extra overhead to re-interpret the parse\_molecule() for each call. I'll make a space-delimited file as output, and use toolkit.make\_id\_and\_molecule\_parser() to create a specialized parser for each available toolkit:

```
from __future__ import print_function
                                        # Only needed for Python 2
import chemfp
from chemfp import text_toolkit
reader = text_toolkit.read_ids_and_molecules("strange.smi")
format = reader.metadata.record format
column headers = []
parsers = []
for toolkit_name in ("openeye", "rdkit", "openbabel"):
  column_headers.append(toolkit_name)
   toolkit = chemfp.get_toolkit(toolkit_name)
  except ValueError:
   parsers.append(None)
   parser = toolkit.make_id_and_molecule_parser(format, errors="ignore")
   parsers.append(parser)
column_headers.append("ID")
print(*column_headers, sep="\t") # print the header
for id, text mol in reader:
  columns = []
```

```
for parser in parsers:
    if parser is None:
        columns.append("N/A")
    else:
        id, mol = parser(text_mol.record)
        if mol is not None:
            columns.append("Yes")
        else:
            columns.append("No")
    columns.append(id)
    print(*columns, sep="\t")
```

This writes a tab-delimited file to stdout, ready for import into any spreadsheet program:

```
.. code-block:: none
```

openeye rdkit openbabel ID Yes Yes Yes methane [15:15:21] SMILES Parse Error: syntax error while parsing: C–C [15:15:21] SMILES Parse Error: Failed parsing SMILES 'C–C' for input: 'C–C' Yes No Yes ethane not for RDKit Yes Yes Yes ethane for everyone

(There will also be error messages from RDKit sent to stderr.)

# 7.7 Add multiple toolkit fingerprints to an SD file

In this section you'll learn how to use multiple toolkits to generate fingerprints for each molecule in an SD file, and add the fingerprints results back to the record as new SD tags.

In Add fingerprints to an SD file using a toolkit you learned how to use a toolkit to read a file as molecules, compute a fingerprint for each molecule, and add the fingerprint to the molecule as an SD tag, and save the result to a new SD file. The processing pipeline converted the input to a toolkit molecule and out again, and in doing so changed other parts of the record besides the new SD tag.

Sometimes you want to preserve the input as much as you can. For that case you can use the text reader to get text molecules, pass each text molecule's record that to the toolkit to compute the fingerprint, add the new fingerprint as a tag for the text molecule, and save the result to a file.

I'll do that one better; I'll generate fingerprints using multiple toolkit and add all of them to the output file. Here's an example of what the end of a new record will look like. Note: although the fingerprints are actually on one line, I've folded the long fingerprints across multiple lines so it doesn't overflow this page.

#### > <obecfp2>

#### \$\$\$\$

I'll break it down into stages. The first is some preamble code to import the modules and configure the input and output files:

```
import chemfp
# I'll use chemfp's text-based SD parser, so the output SD records
# will be identical to the input records, except to append the new
# tags at the end of each record.

from chemfp import text_toolkit, bitops
input_filename = "Compound_099000001_099500000.sdf.gz"
output_filename = "output.sdf.gz"
```

Next is to get the right *SDF parser* (a function which converts an SDF record into a identifier and a native toolkit molecule) and *fingerprinter* (a function which converts a toolkit molecule into a fingerprint) for each fingerprint type.

```
# The list of tag names and the corresponding fingerprint types.
wanted_fingerprint_types = (
    ("rdkit512", "RDKit-Fingerprint fpSize=512"),
    ("rdkit1024", "RDKit-Fingerprint fpSize=1024"),
```

```
("oecircular4", "OpenEye-Circular maxradius=4"),
    ("obecfp2", "OpenBabel-ECFP2"),
build_data = [] # I'll use this to build the fingerprint data.
toolkit_sdf_record_parsers = {} # I'll use this to convert an SD record into a molecule.
for output_tag, fingerprint_type_string in wanted_fingerprint_types:
    # First, get the corresponding fingerprint type.
   fingerprint_type = chemfp.get_fingerprint_type(fingerprint_type_string)
    # Figure out which toolkit to use to parse the SD records.
   toolkit = fingerprint_type.toolkit
   # For each unique toolkit, get a function that turns an SD record into a molecule.
   # (If multiple fingerprints use the same toolkit then I only
    # need to parse it once.)
   if toolkit.name not in toolkit_sdf_record_parsers:
        # The "ignore" means to return None on error, rather than raise an exception.
       toolkit_sdf_record_parsers[toolkit.name] = toolkit.make_id_and_molecule_parser(
→"sdf", errors="ignore")
    # Get a function which turns a molecule into a fingerprint.
   fingerprinter = fingerprint_type.make_fingerprinter()
    # Store this information for record processing.
   build_data.append( (output_tag, toolkit.name, fingerprinter) )
```

Finally, use the text toolkit to read text molecules for each record, then use the SDF parser to get the id and molecule from the record text, then the fingerprinter to get the fingerprint from the molecule:

```
# Use the text toolkit to read and write SDF records.
with text_toolkit.open_molecule_writer(output_filename) as writer:
   for text mol in text toolkit.read molecules(input filename):
        # The text "molecule" .record is the actual text.
       record = text_mol.record
        # Make the fingerprints for each record and append the tag.
        # For extra performance, cache parsed molecules for future use.
        toolkit_mols = {}
        for output_tag, toolkit_name, fingerprinter in build_data:
            # There's no need to reparse the record if I've seen it before.
            if toolkit_name in toolkit_mols:
                toolkit_mol = toolkit_mols[toolkit_name]
            else:
                # Parse the record and save the molecule for later.
                toolkit_id, toolkit_mol = toolkit_sdf_record_parsers[toolkit_
→name] (record)
                toolkit_mols[toolkit_name] = toolkit_mol
```

```
if toolkit_mol is None:
    # There's no molecule, so no fingerprint. Save the empty string.
    text_mol.add_tag(output_tag, "")
else:
    # Make a fingeprint and save it to the tag as a hex-encoded string.
    fp = fingerprinter(toolkit_mol)
        text_mol.add_tag(output_tag, bitops.hex_encode(fp))

# Write the text molecule to the output stream.
writer.write_molecule(text_mol)
```

## 7.8 Text toolkit and SDF files

In this section you'll learn about the specialized SDF reader API to read SDF records and tag values directly instead of through a text record.

The text toolkit support for the toolkit API lets you use the same code for SDF and SMILES, and switch between text-based and molecule-based parsers. Genericness comes at a cost. The *TextRecord* class is a wrapper around the actual record, so at the least there is some overhead for creating a wrapper for each record.

The text toolkit has special support for reading SDF records as raw byte strings, which are not wrapped in any object. There several SDF reader variations depending on if you want to read from a file or a string, and if you want to read the record, the (id, record) pair, or an (id, tag value) pair. These functions are:

- read\_sdf\_records() iterate over the records in an SD file
- read\_sdf\_records\_from\_string() the same, but from a string
- read\_sdf\_ids\_and\_records() iterate over the (id, record string) pairs from an SD file
- read\_sdf\_ids\_and\_records\_from\_string() the same, but from a string
- read\_sdf\_ids\_and\_values() iterator over the (id, value) pairs from an SD file
- read\_sdf\_ids\_and\_values\_from\_string() the same, but from a string

(Note: while I write this as (id, value), those are just labels. By default it returns (SD title, SD title) pairs, or you can specify an alternate  $id\_tag$  and  $value\_tag$  to get the pairs you want.)

There are also special functions to work with the tag data and title of an SDF record, which take the record string as input:

- get\_sdf\_tag() get a named tag from an SDF record
- add\_sdf\_tag() return a new SDF record with the new tag and value at the end of the tag block
- get sdf tag pairs() return a list of (tag name, tag value) pairs
- get\_sdf\_id() return the first line of the SDF record
- set\_sdf\_id() return a new SDF record with the new title line

The next few sections will cover some examples of how to use these specialized functions.

# 7.9 Read id and tag value pairs from an SD file

In this section you'll learn how read the (id, tag value) for each record in an SD file using a specialized SDF reader. You will need Compound\_099000001\_099500000.sdf.gz from PubChem.

The specialized SDF readers are faster than the more generic text\_toolkit support for the toolkit API. As an example, I'll extract the identifer and molecular weight field from a PubChem file using the (slower) chemfp toolkit API:

```
from __future__ import print_function # Only needed for Python 2
from chemfp import text_toolkit

filename = "Compound_099000001_099500000.sdf.gz"
with text_toolkit.read_ids_and_molecules(filename) as reader:
   for id, text_mol in reader:
    mw = text_mol.get_tag("PUBCHEM_EXACT_MASS")
    print(id, mw)
```

Next I'll extract it using the (faster) <code>read\_sdf\_ids\_and\_values()</code> function, which returns an iterator of the (id, tag value) pairs. Just like with <code>toolkit.read\_ids\_and\_molecules()</code>, by default the id is the title line of the SD record, or I can use the <code>id\_tag</code> parameter to get it from one of the SD tags. The <code>value\_tag</code> has the same meaning; by default the value is the record's title, or I can specify an alternate tag name containing the value to use:

Both of these generate output starting with:

```
99000039 374.13789

99000230 449.162057

99002251 335.126991

99003537 374.210661

99003538 374.210661

99005028 315.183444

99005031 315.183444
```

My timings using the larger file Compound\_145500001\_146000000.sdf.gz show that the first, generic implementation takes 14.0 seconds while the second, specialized implementation takes 10.3 seconds, which is about 25% faster, which would save a lot of time when parsing all of PubChem. (The difference is even larger - nearly 50% faster! - without the gzip overhead.) That's why the sdf2fps command-line tool uses this function to extract the ids and fingerprint values from PubChem files.

# 7.10 Extract the id and atom and bond counts from an SD file

In this section you'll use a specialized SDF reader iterate over the records of an SD file. You will need Compound\_099000001\_099500000.sdf.gz from PubChem.

The "records" returned by read\_sdf\_records(), read\_sdf\_records\_from\_string(), read\_sdf\_ids\_and\_records(), and read\_sdf\_ids\_and\_records\_from\_string() are the actual record content as a string, and not wrapped in a TextRecord or other class.

For example, the following will read each record from an SD file and use a regular expression to extract the title line, the number of atoms from the first 3 characters of line 4, and the number of bonds as the second 3 characters of line 4:

```
from __future__ import print_function # Only needed for Python 2
from chemfp import text_toolkit
import re

pat = re.compile(br"(.*)\n.*\n.*\n(...)(...)")

filename = "Compound_099000001_099500000.sdf.gz"
for record in text_toolkit.read_sdf_records(filename):
    m = pat.match(record)
    id = m.group(1).decode("utf8")
    num_atoms = int(m.group(2))
    num_bonds = int(m.group(3))
    print(id, num_atoms, num_bonds)
```

The output starts:

```
99000039 46 49

99000230 58 60

99002251 42 43

99003537 54 57

99003538 54 57

99005028 48 49

99005031 48 49

99006292 56 58
```

(Bear in mind that there may also be implicit hydrogens, so unless you know that all hydrogens are explicit or implicit, these numbers may only be roughly useful.)

## 7.10.1 Records are byte strings

The example code, while short, is still a bit tricky. The reader returns the SD records as byte strings, not Unicode strings. Why? First and foremost, using Python to read bytes from a file is significantly faster than reading Unicode. If all you care about is reading a couple of fields from the record then it's faster to work with bytes and convert only those fields.

Second, this is a low-level API meant to give the actual byte representation of the data. Among other things, you should be able to know exactly where the record is located in the file. You can even do things like handle mixed encodings, where one tag value is UTF-8 encoded and another is Latin-1 encoded and cannot be read as a value UTF-8.

Python 3 makes a strong distinction between a byte string and a Unicode string. For Python 3, because the record a byte string, you'll have to use a byte-based regular expression to parse it, as in:

```
pat = re.compile(br"(.*)\n.*\n.*\n(...)(...)")
```

You'll also have to convert the title bytes to Unicode if you want to print the result, as in:

```
id = m.group(1).decode("utf8")
```

Thankfully, int() knows how to read the ASCII digits from a byte string, so I didn't have to do extra work there.

# 7.11 SDF-specific parser parameters

In this section you'll learn that the specialized SDF readers support the standard *errors* and *location*, and have a few special parameters of their own. You will need Compound\_099000001\_099500000.sdf.gz from PubChem.

All six of the read\_sdf\_\* functions support the same *errors* and *location* parameters as the standard toolkit API, with the same meaning. For example, the following shows where each record is located in the uncompressed file:

```
from __future__ import print_function # Only needed for Python 2
from chemfp import text_toolkit

filename = "Compound_099000001_099500000.sdf.gz"
with text_toolkit.read_sdf_ids_and_records(filename) as reader:
    loc = reader.location
    for id, record in reader:
        start_byte, end_byte = loc.offsets
        print("%s at line %d (bytes %d-%d)" % (id, loc.lineno, start_byte, end_byte))
```

The output starts:

```
.. code-block:: none
```

99000039 at line 1 (bytes 0-6709) 99000230 at line 223 (bytes 6709-14560) 99002251 at line 462 (bytes 14560-20689) 99003537 at line 668 (bytes 20689-28115) 99003538 at line 909 (bytes 28115-35540) 99005028 at line 1150 (bytes 35540-42315)

See Handling errors when reading molecules from a string for more information about the errors parameter, and Location information: record position and content for a description of the how to use a Location to the record's first line number and start/end offsets in the file.

The six functions do not have a *format* option, because the format must be "sdf" or "sdf.gz". Instead, there is a *compression* parameter. The default of None selects the compression type based on the filename, if the filename is available, or assumes the input is uncompressed. Use "gz" if the input is gzip'ed, "zst" if the input use Zstandard compression (and the zstandard Python package is available) and "none" or "" if the input is uncompressed.

The *block\_size* is a tunable parameter, with a default value of 320 KB. The underlying reader reads a block of text then tries to extract records. When it gets to the end of a block, it reads a new block, and prepends the remaining part of the old block to the new one before looking for new records.

For performance reasons, the *block\_size* should be several times larger than the largest record. During error recovery, the reader will read up to 320 KB or 5\*block\_size, whichever is larger, in order to find the next "\$\$\$\$" line and resynchronize.

# 7.12 Working with SD records as strings

In this section you'll learn about the helper functions to work with SD record id and tag data when the SD record is a string. You will need Compound\_099000001\_099500000.sdf.gz from PubChem.

I'll use one of the specialized SD file readers,  $read\_sdf\_records()$ , to get the first record from an SD file:

```
.. code-block:: pycon
```

**46 49 0 1 0 0 0 0 0999 V2000** 7.8451 3.0179 0.0000 O 0

I can use  $get\_sdf\_tag()$  and  $get\_sdf\_tag\_pairs()$  to get information about the tags in the record:

```
.. code-block:: pycon
```

```
>>> for tag_name, tag_value in text_toolkit.get_sdf_tag_pairs(record):
... print(tag_name, "=", repr(tag_value[:40]))
...
b'PUBCHEM_COMPOUND_CID' = b'99000039'
b'PUBCHEM_COMPOUND_CANONICALIZED' = b'1'
b'PUBCHEM_CACTVS_COMPLEXITY' = b'611'
b'PUBCHEM_CACTVS_HBOND_ACCEPTOR' = b'4'
...
b'PUBCHEM_CACTVS_TAUTO_COUNT' = b'-1'
b'PUBCHEM_COORDINATE_TYPE' = b'1\n5\n255'
b'PUBCHEM_BONDANNOTATIONS' = b'12 13 8\n12 17 8\n13 18 8\n16 19 8\n'
>>> text_toolkit.get_sdf_tag(record, "PUBCHEM_IUPAC_OPENEYE_NAME")
u'2-(2-hydroxyethylsulfanylmethyl)-4-nitro-phenol'
```

or use  $add\_sdf\_tag()$  to create a new record with a given tag and value added to the end of the tag block:

```
>>> print(record[-210:].decode("utf8"))
> <PUBCHEM_BONDANNOTATIONS>
12  13  8
12  17  8
13  18  8
16  19  8
16  23  8
17  20  8
18  21  8
19  22  8
19  24  8
```

```
20
   21
       8
22
   25
       8
23
   26
       8
24
   27
       8
25
   26
       8
27
   28 8
7
  22 8
7
  28 8
8
  9 6
$$$$
>>> new_record = text_toolkit.add_sdf_tag(record, b"VOLUME", b"123.45")
>>> print(new record[-229:].decode("utf8"))
> <PUBCHEM BONDANNOTATIONS>
12
   13
       8
12
   17
       8
   18
       8
13
16
   19
       8
   23
16
       8
17
   20
       8
18
   21
       8
19
   22
       8
19
   24
       8
20
   21
       8
22
   25
       8
23
   26
       8
24
   27
       8
25
   26 8
   28 8
27
7
  22 8
  28
      8
  9 6
> <VOLUME>
123.45
$$$$
```

I can also get the title line of the SD record using  $get\_sdf\_id()$ :

```
>>> text_toolkit.get_sdf_id(record)
b'99000039'
```

or create a new string which is the old string with the title line replaced by a new value:

```
>>> new_record = text_toolkit.set_sdf_id(record, b"987ZYX")
>>> text_toolkit.get_sdf_id(new_record)
b'987ZYX'
```

Note that I used byte strings, like b"VOLUME" and b"987ZYX". In general the values must be of the same string type as the record. On the flip side, if you have a Unicode record then you must pass in Unicode strings as values:

```
>>> unicode_record = record.decode("utf8")
>>> new_record = text_toolkit.set_sdf_id(unicode_record, u"Hello")
>>> new_record[:6]
'Hello\n'
```

# 7.13 Unicode and other character encoding

In this section you'll learn a bit about how the text toolkit deals with different character encodings. This is a hard topic and I won't cover it in full details. If you have a problem with Unicode encodings (and hopefuly a support contract) then contact me and I'll help that way.

The SDF format is 8-bit clean. The specification itself uses ASCII but fields like the title, the tag name, and the tag value can contain nearly any byte value. (Some values like newline and '<' and '>' in the tag name, have special meaning and must not be used.)

Unfortunately, different software handle those non-ASCII values differently. An older Unix system might use the Latin-1 character set, which is able to handle many European and some non-European languages, but doesn't have the Euro currency symbol. Microsoft Windows code page 1252 is effectively a superset of Latin-1, with the Euro symbol and a several other additional symbols.

There are of course many other symbols. The consensus for new systems is to use UTF-8 encoded Unicode, which is compatible with 8-bit clean ASCII and can handle most of the world's languages, plus a large number of symbols. This encoding may use one, two, or more bytes to represent each symbol.

The Python3 bindings of OpenEye, RDKit, and Open Babel's have all decided to interpret SD files as UTF-8 encoded. This consensus is great ... so long as your files are also compatible with UTF-8. But what if they aren't? What if you have to read Latin-1 encoded file, or worse, a file where different fields have multiple encodings?

To demonstrate the problem, I'll construct a problematic file for  $\beta$ -methylphenethylamine, with an experimental melting point of 140-142°C, stored in a Latin-1 encoded SD file. For now I'll use use 'Beta' for the name, and 'DEGREE' for the temperature, as placeholders for the two non-ASCII characters.

```
>>> from __future__ import print_function # Only needed for Python 2
>>> from chemfp import rdkit toolkit as T # use your toolkit of choice
>>> mol = T.parse_molecule("NCC(c1ccccc1)C", "smi")
>>> T.set id(mol, "Beta-methylphenethylamine")
>>> T.add_tag(mol, "MP", "140-142DEGREEC")
>>> unicode_record = T.create_string(mol, "sdf")
>>> print(unicode_record)
Beta-methylphenethylamine
     RDKit
10 10 0
           0 0 0 0
                       0 0 0999 V2000
    0.0000
              0.0000
                         0.0000 N
                                          0
                                              0
                                                 0
                                                    0
                                                       0
                                                          0
                                          0
                                                 0
                                                    0
                                                       0
                                                          0
                                                             0
                                                                0
    0.0000
              0.0000
                         0.0000 C
                                    0
                                       0
                                              0
    0.0000
              0.0000
                         0.0000 C
                                    0
                                       0
                                          0
                                             0
                                                0
                                                    0
                                                       0
                                                          0
                                                             0
                                       0
                                          0
                                                    0
                                                       0
    0.0000
              0.0000
                         0.0000 C
                                    0
                                              0
                                                 0
                                                          0
    0.0000
              0.0000
                         0.0000 C
                                    0
                                       0
                                          0
                                             0
                                                0
                                                    0
                                                       0
                                                          0
                                                             0
    0.0000
              0.0000
                         0.0000 C
                                    0
                                       0
                                          0
                                             0
                                                0
                                                    0
                                                       0
                                                          0
                                                             0
                         0.0000 C
                                       0
                                          0
                                             0
                                                0
                                                    0
                                                       0
                                                          0
                                                             0
    0.0000
              0.0000
                                    0
                                                                      0
    0.0000
              0.0000
                         0.0000 C
                                       0
                                          0
                                             0
                                                0
                                                    0
                                                       0
                                                          0
                                                             0
                                                                   0
                                                                       0
    0.0000
              0.0000
                         0.0000 C
                                    0
                                       0 0
                                             0
                                                0
                                                    0
                                                      0
                                                          0
                                                             0
```

```
0.0000
            0.0000
                      0.0000 C
                                0 0 0 0 0 0 0 0
                                                         0
                                                            0
    2
       1
         0
 1
 2
    3
       1
          0
 3
    4
       1
          0
 4
    5
       2
          0
 5
    6
       1
          0
 6
    7
       2
          0
 7
    8 1
          0
       2
 8
    9
          0
 3 10 1 0
 9 4 1
          0
 END
> <MP>
140-142DEGREEC
$$$$
```

Next, I'll replace the 'DEGREE' with the corresponding Unicode characters. (I'll use the long Unicode name to be explicit.)

Finally, I'll save it to the file "latin1.sdf", using the Latin-1 encoding:

```
>>> open("latin1.sdf", "wb").write(unicode_record.encode("latin1"))
948
```

(The "948" indicates that 948 bytes were written to the file.)

This is not valid UTF-8. In my terminal, the MP tag value looks like:

```
> <MP>
140-142 C
```

where the "" is the special symbol for REPLACEMENT CHARACTER, meaning that the actual character cannot be shown.

What happens if I read the file using each of the native toolkit APIs? First, OEChem under both Python 2.7 and Python 3.8:

```
>>> from openeye.oechem import *
>>> ifs = oemolistream("latin1.sdf")
>>> mol = OEGraphMol()
```

```
>>> OEReadMolecule(ifs, mol)
True
>>> OEGetSDData(mol, "MP") # OEChem on Python 2.7
'140-142\xb0C'
>>> OEGetSDData(mol, "MP") # OEChem on Python 3.8
'140-142\udcb0C'
```

Remember, OEGetSDData() on Python 2.7 returns byte strings, and you'll need to decode that string manually to get the degree symbol. While OEGetSDData() on Python 3.8 returns Unicode strings, but the byte "\xb0" is not a valid UTF-8 encoding. Instead, OEChem uses the Unicode codepoint "\udcb0". This is a surrogate for the actual character, and something I don't fully understand. Various sources say this is a UTF-16 behavior which isn't correct UTF-8. Python doesn't like it:

```
>>> print('140-142\udcb0C')
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
UnicodeEncodeError: 'utf-8' codec can't encode character '\udcb0' in position 7:

surrogates not allowed
```

Next, Open Babel under both Python 2.7 and Python 3.6:

```
>>> from openbabel import openbabel as ob
>>> conv = ob.OBConversion()
>>> mol = ob.OBMol()
>>> conv.ReadFile(mol, "latin1.sdf")
True
>>> mol.GetData("MP").GetValue() # Open Babel on Python 2.7
'140-142\xb0C'
>>> mol.GetData("MP").GetValue() # Open Babel on Python 3.8
'140-142\udcb0C'
```

Open Babel gives exactly the same results as OEChem.

Finally, RDKit:

RDKit doesn't give a surrogate value for the illegal UTF-8 character. Instead, it complains. Which also means there is no way to get that data from Python.

What do you do if you have to read a Latin-1 encoded SD file? One solution is to use an external tool like icony to translate the file to UTF8.

```
% iconv -f latin1 -t utf-8 < latin1.sdf > utf8.sdf
```

Another is to use Python to convert the entire file from Latin-1 to UTF8 then pass the transcoded contents to the toolkit:

```
>>> content = open("latin1.sdf", "rb").read()
>>> content = content.decode("latin1").encode("utf8")
>>>
>>> from __future__ import print_function # Only needed for Python 2
>>> import chemfp
>>> for tk in ("openbabel", "openeye", "rdkit"):
...         T = chemfp.get_toolkit(tk)
...         for mol in T.read_molecules_from_string(content, "sdf"):
...         print(tk, T.get_tag(mol, "MP"))
openbabel 140-142°C
openeye 140-142°C
rdkit 140-142°C
```

But if all you want is some of the tag data values, and not the molecule, then you can ask the text\_toolkit to read the record as a "latin1" encoded file:

```
>>> from chemfp import text_toolkit
>>> for mol in text_toolkit.read_molecules("latin1.sdf", encoding="latin1"):
... print(mol.get_tag("MP"))
...
140-142°C
```

The content is converted on-demand, that is, only when <code>get\_id()</code> or <code>get\_tag()</code> are called. The text\_toolkit's "molecule" stores the encoding so it knows how to decode the fields:

```
>>> mol.encoding 'latin1'
```

By the way, if you omit the 'encoding="latin1"' parameter then you'll get an exception:

# 7.14 Mixed encodings and raw bytes

In this section you'll learn how to get access to the id and tag data as byte strings rather than Unicode strings. This might be used if you have a perverse file which uses multiple encodings. If you run into that case, let me know - I'll give you a sympathy prize for having to deal with it.

In the previous section you learned a few ways to read an Latin-1 encoded SD file. What happens if the title line contains an id which is UTF-8 encoded while the tag data contains a Latin-1 encoded value? (Or if you have to deal with a 'clever' programmer who put in semi-binary data into a data field. Because that's the sort of thing we clever programmers sometimes do.)

The techniques I mentioned in that previous section won't work because they assume the entire file has the same encoding.

Instead, use the text toolkit to read the file, but access it through the byte API rather than the string API.

I need an example file. I'll start with the "latin1.sdf" file I created for the previous section, which uses a Latin-1 encoded degree symbol in the "MP" tag data. I'll modify it so the "Beta" in the title line is replaced by the UTF-8 encoded " $\beta$ " character.

On a UTF-8 terminal the title line and the MP tag data line are respectively:

On a Latin-1 terminal they are:

How do I get their "real" values? I'll use the text\_toolkit to read the first record from the file:

```
>>> from chemfp import text_toolkit
>>> mol = next(text_toolkit.read_molecules("mixed.sdf"))
>>> mol
SDFRecord(id_bytes=b'\xce\xb2-methylphenethylamine'(id='β-methylphenethylamine'),
record=b'\xce\xb2-methylphenethylamine\n RDKit \n\n 10 10 0 ...',
encoding='utf8', encoding_errors='strict')
```

The title line is in utf8 so that's not a problem

```
>>> print(mol.id) \beta - \text{methylphenethylamine}
```

But I won't be able to read the "MP" field because it's not UTF-8 encoded:

Instead, I'll use  $get\_tag\_as\_bytes()$  to get the underlying bytes for the named tag, rather than as converted to a Unicode string:

```
>>> mol.get_tag_as_bytes(b"MP")
'140-142\xb0C'
```

Once I have the bytes, I can decode them as Latin-1:

```
>>> print(mol.get_tag_as_bytes(b"MP").decode("latin1"))
140-142°C
```

Note that this function requires the tag name be the byte string which is found in the file. A Unicode name (which is the default string type under Python 3) will raise an exception:

```
>>> mol.get_tag_as_bytes(u"MP")
Traceback (most recent call last):
    ...
ValueError: tag must be a byte string or None
```

Use method  $get\_tag\_pairs\_as\_bytes()$  to get the list of all (tag, data) pairs, where both the tag and data are return as byte strings.

```
>>> mol.get_tag_pairs_as_bytes()
[(b'MP', b'140-142\xb0C')]
```

Finally, use id\_bytes to get the raw bytes for the identifier:

```
>>> mol.id_bytes
b'\xce\xb2-methylphenethylamine'
```

For example, if I read the file as Latin-1 then the Unicode id "MP" tag be what I expected, the id won't be correct. Instead, I can get the id\_bytes and decode it manually as UTF-8:

```
>>> mol2 = next(text_toolkit.read_molecules("mixed.sdf", encoding="latin1"))  
>>> print(mol2.get_tag("MP"))  
140-142°C  
>>> mol2.id  
'\hat{1}^2-methylphenethylamine'  
>>> print(mol2.id_bytes.decode("utf8"))  
\beta-methylphenethylamine
```

chemfp API

This chapter contains the docstrings for the public portion of the chemfp API.

# 8.1 chemfp top-level API

The following functions and classes are in the top-level chemfp module.

## 8.1.1 is\_licensed

## chemfp.is\_licensed()

Return True if the chemfp license is valid, otherwise return False.

**Returns** True or False

is\_licensed() was added in chemfp 3.2.1.

# 8.1.2 get\_license\_date

# chemfp.get\_license\_date()

Return expiration date as a 3-element tuple in the form (year, month, day).

If the license key is not found or does not pass the security check then the function returns None. If this version of chemfp does not need a license key then it returns (9999, 12, 25).

**Returns** a 3-element tuple or None

get\_license\_date() was added in chemfp 3.2.1.

## 8.1.3 open

chemfp.open(source, format=None, location=None, allow\_mmap=True)
Read fingerprints from a fingerprint file

Read fingerprints from *source*, using the given format. If *source* is a string then it is treated as a filename. If *source* is None then fingerprints are read from stdin. Otherwise, *source* must be a Python file object supporting the read and readline methods.

If *format* is None then the fingerprint file format and compression type are derived from the source filename, or from the name attribute of the source file object. If the source is None then the stdin is assumed to be uncompressed data in "fps" format.

The supported format strings are:

- "fps", "fps.gz", or "fps.zst" for fingerprints in FPS format
- "fpb", "fpb.gz" or "fpb.zst" for fingerprints in FPB format

The optional location is a chemfp. io. Location instance. It will only be used if the source is in FPS format.

If the source is in FPS format then open will return a *chemfp.fps\_io.FPSReader*, which will use the *location* if specified.

If the source is in FPB format then open will return a *chemfp.arena.FingerprintArena* and the *location* will not be used. If *allow\_mmap* is True then chemfp may use mmap to read uncompressed FPB files. If False then chemfp will read the file's contents into memory, which may give better performance if the FPB file is on a networked file system, at the expense of higher memory use.

Here's an example of printing the contents of the file:

```
from chemfp.bitops import hex_encode
reader = chemfp.open("example.fps.gz")
for id, fp in reader:
    print(id, hex_encode(fp))
```

#### **Parameters**

- source (A filename string, a file object, or None) The fingerprint source.
- format (string, or None) The file format and optional compression.

Returns a chemfp.fps\_io.FPSReader or chemfp.arena.FingerprintArena

# 8.1.4 load\_fingerprints

 $\label{load_fingerprints} \begin{tabular}{ll} chemfp.load\_fingerprints (\it reader, metadata=None, reorder=True, alignment=None, format=None, allow\_mmap=True) \end{tabular}$ 

Load all of the fingerprints into an in-memory FingerprintArena data structure

The function reads all of the fingerprints and identifers from *reader* and stores them into an in-memory *chemfp.arena.FingerprintArena* data structure which supports fast similarity searches.

If reader is a string, the None object, or has a read attribute then it, the format, and allow\_mmap will be passed to the chemfp.open() function and the result used as the reader. If that returns a FingerprintArena then the reorder and alignment parameters are ignored and the arena returned.

If reader is a FingerprintArena then the reorder and alignment parameters are ignored. If metadata is None then the input reader is returned without modifications, otherwise a new FingerprintArena is created, whose metadata attribue is metadata.

Otherwise the *reader* or the result of opening the file must be an iterator which returns (id, fingerprint) pairs. These will be used to create a new arena.

metadata specifies the metadata for all returned arenas. If not given the default comes from the source file or from reader.metadata.

The loader may reorder the fingerprints for better search performance. To prevent ordering, use reorder=False. The reorder parameter is ignored if the reader is an arena or FPB file.

The alignment option specifies the alignment data alignment and padding size for each fingerprint. A value of 8 means that each fingerprint will start on a 8 byte alignment, and use storage space which a multiple of 8 bytes long. The default value of None will determine the best alignment based on the fingerprint size and available popcount methods. This parameter is ignored if the reader is an arena or FPB file.

#### **Parameters**

- reader (a string, file object, or (id, fingerprint) iterator) An iterator over (id, fingerprint) pairs
- metadata (Metadata) The metadata for the arena, if other than reader.metadata
- reorder (*True or False*) Specify if fingerprints should be reordered for better performance
- alignment (a positive integer, or None) Alignment size in bytes (both data alignment and padding); None autoselects the best alignment.
- format (None, "fps", "fps.gz", "fps.zst", "fpb", "fpb.gz" or "fpb.zst") The file format name if the reader is a string
- allow\_mmap (True or False) Allow chemfp to use mmap on FPB files, instead of reading the file's contents into memory

Returns chemfp.arena.FingerprintArena

# 8.1.5 read\_molecule\_fingerprints

```
chemfp.read_molecule_fingerprints(type, source=None, format=None, id_tag=None, reader_args=None, errors="strict")

Read structures from source and return the corresponding ids and fingerprints
```

This returns an *chemfp.fps\_io.FPSReader* which can be iterated over to get the id and fingerprint for each read structure record. The fingerprint generated depends on the value of *type*. Structures are read from *source*, which can either be the structure filename, or None to read from stdin.

type contains the information about how to turn a structure into a fingerprint. It can be a string or a metadata instance. String values look like OpenBabel-FP2/1, OpenEye-Path, and OpenEye-Path/1 min\_bonds=0 max\_bonds=5 atype=DefaultAtom btype=DefaultBond. Default values are used for unspecified parameters. Use a Metadata instance with type and aromaticity values set in order to pass aromaticity information to OpenEye.

If format is None then the structure file format and compression are determined by the filename's extension(s), defaulting to uncompressed SMILES if that is not possible. Otherwise format may be "smi" or "sdf" optionally followed by ".gz" or ".bz2" to indicate compression. The OpenBabel and OpenEye toolkits also support additional formats.

If  $id\_tag$  is None, then the record id is based on the title field for the given format. If the input format is "sdf" then  $id\_tag$  specifies the tag field containing the identifier. (Only the first line is used for multi-line values.) For example, ChEBI omits the title from the SD files and stores the id after the "> <ChEBI ID>" line. In that case, use  $id\_tag =$  "ChEBI ID".

The reader\_args is a dictionary with additional structure reader parameters. The parameters depend on the toolkit and the format. Unknown parameters are ignored.

errors specifies how to handle errors. The value "strict" raises an exception if there are any detected errors. The value "report" sends an error message to stderr and skips to the next record. The value "ignore" skips to the next record.

Here is an example of using fingerprints generated from structure file:

```
from chemfp.bitops import hex_encode
fp_reader = chemfp.read_molecule_fingerprints("OpenBabel-FP4/1", "example.sdf.gz")
print("Each fingerprint has", fp_reader.metadata.num_bits, "bits")
for (id, fp) in fp_reader:
    print(id, hex_encode(fp))
```

See also chemfp.read\_molecule\_fingerprints\_from\_string().

#### Parameters

- ${\sf type}\,(string\ or\ {\sf Metadata})$  information about how to convert the input structure into a fingerprint
- source (A filename (as a string), a file object, or None to read from stdin) The structure data source.
- format (string, or None to autodetect based on the source) The file format and optional compression. Examples: "smi" and "sdf.gz"
- id\_tag (string, or None to use the default title for the given format)

   The tag containing the record id. Example: "ChEBI ID". Only valid for SD files.
- reader\_args (dict, or None to use the default arguments) additional parameters for the structure reader
- errors (one of "strict", "report", or "ignore") specify how to handle parse errors

Returns a chemfp.FingerprintReader

## 8.1.6 read molecule fingerprints from string

```
\label{lem:chemfp:read_molecule_fingerprints_from_string} (type, content, format, id\_tag=None, reader\_args=None, errors="strict")
```

Read structures from the content string and return the corresponding ids and fingerprints

The parameters are identical to <code>chemfp.read\_molecule\_fingerprints()</code> except that the entire content is passed through as a <code>content</code> string, rather than as a <code>source</code> filename. See that function for details.

You must specify the format! As there is no *source* filename, it's not possible to guess the format based on the extension, and there is no support for auto-detecting the format by looking at the string content.

#### Parameters

- type (string or Metadata) information about how to convert the input structure into a fingerprint
- content (string) The structure data as a string.
- format (string) The file format and optional compression. Examples: "smi" and "sdf.gz"
- id\_tag (string, or None to use the default title for the given format)

   The tag containing the record id. Example: "ChEBI ID". Only valid for SD files.
- reader\_args (dict, or None to use the default arguments) additional parameters for the structure reader
- errors (one of "strict" (raise exception), "report" (send a message to stderr and continue processing), or "ignore" (continue processing)) specify how to handle parse errors

Returns a chemfp.FingerprintReader

# 8.1.7 open\_fingerprint\_writer

 $\label{lem:chemfp:open_fingerprint_writer} (\textit{destination}, \; \textit{metadata} = None, \; \textit{format} = None, \; \textit{alignment} = 8, \; \textit{re-order} = True, \; level = None, \; tmpdir = None, \; max\_spool\_size = None, \; errors = "strict", \; location = None)$ 

Create a fingerprint writer for the given destination

The fingerprint writer is an object with methods to write fingerprints to the given destination. The output format is based on the format. If that's None then the format depends on the destination, or is "fps" if the attempts at format detection fail.

The *metadata*, if given, is a *Metadata* instance, and used to fill the header of an FPS file or META block of an FPB file.

If the output format is "fps", "fps.gz", or "fps.zst" then destination may be a filename, a file object, or None for stdout. If the output format is "fpb" then destination must be a filename or seekable file object. A fingerprint writer with compressed FPB output is not supported; use arena.save() instead, or post-process the file.

Use *level* to change the compression level. The default is 9 for gzip and 3 for ztd. Use "min", "default", or "max" as aliases for the minimum, default, and maximum values for each range.

Some options only apply to FPB output. The *alignment* specifies the arena byte alignment. By default the fingerprints are reordered by popcount, which enables sublinear similarity search. Set *reorder* to False to preserve the input fingerprint order.

The default FPB writer stores everything into memory before writing the file, which may cause performance problems if there isn't enough available free memory. In that case, set  $max\_spool\_size$  to the number of bytes of memory to use before spooling intermediate data to a file. (Note: there are two independent spools so this may use up to roughly twice as much memory as specified.)

Use *tmpdir* to specify where to write the temporary spool files if you don't want to use the operating system default. You may also set the TMPDIR, TEMP or TMP environment variables.

Some options only apply to FPS output. *errors* specifies how to handle recoverable write errors. The value "strict" raises an exception if there are any detected errors. The value "report" sends an error message to stderr and skips to the next record. The value "ignore" skips to the next record.

The *location* is a Location instance. It lets the caller access state information such as the number of records that have been written.

#### **Parameters**

- destination (a filename, file object, or None) the output destination
- metadata (a Metadata instance, or None) the fingerprint metadata
- format (None, "fps", "fps.gz", "fps.zst", or "fpb") the output format
- alignment (positive integer) arena byte alignment for FPB files
- reorder (*True or False*) True reorders the fingerprints by popcount, False leaves them in input order
- level (an integer, the strings "min", "default" or "max", or None for default) True reorders the fingerprints by popcount, False leaves them in input order
- tmpdir (string or None) the directory to use for temporary files, when max\_spool\_size is specified
- max\_spool\_size (integer, or None) number of bytes to store in memory before using a temporary file. If None, use memory for everything.
- location (a Location instance, or None) a location object used to access output state information

Returns a chemfp.FingerprintWriter

## 8.1.8 ChemFPError

#### class chemfp.ChemFPError

Base class for all of the chemfp exceptions

### 8.1.9 ParseError

#### class chemfp.ParseError

Exception raised by the molecule and fingerprint parsers and writers

The public attributes are:

msg

a string describing the exception

location

a chemfp.io.Location instance, or None

### 8.1.10 Metadata

#### class chemfp.Metadata

Store information about a set of fingerprints

The public attributes are:

num\_bits

the number of bits in the fingerprint

num\_bytes

the number of bytes in the fingerprint

# type

the fingerprint type string

#### aromaticity

aromaticity model (only used with OEChem, and now deprecated)

#### software

software used to make the fingerprints

#### sources

list of sources used to make the fingerprint

#### date

a datetime timestamp of when the fingerprints were made

#### \_\_repr\_\_()

Return a string like Metadata(num\_bits=1024, num\_bytes=128, type='OpenBabel/FP2', ...)

## \_\_str\_\_()

Show the metadata in FPS header format

 $\begin{array}{lll} \textbf{copy} (num\_bits=None, & num\_bytes=None, & type=None, & aromaticity=None, & software=None, \\ & sources=None, & date=None) \end{array}$ 

Return a new Metadata instance based on the current attributes and optional new values

When called with no parameter, make a new Metadata instance with the same attributes as the current instance.

If a given call parameter is not None then it will be used instead of the current value. If you want to change a current value to None then you will have to modify the new Metadata after you created it.

#### **Parameters**

- num\_bits (an integer, or None) the number of bits in the fingerprint
- num\_bytes (an integer, or None) the number of bytes in the fingerprint
- type (string or None) the fingerprint type description
- aromaticity (None) obsolete
- software (string or None) a description of the software
- sources (list of strings, a string (interpreted as a list with one string), or None) - source filenames
- date (a datetime instance, or None) creation or processing date for the contents

Returns a new Metadata instance

## 8.1.11 FingerprintReader

## class chemfp.FingerprintReader

Base class for all chemfp objects holding fingerprint records

All FingerprintReader instances have a metadata attribute containing a Metadata and can be iteratated over to get the (id, fingerprint) for each record.

### \_\_iter\_\_()

iterate over the (id, fingerprint) pairs

#### iter arenas(arena size=1000)

iterate through arena\_size fingerprints at a time, as subarenas

Iterate through arena\_size fingerprints at a time, returned as chemfp.arena.FingerprintArena instances. The arenas are in input order and not reordered by popcount.

This method helps trade off between performance and memory use. Working with arenas is often faster than processing one fingerprint at a time, but if the file is very large then you might run out of memory, or get bored while waiting to process all of the fingerprint before getting the first answer.

If arena\_size is None then this makes an iterator which returns a single arena containing all of the fingerprints.

Parameters arena\_size (positive integer, or None) - The number of fingerprints to put into each arena.

Returns an iterator of chemfp.arena.FingerprintArena instances

```
save(destination, format=None, level=None)
```

Save the fingerprints to a given destination and format

The output format is based on the *format*. If the format is None then the format depends on the *destination* file extension. If the extension isn't recognized then the fingerprints will be saved in "fps" format.

If the output format is "fps", "fps.gz", or "fps.zst" then destination may be a filename, a file object, or None; None writes to stdout.

If the output format is "fpb" then *destination* must be a filename or seekable file object. Chemfp cannot save to compressed FPB files.

## Parameters

- destination (a filename, file object, or None) the output destination
- format (None, "fps", "fps.gz", "fps.zst", or "fpb") the output format
- level (an integer, or "min", "default", or "max" for compressor-specific values) compression level when writing .gz or .zst files

Returns None

## get\_fingerprint\_type()

Get the fingerprint type object based on the metadata's type field

This uses self.metadata.type to get the fingerprint type string then calls chemfp. get\_fingerprint\_type() to get and return a chemfp.types.FingerprintType instance.

This will raise a TypeError if there is no metadata, and a ValueError if the type field was invalid or the fingerprint type isn't available.

 ${\bf Returns}\ {\bf a}\ {\it chemfp.types.FingerprintType}$ 

## 8.1.12 FingerprintIterator

#### class chemfp.FingerprintIterator

A chemfp. FingerprintReader for an iterator of (id, fingerprint) pairs

This is often used as an adapter container to hold the metadata and (id, fingerprint) iterator. It supports an optional location, and can call a close function when the iterator has completed.

A FingerprintIterator is a context manager which will close the underlying iterator if it's given a close handler.

Like all iterators you can use next() to get the next (id, fingerprint) pair.

\_\_init\_\_(metadata, id\_fp\_iterator, location=None, close=None)

Initialize with a Metadata instance and the (id, fingerprint) iterator

The *metadata* is a *Metadata* instance. The *id\_fp\_iterator* is an iterator which returns (id, fingerprint) pairs.

The optional *location* is a *chemfp.io.Location*. The optional *close* callable is called (as close()) whenever self.close() is called and when the context manager exits.

\_\_iter\_\_()

Iterate over the (id, fingerprint) pairs

close()

Close the iterator

The call will be forwarded to the close callable passed to the constructor. If that close is None then this does nothing.

# 8.1.13 Fingerprints

#### class chemfp.Fingerprints

A chemf.FingerprintReader containing a metadata and a list of (id, fingerprint) pairs.

This is typically used as an adapater when you have a list of (id, fingerprint) pairs and you want to pass it (and the metadata) to the rest of the chemfp API.

This implements a simple list-like collection of fingerprints. It supports:

- for (id, fingerprint) in fingerprints: ...
- id, fingerprint = fingerprints[1]
- len(fingerprints)

More features, like slicing, will be added as needed or when requested.

\_\_init\_\_(metadata, id\_fp\_pairs)

Initialize with a Metadata instance and the (id, fingerprint) pair list

The *metadata* is a *Metadata* instance. The *id\_fp\_iterator* is an iterator which returns (id, fingerprint) pairs.

## 8.1.14 FingerprintWriter

#### class chemfp.FingerprintWriter

Base class for the fingerprint writers

The three fingerprint writer classes are:

- chemfp.fps\_io.FPSWriter write an FPS file
- chemfp.fpb\_io.OrderedFPBWriter write an FPB file, sorted by popcount

• chemfp.fpb\_io.InputOrderFPBWriter - write an FPB file, preserving input order

If the chemfp\_converters package is available then its FlushFingerprintWriter will be used to write fingerprints in flush format.

Use *chemfp.open\_fingerprint\_writer()* to create a fingerprint writer class; do not create them directly.

All classes have the following attributes:

- metadata a chemfp.Metadata instance
- format a string describing the base format type (without compression); either 'fps' or 'fpb'
- closed False when the file is open, else True

Fingerprint writers are also their own context manager, and close the writer on context exit.

## $write_fingerprint(id, fp)$

Write a single fingerprint record with the given id and fp to the destination

#### Parameters

- id (string) the record identifier
- fp (byte string) the fingerprint

## write\_fingerprints(id\_fp\_pairs)

Write a sequence of (id, fingerprint) pairs to the destination

**Parameters id\_fp\_pairs** – An iterable of (id, fingerprint) pairs. *id* is a string and *fingerprint* is a byte string.

# close()

Close the writer

This will set self.closed to False.

## 8.1.15 ChemFPProblem

## class chemfp.ChemFPProblem

Information about a compatibility problem between a query and target.

```
Instances are generated by chemfp.check\_fingerprint\_problems() and chemfp.check\_metadata\_problems().
```

The public attributes are:

#### severity

```
one of "info", "warning", or "error"
```

#### error\_level

```
5 for "info", 10 for "warning", and 20 for "error"
```

#### category

a string used as a category name. This string will not change over time.

## description

a more detailed description of the error, including details of the mismatch. The description depends on *query\_name* and *target\_name* and may change over time.

## The current category names are:

- "num\_bits mismatch" (error)
- "num bytes mismatch" (error)
- "type mismatch" (warning)
- "aromaticity mismatch" (info)
- "software mismatch" (info)

# 8.1.16 check\_fingerprint\_problems

Return a list of compatibility problems between a fingerprint and a metadata

If there are no problems then this returns an empty list. If there is a bit length or byte length mismatch between the *query\_fp* byte string and the *target\_metadata* then it will return a list containing a *ChemFPProblem* instance, with a severity level "error" and category "num bytes mismatch".

This function is usually used to check if a query fingerprint is compatible with the target fingerprints. In case of a problem, the default message looks like:

```
>>> problems = check_fingerprint_problems("A"*64, Metadata(num_bytes=128))
>>> problems[0].description
'query contains 64 bytes but target has 128 byte fingerprints'
```

You can change the error message with the query name and target name parameters:

#### **Parameters**

- query\_fp (byte string) a fingerprint (usually the query fingerprint)
- target\_metadata (Metadata instance) the metadata to check against (usually the target metadata)
- query\_name (string) the text used to describe the fingerprint, in case of problem
- target\_name (string) the text used to describe the metadata, in case of problem

Returns a list of ChemFPProblem instances

# 8.1.17 check\_metadata\_problems

```
chemfp.check_metadata_problems(query_metadata, target_metadata, query_name="query", tar-
get_name="target")
```

Return a list of compatibility problems between two metadata instances.

If there are no probelms then this returns an empty list. Otherwise it returns a list of *ChemFPProblem* instances, with a severity level ranging from "info" to "error".

Bit length and byte length mismatches produce an "error". Fingerprint type and aromaticity mismatches produce a "warning". Software version mismatches produce an "info".

This is usually used to check if the query metadata is incompatible with the target metadata. In case of a problem the messages look like:

```
>>> import chemfp
>>> m1 = chemfp.Metadata(num_bytes=128, type="Example/1")
>>> m2 = chemfp.Metadata(num_bytes=256, type="Counter-Example/1")
>>> problems = chemfp.check_metadata_problems(m1, m2)
>>> len(problems)
2
>>> print(problems[1].description)
query has fingerprints of type 'Example/1' but target has fingerprints of type

-- 'Counter-Example/1'
```

You can change the error message with the query\_name and target\_name parameters:

#### Parameters

- fp (byte string) a fingerprint
- metadata (Metadata instance) the metadata to check against
- query\_name (string) the text used to describe the fingerprint, in case of problem
- target name (string) the text used to describe the metadata, in case of problem

Returns a list of ChemFPProblem instances

# 8.1.18 count\_tanimoto\_hits

chemfp.count\_tanimoto\_hits(queries, targets, threshold=0.7, arena\_size=100)

Count the number of targets within threshold of each query term

For each query in *queries*, count the number of targets in *targets* which are at least *threshold* similar to the query. This function returns an iterator containing the (query\_id, count) pairs.

Example:

Internally, queries are processed in batches with <code>arena\_size</code> elements. A small batch size uses less overall memory and has lower processing latency, while a large batch size has better overall performance. Use <code>arena\_size=None</code> to process the input as a single batch.

Note: an *chemfp.fps\_io.FPSReader* may be used as a target but it will only process one batch and not reset for the next batch. It's faster to search a *chemfp.arena.FingerprintArena*, but if you have an FPS file then that takes extra time to load. At times, if there is a small number of queries, the time to load the arena from an FPS file may be slower than the direct search using an FPSReader.

If you know the targets are in an arena then you may want to use chemfp.search.count\_tanimoto\_hits\_fp() or chemfp.search.count\_tanimoto\_hits\_arena().

#### Parameters

- queries (any fingerprint container) The query fingerprints.
- targets (chemfp.arena.FingerprintArena or the slower chemfp.fps\_io. FPSReader) The target fingerprints.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.
- arena\_size (a positive integer, or None) The number of queries to process in a batch

Returns iterator of the (query id, score) pairs, one for each query

# 8.1.19 count\_tanimoto\_hits\_symmetric

chemfp.count\_tanimoto\_hits\_symmetric(fingerprints, threshold=0.7)

Find the number of other fingerprints within threshold of each fingerprint

For each fingerprint in the *fingerprints* arena, find the number of other fingerprints in the same arena which are at least *threshold* similar to it. The arena must have pre-computed popcounts. A fingerprint never matches itself.

This function returns an iterator of (fingerprint id, count) pairs.

Example:

```
arena = chemfp.load_fingerprints("targets.fps.gz")
for (fp_id, count) in chemfp.count_tanimoto_hits_symmetric(arena, threshold=0.6):
    print(fp_id, "has", count, "neighbors with at least 0.6 similarity")
```

You may also be interested in chemfp.search.count\_tanimoto\_hits\_symmetric().

#### Parameters

- fingerprints (a FingerprintArena with precomputed popcount\_indices) The arena containing the fingerprints.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

**Returns** An iterator of (fp\_id, count) pairs, one for each fingerprint

# 8.1.20 threshold\_tanimoto\_search

chemfp.threshold\_tanimoto\_search(queries, targets, threshold=0.7, arena\_size=100) Find all targets within threshold of each query term

For each query in *queries*, find all the targets in *targets* which are at least *threshold* similar to the query. This function returns an iterator containing the (query\_id, hits) pairs. The hits are stored as a list of (target\_id, score) pairs.

Example:

Internally, queries are processed in batches with *arena\_size* elements. A small batch size uses less overall memory and has lower processing latency, while a large batch size has better overall performance. Use arena\_size=None to process the input as a single batch.

Note: an *chemfp.fps\_io.FPSReader* may be used as a target but it will only process one batch and not reset for the next batch. It's faster to search a *chemfp.arena.FingerprintArena*, but if you have an FPS file then that takes extra time to load. At times, if there is a small number of queries, the time to load the arena from an FPS file may be slower than the direct search using an FPSReader.

If you know the targets are in an arena then you may want to use chemfp.search. threshold\_tanimoto\_search\_fp() or chemfp.search.threshold\_tanimoto\_search\_arena().

#### **Parameters**

- queries (any fingerprint container) The query fingerprints.
- targets (chemfp.arena.FingerprintArena or the slower chemfp.fps\_io. FPSReader) The target fingerprints.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.
- arena\_size (positive integer, or None) The number of queries to process in a batch

**Returns** An iterator containing (query\_id, hits) pairs, one for each query. 'hits' contains a list of (target\_id, score) pairs.

# 8.1.21 threshold\_tanimoto\_search\_symmetric

 $\verb|chemfp.threshold_tanimoto_search_symmetric(|fingerprints|, |threshold=0.7)|$ 

Find the other fingerprints within threshold of each fingerprint

For each fingerprint in the *fingerprints* arena, find the other fingerprints in the same arena which share at least *threshold* similar to it. The arena must have pre-computed popcounts. A fingerprint never matches itself.

This function returns an iterator of (fingerprint, SearchResult) pairs. The chemfp.search. SearchResult hit order is arbitrary.

Example:

```
arena = chemfp.load_fingerprints("targets.fps.gz")

for (fp_id, hits) in chemfp.threshold_tanimoto_search_symmetric(arena, threshold=0.

→75):

print(fp_id, "has", len(hits), "neighbors:")

for (other_id, score) in hits.get_ids_and_scores():

print(" %s %.2f" % (other_id, score))
```

You may also be interested in the chemfp.search.threshold\_tanimoto\_search\_symmetric() function.

#### Parameters

- fingerprints (a FingerprintArena with precomputed popcount\_indices) The arena containing the fingerprints.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

Returns An iterator of (fp\_id, SearchResult) pairs, one for each fingerprint

# 8.1.22 knearest\_tanimoto\_search

chemfp.knearest\_tanimoto\_search(queries, targets, k=3, threshold=0.7, arena\_size=100) Find the k-nearest targets within threshold of each query term

For each query in *queries*, find the *k*-nearest of all the targets in *targets* which are at least *threshold* similar to the query. Ties are broken arbitrarily and hits with scores equal to the smallest value may have been omitted.

This function returns an iterator containing the (query\_id, hits) pairs, where hits is a list of (target\_id, score) pairs, sorted so that the highest scores are first. The order of ties is arbitrary.

# Example:

Internally, queries are processed in batches with *arena\_size* elements. A small batch size uses less overall memory and has lower processing latency, while a large batch size has better overall performance. Use arena size=None to process the input as a single batch.

Note: an *chemfp.fps\_io.FPSReader* may be used as a target but it will only process one batch and not reset for the next batch. It's faster to search a *chemfp.arena.FingerprintArena*, but if you have an FPS file then that takes extra time to load. At times, if there is a small number of queries, the time to load the arena from an FPS file may be slower than the direct search using an FPSReader.

If you know the targets are in an arena then you may want to use chemfp.search. knearest\_tanimoto\_search\_fp() or chemfp.search.knearest\_tanimoto\_search\_arena().

# Parameters

- queries (any fingerprint container) The query fingerprints.
- targets (chemfp.arena.FingerprintArena or the slower chemfp.fps\_io. FPSReader) The target fingerprints.
- k (positive integer) The maximum number of nearest neighbors to find.

- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.
- arena\_size (positive integer, or None) The number of queries to process in a batch

**Returns** An iterator containing (query\_id, hits) pairs, one for each query. The *hits* are a list of (target\_id, score) pairs, sorted by score.

# 8.1.23 knearest tanimoto search symmetric

 $chemfp.knearest\_tanimoto\_search\_symmetric(fingerprints, k=3, threshold=0.7)$ 

Find the k-nearest fingerprints within threshold of each fingerprint

For each fingerprint in the fingerprints arena, find the nearest k fingerprints in the same arena which have at least threshold similar to it. The arena must have pre-computed popcounts. A fingerprint never matches itself.

This function returns an iterator of (fingerprint, SearchResult) pairs. The *chemfp.search*. SearchResult hits are ordered from highest score to lowest, with ties broken arbitrarily.

Example:

```
arena = chemfp.load_fingerprints("targets.fps.gz")

for (fp_id, hits) in chemfp.knearest_tanimoto_search_symmetric(arena, k=5,□

→threshold=0.5):

print(fp_id, "has", len(hits), "neighbors, with scores", end="")

print(", ".join("%.2f" % x for x in hits.get_scores()))
```

You may also be interested in the <code>chemfp.search.knearest\_tanimoto\_search\_symmetric()</code> function.

#### **Parameters**

- fingerprints (a FingerprintArena with precomputed popcount\_indices) The arena containing the fingerprints.
- k (positive integer) The maximum number of nearest neighbors to find.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

**Returns** An iterator of (fp. id, SearchResult) pairs, one for each fingerprint

# 8.1.24 count\_tversky\_hits

chemfp.count\_tversky\_hits(queries, targets, threshold=0.7, alpha=1.0, beta=1.0, arena\_size=100)

Count the number of targets within threshold of each query term

For each query in *queries*, count the number of targets in *targets* which are at least *threshold* similar to the query. This function returns an iterator containing the (query\_id, count) pairs.

Example:

```
queries = chemfp.open("queries.fps")
targets = chemfp.load_fingerprints("targets.fps.gz")
for (query_id, count) in chemfp.count_tversky_hits(
```

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```
queries, targets, threshold=0.9, alpha=0.5, beta=0.5):
print(query_id, "has", count, "neighbors with at least 0.9 Dice similarity")
```

Internally, queries are processed in batches with *arena\_size* elements. A small batch size uses less overall memory and has lower processing latency, while a large batch size has better overall performance. Use arena\_size=None to process the input as a single batch.

Note: an *chemfp.fps\_io.FPSReader* may be used as a target but it will only process one batch and not reset for the next batch. It's faster to search a *chemfp.arena.FingerprintArena*, but if you have an FPS file then that takes extra time to load. At times, if there is a small number of queries, the time to load the arena from an FPS file may be slower than the direct search using an FPSReader.

If you know the targets are in an arena then you may want to use chemfp.search. count\_tversky\_hits\_fp() or chemfp.search.count\_tversky\_hits\_arena().

#### **Parameters**

- queries (any fingerprint container) The query fingerprints.
- targets (chemfp.arena.FingerprintArena or the slower chemfp.fps\_io. FPSReader) The target fingerprints.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.
- arena\_size (a positive integer, or None) The number of queries to process in a batch

Returns iterator of the (query\_id, score) pairs, one for each query

# 8.1.25 count\_tversky\_hits\_symmetric

chemfp.count\_tversky\_hits\_symmetric(fingerprints, threshold=0.7, alpha=1.0, beta=1.0) Find the number of other fingerprints within threshold of each fingerprint

For each fingerprint in the *fingerprints* arena, find the number of other fingerprints in the same arena which are at least *threshold* similar to it. The arena must have pre-computed popcounts. A fingerprint never matches itself.

This function returns an iterator of (fingerprint\_id, count) pairs.

Example:

You may also be interested in chemfp.search.count\_tversky\_hits\_symmetric().

#### **Parameters**

- fingerprints (a FingerprintArena with precomputed popcount\_indices) The arena containing the fingerprints.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

Returns An iterator of (fp\_id, count) pairs, one for each fingerprint

# 8.1.26 threshold\_tversky\_search

```
 \begin{array}{c} \texttt{chemfp.threshold\_tversky\_search}(\textit{queries}, & \textit{targets}, & \textit{threshold} = 0.7, & \textit{alpha} = 1.0, & \textit{beta} = 1.0, \\ & \textit{arena\_size} = 100) \end{array}
```

Find all targets within  $\it threshold$  of each query term

For each query in *queries*, find all the targets in *targets* which are at least *threshold* similar to the query. This function returns an iterator containing the (query\_id, hits) pairs. The hits are stored as a list of (target\_id, score) pairs.

Example:

Internally, queries are processed in batches with *arena\_size* elements. A small batch size uses less overall memory and has lower processing latency, while a large batch size has better overall performance. Use arena\_size=None to process the input as a single batch.

Note: an *chemfp.fps\_io.FPSReader* may be used as a target but it will only process one batch and not reset for the next batch. It's faster to search a *chemfp.arena.FingerprintArena*, but if you have an FPS file then that takes extra time to load. At times, if there is a small number of queries, the time to load the arena from an FPS file may be slower than the direct search using an FPSReader.

If you know the targets are in an arena then you may want to use chemfp.search. threshold\_tversky\_search\_fp() or chemfp.search.threshold\_tversky\_search\_arena().

#### **Parameters**

- queries (any fingerprint container) The query fingerprints.
- targets (chemfp.arena.FingerprintArena or the slower chemfp.fps\_io. FPSReader) The target fingerprints.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.
- arena\_size (positive integer, or None) The number of queries to process in a batch

**Returns** An iterator containing (query\_id, hits) pairs, one for each query. 'hits' contains a list of (target\_id, score) pairs.

# 8.1.27 threshold\_tversky\_search\_symmetric

 $\label{lem:chemfp:threshold_tversky_search_symmetric} (fingerprints, threshold=0.7, alpha=1.0, beta=1.0) \\ Find the other fingerprints within threshold of each fingerprint$ 

For each fingerprint in the *fingerprints* arena, find the other fingerprints in the same arena which share at least *threshold* similar to it. The arena must have pre-computed popcounts. A fingerprint never matches itself.

This function returns an iterator of (fingerprint, SearchResult) pairs. The chemfp.search. SearchResult hit order is arbitrary.

# Example:

You may also be interested in the chemfp.search.threshold\_tversky\_search\_symmetric() function.

#### **Parameters**

- fingerprints (a FingerprintArena with precomputed popcount\_indices) The arena containing the fingerprints.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

Returns An iterator of (fp\_id, SearchResult) pairs, one for each fingerprint

# 8.1.28 knearest\_tversky\_search

```
 \begin{array}{lll} \texttt{chemfp.knearest\_tversky\_search}(\textit{queries}, & \textit{targets}, & \textit{k=3}, & \textit{threshold=0.7}, & \textit{alpha=1.0}, & \textit{beta=1.0}, \\ & \textit{arena} & \textit{size=100}) \end{array}
```

Find the k-nearest targets within threshold of each query term

For each query in *queries*, find the *k*-nearest of all the targets in *targets* which are at least *threshold* similar to the query. Ties are broken arbitrarily and hits with scores equal to the smallest value may have been omitted.

This function returns an iterator containing the (query\_id, hits) pairs, where hits is a list of (target\_id, score) pairs, sorted so that the highest scores are first. The order of ties is arbitrary.

#### Example:

Internally, queries are processed in batches with *arena\_size* elements. A small batch size uses less overall memory and has lower processing latency, while a large batch size has better overall performance. Use arena size=None to process the input as a single batch.

Note: an <code>chemfp.fps\_io.FPSReader</code> may be used as a target but it will only process one batch and not reset for the next batch. It's faster to search a <code>chemfp.arena.FingerprintArena</code>, but if you have an FPS file then that takes extra time to load. At times, if there is a small number of queries, the time to load the arena from an FPS file may be slower than the direct search using an FPSReader.

If you know the targets are in an arena then you may want to use chemfp.search. knearest\_tversky\_search\_fp() or chemfp.search.knearest\_tversky\_search\_arena().

#### Parameters

- queries (any fingerprint container) The query fingerprints.
- targets (chemfp.arena.FingerprintArena or the slower chemfp.fps\_io. FPSReader) The target fingerprints.
- k (positive integer) The maximum number of nearest neighbors to find.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.
- arena\_size (positive integer, or None) The number of queries to process in a batch

**Returns** An iterator containing (query\_id, hits) pairs, one for each query. The *hits* are a list of (target\_id, score) pairs, sorted by score.

# 8.1.29 knearest\_tversky\_search\_symmetric

Find the k-nearest fingerprints within threshold of each fingerprint

For each fingerprint in the fingerprints arena, find the nearest k fingerprints in the same arena which have at least threshold similar to it. The arena must have pre-computed popcounts. A fingerprint never matches itself.

This function returns an iterator of (fingerprint, SearchResult) pairs. The *chemfp.search*. SearchResult hits are ordered from highest score to lowest, with ties broken arbitrarily.

Example:

You may also be interested in the chemfp.search.knearest\_tversky\_search\_symmetric() function.

#### **Parameters**

- fingerprints (a FingerprintArena with precomputed popcount\_indices) The arena containing the fingerprints.
- k (positive integer) The maximum number of nearest neighbors to find.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

Returns An iterator of (fp\_id, SearchResult) pairs, one for each fingerprint

# 8.1.30 get\_fingerprint\_families

```
chemfp.get_fingerprint_families(toolkit_name=None)
Return a list of available fingerprint families
```

Parameters toolkit\_name (string) - restrict fingerprints to the named toolkit

Returns a list of chemfp.types.FingerprintFamily instances

# 8.1.31 get\_fingerprint\_family

```
chemfp.get fingerprint family (family name)
```

Return the named fingerprint family, or raise a ValueError if not available

Given a family\_name like OpenBabel-FP2 or OpenEye-MACCS166 return the corresponding chemfp. types.FingerprintFamily.

Parameters family\_name (string) - the family name

Returns a chemfp.types.FingerprintFamily instance

# 8.1.32 get\_fingerprint\_family\_names

 $\verb|chemfp.get_fingerprint_family_names|| (include\_unavailable = False,\ toolkit\_name = None)||$ 

Return a set of fingerprint family name strings

The function tries to load each known fingerprint family. The names of the families which could be loaded are returned as a set of strings.

If  $include\_unavailable$  is True then this will return a set of all of the fingerprint family names, including those which could not be loaded.

The set contains both the versioned and unversioned family names, so both OpenBabel-FP2/1 and OpenBabel-FP2 may be returned.

Parameters include\_unavailable (*True or False*) – Should unavailable family names be included in the result set?

Returns a set of strings

# 8.1.33 get\_fingerprint\_type

chemfp.get fingerprint type(type, fingerprint kwarqs=None)

Get the fingerprint type based on its type string and optional keyword arguments

Given a fingerprint type string like OpenBabel-FP2, or RDKit-Fingerprint/1 fpSize=1024, return the corresponding chemfp.types.FingerprintType.

The fingerprint type string may include fingerprint parameters. Parameters can also be specified through the *fingerprint\_kwargs* dictionary, where the dictionary values are native Python values. If the same parameter is specified in the type string and the kwargs dictionary then the *fingerprint\_kwargs* takes precedence.

For example:

Use  $get\_fingerprint\_type\_from\_text\_settings()$  if your fingerprint parameter values are all string-encoded, eg, from the command-line or a configuration file.

#### **Parameters**

- type (string) a fingerprint type string
- fingerprint\_kwargs (a dictionary of string names and Python types for values) fingerprint type parameters

Returns a chemfp.types.FingerprintType

# 8.1.34 get fingerprint type from text settings

```
chemfp.get_fingerprint_type_from_text_settings(type, settings=None)
```

Get the fingerprint type based on its type string and optional settings arguments

Given a fingerprint type string like OpenBabel-FP2, or RDKit-Fingerprint/1 fpSize=1024, return the corresponding chemfp.types.FingerprintType.

The fingerprint type string may include fingerprint parameters. Parameters can also be specified through the *settings* dictionary, where the dictionary values are string-encoded values. If the same parameter is specified in the *type* string and the *settings* dictionary then the *settings* take precedence.

For example:

This function is for string settings from a configuration file or command-line. Use get fingerprint type() if your fingerprint parameters are Python values.

#### **Parameters**

- type (string) a fingerprint type string
- fingerprint\_kwargs (a dictionary of string names and Python types for values) fingerprint type parameters

Returns a chemfp.types.FingerprintType

# 8.1.35 has\_fingerprint\_family

```
chemfp.has fingerprint family (family name)
```

Test if the fingerprint family is available

Return True if the fingerprint family\_name is available, otherwise False. The family\_name may be versioned or unversioned, like "OpenBabel-FP2/1" or "OpenEye-MACCS166".

Parameters family\_name (string) - the family name

Returns True or False

# 8.1.36 get\_max\_threads

```
chemfp.get_max_threads()
```

Return the maximum number of threads available.

WARNING: this likely doesn't do what you think it does. Do not use!

If OpenMP is not available then this will return 1. Otherwise it returns the maximum number of threads available, as reported by omp\_get\_num\_threads().

# 8.1.37 get\_num\_threads

## chemfp.get\_num\_threads()

Return the number of OpenMP threads to use in searches

Initially this is the value returned by omp\_get\_max\_threads(), which is generally 4 unless you set the environment variable OMP\_NUM\_THREADS to some other value.

It may be any value in the range 1 to get\_max\_threads(), inclusive.

**Returns** the current number of OpenMP threads to use

# 8.1.38 set\_num\_threads

```
chemfp.set num threads(num threads)
```

Set the number of OpenMP threads to use in searches

If *num\_threads* is less than one then it is treated as one, and a value greater than get\_max\_threads() is treated as get\_max\_threads().

Parameters num\_threads (int) - the new number of OpenMP threads to use

# 8.1.39 get\_toolkit

```
chemfp.get_toolkit(toolkit name)
```

Return the named toolkit, if available, or raise a ValueError

If toolkit\_name is one of "openbabel", "openeye", or "rdkit" and the named toolkit is available, then it will return chemfp.openbabel\_toolkit, chemfp.openeye\_toolkit, or chemfp.rdkit\_toolkit, respectively:

Parameters toolkit\_name (string) - the toolkit name

Returns the chemfp toolkit

Raises ValueError if toolkit\_name is unknown or the toolkit does not exist

# 8.1.40 get\_toolkit\_names

## chemfp.get\_toolkit\_names()

Return a set of available toolkit names

The function checks if each supported toolkit is available by trying to import its corresponding module. It returns a set of toolkit names:

```
>>> import chemfp
>>> chemfp.get_toolkit_names()
set(['openeye', 'rdkit', 'openbabel'])
```

**Returns** a set of toolkit names, as strings

# 8.1.41 has\_toolkit

```
chemfp.has_toolkit(toolkit_name)
```

Return True if the named toolkit is available, otherwise False

If *toolkit\_name* is one of "openbabel", "openeye", or "rdkit" then this function will test to see if the given toolkit is available, and if so return True. Otherwise it returns False.

```
>>> import chemfp
>>> chemfp.has_toolkit("openeye")
True
>>> chemfp.has_toolkit("openbabel")
False
```

The initial test for a toolkit can be slow, especially if the underlying toolkit loads a lot of shared libraries. The test is only done once, and cached.

Parameters toolkit\_name (string) - the toolkit name

Returns True or False

# 8.2 chemfp.types - fingerprint families and types

A "fingerprint type" is an object which knows how to convert a molecule into a fingerprint. A "fingerprint family" is an object which uses a set of parameters to make a specific fingerprint type.

```
>>> import chemfp
>>> fpfamily = chemfp.get_fingerprint_family("RDKit-Fingerprint")
>>> fpfamily.get_defaults()
{'maxPath': 7, 'fpSize': 2048, 'nBitsPerHash': 2, 'minPath': 1, 'useHs': 1}
>>>
>>> fptype = fpfamily() # create the default fingerprint type
>>> fptype.get_type()
'RDKit-Fingerprint/2 minPath=1 maxPath=7 fpSize=2048 nBitsPerHash=2 useHs=1'
>>>
>>> fptype = fpfamily(fpSize=1024)
                                 # use a non-default value
>>> fptype.get type()
'RDKit-Fingerprint/2 minPath=1 maxPath=7 fpSize=1024 nBitsPerHash=2 useHs=1'
>>> mol = fptype.toolkit.parse molecule("c1ccccc10", "smistring")
>>> fptype.compute_fingerprint(mol)
```

# 8.2.1 FingerprintFamily

class chemfp.types.FingerprintFamily

A FingerprintFamily is used to create a FingerprintType or get information about its parameters

Two reasons to use a FingerprintFamily (instead of using  $chemfp.get\_fingerprint\_type()$  or  $chemfp.get\_fingerprint\_type\_from\_text\_settings()$ ) are:

- figure out the default arguments;
- given a text settings or parameter dictionary, use the keys from the default argument keys to remove other parameters before creating a FingerprintType (otherwise the creation function will raise an exception)

All fingerprint families have the following attributes:

- name the type name, including version
- toolkit the toolkit API for the underlying chemistry toolkit, or None

```
__repr__()
```

Return a string like 'FingerprintFamily(<RDKit-Fingerprint/2>)'

#### name

Read-only attribute.

The full fingerprint name, including the version

#### base name

Read-only attribute.

The base fingerprint name, without the version

#### version

Read-only attribute.

The fingerprint version

#### toolkit

Read-only attribute.

The toolkit used to implement this fingerprint, or None

```
__call__(**fingerprint_kwargs)
```

Create a fingerprint type; keyword arguments can override the defaults

The argument values are native Python values, not string-encoded values:

```
>>> import chemfp
>>> family = chemfp.get_fingerprint_family("RDKit-Fingerprint")
>>> fptype = family()
>>> fptype.get_type()
'RDKit-Fingerprint/2 minPath=1 maxPath=7 fpSize=2048 nBitsPerHash=2 useHs=1'
>>> fptype = family(fpSize=1024)
>>> fptype.get_type()
'RDKit-Fingerprint/2 minPath=1 maxPath=7 fpSize=1024 nBitsPerHash=2 useHs=1'
```

The function will raise an exception for unknown arguments.

Parameters fingerprint\_kwargs - the fingerprint parameters

Returns an object implementing the chemfp.types.FingerprintType API

# from\_kwargs(fingerprint\_kwargs=None)

Create a fingerprint type; items in the fingerprint\_kwargs dictionary can override the defaults

The dictionary values are native Python values, not string-encoded values:

```
>>> import chemfp
>>> family = chemfp.get_fingerprint_family("RDKit-Fingerprint")
>>> fptype = family()
>>> fptype.get_type()
'RDKit-Fingerprint/2 minPath=1 maxPath=7 fpSize=2048 nBitsPerHash=2 useHs=1'
>>> fptype = family.from_kwargs({"fpSize": 1024})
>>> fptype.get_type()
'RDKit-Fingerprint/2 minPath=1 maxPath=7 fpSize=1024 nBitsPerHash=2 useHs=1'
```

The function will raise an exception for unknown arguments.

Parameters fingerprint\_kwargs (a dictionary where the values are Python objects) - the fingerprint parameters

Returns an object implementing the chemfp.types.FingerprintType API

# from\_text\_settings(settings=None)

Create a fingerprint type; settings is a dictionary with string-encoded value that can override the defaults

The dictionary values are string-encoded values, not native Python values. This function exists to help handle command-line arguments and setting files.:

```
>>> import chemfp
>>> family = chemfp.get_fingerprint_family("RDKit-Fingerprint")
>>> fptype = family.from_text_settings()
>>> fptype.get_type()
'RDKit-Fingerprint/2 minPath=1 maxPath=7 fpSize=2048 nBitsPerHash=2 useHs=1'
>>> fptype = family.from_text_settings({"fpSize": "1024"})
>>> fptype.get_type()
'RDKit-Fingerprint/2 minPath=1 maxPath=7 fpSize=1024 nBitsPerHash=2 useHs=1'
```

The function will raise an exception for unknown arguments.

Parameters settings (a dictionary where the values are string-encoded) - the fingerprint text settings

Returns an object implementing the chemfp. types. FingerprintType API

## get\_kwargs\_from\_text\_settings(settings=None)

Convert a dictionary of string-encoded fingerprint parameters into native Python values

String-encoded values ("text settings") can come from the command-line, a configuration file, a web reqest, or other text sources. The fingerprint types need actual Python values. This method converts the first to the second:

```
>>> import chemfp
>>> family = chemfp.get_fingerprint_family("RDKit-Fingerprint")
>>> family.get_kwargs_from_text_settings()
{'maxPath': 7, 'fpSize': 2048, 'nBitsPerHash': 2, 'minPath': 1, 'useHs': 1}
>>> family.get_kwargs_from_text_settings({"fpSize": "128", "maxPath": "5"})
{'maxPath': 5, 'fpSize': 128, 'nBitsPerHash': 2, 'minPath': 1, 'useHs': 1}
```

Parameters settings (a dictionary where the values are string-encoded) - the fingerprint text settings

Returns an dictionary of (decoded) fingerprint parameters

#### get\_defaults()

Return the default parameters as a dictionary

The dictionary values are native Python objects:

```
>>> import chemfp
>>> family = chemfp.get_fingerprint_family("RDKit-Fingerprint")
>>> family.get_defaults()
{'maxPath': 7, 'fpSize': 2048, 'nBitsPerHash': 2, 'minPath': 1, 'useHs': 1}
```

**Returns** an dictionary of fingerprint parameters

# 8.2.2 FingerprintType

## class chemfp.types.FingerprintType

The base to all fingerprint types

A fingerprint type has the following public attributes:

#### name

the fingerprint name, including the version

#### base name

the fingerprint name, without the version

#### version

the fingerprint version

# toolkit

the toolkit API for the underlying chemistry toolkit, or None

#### software

a string which characterizes the toolkit, including version information

#### num\_bits

the number of bits in this fingerprint type

## fingerprint\_kwargs

a dictionary of the fingerprint arguments

The built-in fingerprint types are:

- chemfp.openbabel\_types.OpenBabelFP2FingerprintType\_v1 OpenBabel-FP2/1 OpenBabel FP2
- chemfp.openbabel\_types.OpenBabelFP3FingerprintType\_v1 OpenBabel-FP3/1 OpenBabel FP3
- chemfp.openbabel\_types.OpenBabelFP4FingerprintType\_v1 OpenBabel-FP4/1 OpenBabel FP4
- chemfp.openbabel\_types.OpenBabelMACCSFingerprintType\_v1 OpenBabel-MACCS/
   1 Open Babel 166 MACCS keys
- chemfp.openbabel\_types.OpenBabelMACCSFingerprintType\_v2-OpenBabel-MACCS/
  2-OpenBabel 166 MACCS keys
- chemfp.openbabel\_patterns.SubstructOpenBabelFingerprinter\_v1 ChemfP-Substruct-OpenBabel/1 chemfp's 881 CACTVS/PubChem-like keys implemented with Open Babel

- chemfp.openbabel\_patterns.RDMACCSOpenBabelFingerprinter\_v1 RDMACCS-OpenBabel/1 chemfp's own 166 MACCS keys implemented with Open Babel (does not include key 44)
- chemfp.openbabel\_patterns.RDMACCSOpenBabelFingerprinter\_v2 RDMACCS-OpenBabel/1 chemfp's own 166 MACCS keys implemented with Open Babel
- chemfp.openeye\_types.OpenEyeCircularFingerprintType\_v2-OpenEye-Circular/
  2-OEGraphSim circular fingerprints
- chemfp.openeye\_types.OpenEyeMACCSFingerprintType\_v2 OpenEye-MACCS166/2 OEGraphSim 166 MACCS keys
- chemfp.openeye\_types.OpenEyePathFingerprintType\_v2 OpenEye-Path/2 OE-GraphSim path fingerprints
- chemfp.openeye\_types.OpenEyeTreeFingerprintType\_v2 OpenEye-Tree/2 OE-GraphSim tree fingerprints
- chemfp.openeye\_patterns.SubstructOpenEyeFingerprinter\_v1 ChemfP-Substruct-OpenEye/1 chemfp's 881 CACTVS/PubChem-like keys implemented with OEChem
- chemfp.openeye\_patterns.RDMACCSOpenEyeFingerprinter\_v1 RDMACCS-OpenEye/1 chemfp's own 166 MACCS keys implemented with OEChem (does not include key 44)
- chemfp.openeye\_patterns.RDMACCSOpenEyeFingerprinter\_v2-RDMACCS-OpenEye/2
   chemfp's own 166 MACCS kevs implemented with OEChem
- $chemfp.rdkit\_types.RDKitFingerprintType\_v1$  RDKit-Fingerprint/1 RDKit path and tree fingerprint
- $chemfp.rdkit\_types.RDKitFingerprintType\_v2$  RDKit-Fingerprint/2 RDKit path and tree fingerprint
- chemfp.rdkit\_types.RDKitMACCSFingerprintType\_v1 RDKit-MACCS/1 RDKit 166 MACCS keys (does not include key 44)
- chemfp.rdkit\_types.RDKitMACCSFingerprintType\_v2 RDKit-MACCS/2 RDKit 166 MACCS keys
- chemfp.rdkit\_types.RDKitMorganFingerprintType\_v1 RDKit-Morgan/1 RDKit circular fingerprints
- chemfp.rdkit\_types.RDKitAtomPairFingerprint\_v1 RDKit-AtomPair/1 RDKit atom pair fingerprints
- chemfp.rdkit\_types.RDKitAtomPairFingerprint\_v2 RDKit-AtomPair/2 RDKit atom pair fingerprints
- $chemfp.rdkit\_types.RDKitTorsionFingerprintType\_v1$  RDKit-Torsion/1 RDKit torsion fingerprints
- $chemfp.rdkit\_types.RDKitTorsionFingerprintType\_v2$  RDKit-Torsion/2 RDKit torsion fingerprints
- chemfp.rdkit\_types.RDKitTorsionFingerprintType\_v3 RDKit-Torsion/3 RDKit torsion fingerprints
- chemfp.rdkit\_patterns.SubstructRDKitFingerprintType\_v1 ChemfP-Substruct-RDKit/1 chemfp's 881 CACTVS/PubChem-like keys implemented with RDKit

- chemfp.rdkit\_patterns.RDMACCSRDKitFingerprinter\_v1 RDMACCS-RDKit/1 chemfp's own 166 MACCS keys implemented with OEChem (does not include key 44)
- chemfp.rdkit\_patterns.RDMACCSRDKitFingerprinter\_v2 RDMACCS-RDKit/2 chemfp's own 166 MACCS keys implemented with OEChem

#### get\_type()

Get the full type string (name and parameters) for this fingerprint type

**Returns** a canonical fingerprint type string, including its parameters

#### get\_metadata(sources=None)

Return a Metadata appropriate for the given fingerprint type.

This is most commonly used to make a *chemfp.Metadata* that can be passed into a *chemfp. FingerprintWriter*.

If *sources* is a string or a list of strings then it will passed to the newly created Metadata instance. It should contain filenames or other description of the fingerprint sources.

Parameters sources (None, a string, or list of strings) - fingerprint source filenames or other description

Returns a chemfp. Metadata

# make\_fingerprinter()

Make a 'fingerprinter'; a callable which takes a molecule and returns a fingerprint

Returns a function object which takes a molecule and return a fingerprint

read\_molecule\_fingerprints(source, format=None, id\_tag=None, reader\_args=None, errors="strict", location=None)

Read fingerprints from a structure source as a FingerprintIterator

Iterate through the *format* structure records in *source*. If *format* is None then auto-detect the format based on the *source*. Use the fingerprint type to compute the fingerprint. For SD files, use  $id\_tag$  to get the record id from the given SD tag instead of the title line.

The *reader\_args* dictionary parameters depend on the toolkit and format. For details see the docstring for self.toolkit.read\_molecules.

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and goes to the next record, and "ignore" goes to the next record.

The location parameter takes a Location instance. If None then a default Location will be created.

#### Parameters

- source (a filename, file object, or None to read from stdin) the structure source
- format (a format name string, or Format object, or None to auto-detect) the input structure format
- $id\_tag$  (string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader parameters passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a Location object, or None) object used to track parser state information

Returns a chemfp.FingerprintIterator which iterates over the (id, fingerprint) pair

Read fingerprints from structure records in a string, as a FingerprintIterator

Iterate through the *format* structure records in *content*. Use the fingerprint type to compute the fingerprint. For SD files, use  $id\_tag$  to get the record id from the given SD tag instead of the title line.

The reader\_args dictionary parameters depend on the toolkit and format. For details see the docstring for self.toolkit.read\_molecules.

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and goes to the next record, and "ignore" goes to the next record.

The location parameter takes a Location instance. If None then a default Location will be created.

#### **Parameters**

- content the string containing structure records
- format (a format name string, or Format object) the input structure format
- id\_tag (string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader parameters passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a Location object, or None) object used to track parser state information

Returns a chemfp.FingerprintIterator which iterates over the (id, fingerprint) pair parse\_molecule\_fingerprint(content, format, reader\_args=None, errors="strict")

Parse the first molecule record of the content then compute and return the fingerprint

Read the first molecule from *content*, which contains records in the given *format*. Compute and return its fingerprint.

The reader\_args dictionary parameters depend on the toolkit and format. For details see the docstring for self.toolkit.read\_molecules.

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and return None for the fingerprint, and "ignore" returns None for the fingerprint without any extra message.

#### **Parameters**

- content the string containing at least one structure record
- format (a format name string, or Format object) the input structure format
- $\bullet \ \ \textbf{reader\_args} \ (\textit{a} \ \textit{dictionary}) \text{reader parameters passed to the underlying toolkit}$
- errors (one of "strict", "report", or "ignore") specify how to handle errors

**Returns** the fingerprint as a byte string

 $\label{lem:parse_id_and_molecule_fingerprint} \begin{subarray}{ll} content, format, id\_tag=None, reader\_args=None, errors="strict") \end{subarray}$ 

Parse the first molecule record of the content then compute and return the id and fingerprint

Read the first molecule from *content*, which contains records in the given *format*. Compute its fingerprint and get the molecule id. For an SD record use *id\_tag* to get the record id from the given SD tag instead of from the title line.

Return the id and fingerprint as the (id, fingerprint) pair.

The *reader\_args* dictionary parameters depend on the toolkit and format. For details see the docstring for self.toolkit.read\_molecules.

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and return None for values it cannot compute, and "ignore" is like "report" but without the error message. For "report" and "ignore", if the molecule cannot be parsed then the result will be (None, None). If the fingerprint cannot be computed then the result will be (id, None).

#### **Parameters**

- content the string containing at least one structure record
- format (a format name string, or Format object) the input structure format
- id\_tag (string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader parameters passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

**Returns** a pair of (id string, fingerprint byte string)

 $\label{local_make_id_and_molecule_fingerprint_parser} \begin{subarray}{ll} make\_id\_and\_molecule\_fingerprint\_parser(format, id\_tag=None, reader\_args=None, errors="strict") \end{subarray}$ 

Make a function which parses molecule from a record and returns the id and computed fingerprint

This is a very specialized function, designed for performance, but it doesn't appear to give any advantage. You likely don't need it.

Return a function which parses a content string containing structure records in the given format to get a molecule. Use the molecule to compute the fingerprint and get its id. For an SD record use  $id\_tag$  to get the record id from the given SD tag instead of from the title line.

The new function will return the (id, fingerprint) pair.

The reader\_args dictionary parameters depend on the toolkit and format. For details see the docstring for self.toolkit.read\_molecules.

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and return None for values it cannot compute, and "ignore" is like "report" but without the error message. For "report" and "ignore", if the molecule cannot be parsed then the result will be (None, None). If the fingerprint cannot be computed then the result will be (id, None).

## Parameters

• format (a format name string, or Format object) - the input structure format

- id\_tag (string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader parameters passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns a function which takes a content string and returns an (id, fingerprint) pair

# $compute\_fingerprint(mol)$

Compute and return the fingerprint byte string for the toolkit molecule

Parameters mol - a toolkit molecule

**Returns** the fingerprint as a byte string

#### compute\_fingerprints(mols)

Compute and return the fingerprint for each toolkit molecule in an iterator

This function is a slightly optimized version of:

```
for mol in mols:
    yield self.compute_fingerprint(mol)
```

Parameters mols - an iterable of toolkit molecules

Returns a generator of fingerprints, one per molecule

```
get_fingerprint_family()
```

Return the fingerprint family for this fingerprint type

Returns a FingerprintFamily

# 8.2.3 Open Babel fingerprints

Open Babel implements four fingerprints families and chemfp implements two fingerprint families using the Open Babel toolkit. These are:

- OpenBabel-FP2 Indexes linear fragments up to 7 atoms.
- Open Babel-FP3 - SMARTS patterns specified in the file patterns. txt  $\,$
- OpenBabel-FP4 SMARTS patterns specified in the file SMARTS InteLigand.txt
- OpenBabel-MACCS SMARTS patterns specified in the file MACCS.txt, which implements nearly all
  of the 166 MACCS keys
- RDMACCS-OpenBabel a chemfp implementation of nearly all of the MACCS keys
- $\bullet \ \ ChemFP\text{-}Substruct\text{-}OpenBabel an experimental chemfp implementation of the PubChem keys}$

Most people use FP2 and MACCS.

Note: chemfp-2.0 implements both RDMACCS-OpenBabel/1 and RDMACCS-OpenBabel/2. Version 1 did not have a definition for key 44.

# OpenBabelFP2FingerprintType\_v1

# class chemfp.openbabel\_types.OpenBabelFP2FingerprintType\_v1

OpenBabel FP2 fingerprint based on path enumeration

See http://openbabel.org/wiki/FP2

This is a Daylight-like path enumeration fingerprint with 1021 bits.

The OpenBabel-FP2/1 FingerprintType has no parameters.

# OpenBabelFP3FingerprintType\_v1

# class chemfp.openbabel\_types.OpenBabelFP3FingerprintType\_v1

OpenBabel FP3 fingerprint

See http://openbabel.org/wiki/FP3

55 bit fingerprints based on a set of SMARTS patterns defining functional groups.

The OpenBabel-FP3/1 FingerprintType has no parameters.

# OpenBabelFP4FingerprintType\_v1

# class chemfp.openbabel\_types.OpenBabelFP4FingerprintType\_v1

OpenBabel FP4 fingerprint

http://openbabel.org/wiki/FP4

307 bit fingerprints based on a set of SMARTS patterns defining functional groups.

The OpenBabel-FP4/1 FingerprintType has no parameters.

# OpenBabelMACCSFingerprintType\_v1

# class chemfp.openbabel\_types.OpenBabelMACCSFingerprintType\_v1

Open Babel's implementation of the 166 MACCS keys

WARNING: This implementation contains serious bugs! All of the ring sizes are wrong.

See  $http://openbabel.org/wiki/Tutorial: Fingerprints \ and \ https://github.com/openbabel/openbabel/blob/master/data/MACCS.txt \ .$ 

The OpenBabel-MACCS/1 FingerprintType has no parameters.

Note: this version is only available in older (pre-2012) versions of Open Babel.

#### OpenBabelMACCSFingerprintType\_v2

# class chemfp.openbabel\_types.OpenBabelMACCSFingerprintType\_v2

Open Babel's implementation of the 166 MACCS keys

See  $http://openbabel.org/wiki/Tutorial:Fingerprints \ and \ https://github.com/openbabel/openbabel/blob/master/data/MACCS.txt \ .$ 

Note: Open Babel added support for key 44 on 20 October 2014. This should have been version 3. However, I didn't notice until 1 May 2017 that there was no chemfp test for it. Since everyone has been using it as v2, and very few people used the older version, I won't change the version number.

The OpenBabel-MACCS/2 FingerprintType has no parameters.

# OpenBabelECFP0FingerprintType\_v1

# $\verb|class|| chemfp.openbabel_types.OpenBabelECFPOFingerprintType\_v1|$

Open Babel's implementation of the ECFP0 fingerprint

This is a circular fingerprint of diameter 0.

The OpenBabel-ECFP0/1 FingerprintType parameter is:

• nBits - the number of bits in the fingerprint (default: 4096 and must be a power of 2)

# $OpenBabelECFP2FingerprintType\_v1$

## class chemfp.openbabel\_types.OpenBabelECFP2FingerprintType\_v1

Open Babel's implementation of the ECFP2 fingerprint

This is a circular fingerprint of diameter 2.

The OpenBabel-ECFP2/1 FingerprintType parameter is:

• nBits - the number of bits in the fingerprint (default: 4096 and must be a power of 2)

## OpenBabelECFP4FingerprintType\_v1

# $\verb|class|| chemfp.openbabel_types.OpenBabelECFP4FingerprintType_v1|$

Open Babel's implementation of the ECFP4 fingerprint

This is a circular fingerprint of diameter 4.

The OpenBabel-ECFP4/1 FingerprintType parameter is:

• nBits - the number of bits in the fingerprint (default: 4096 and must be a power of 2)

## OpenBabelECFP6FingerprintType\_v1

#### class chemfp.openbabel\_types.OpenBabelECFP6FingerprintType\_v1

Open Babel's implementation of the ECFP6 fingerprint

This is a circular fingerprint of diameter 6.

The OpenBabel-ECFP6/1 FingerprintType parameter is:

• nBits - the number of bits in the fingerprint (default: 4096 and must be a power of 2)

# OpenBabelECFP8FingerprintType\_v1

#### class chemfp.openbabel types.OpenBabelECFP8FingerprintType v1

Open Babel's implementation of the ECFP8 fingerprint

This is a circular fingerprint of diameter 8.

The OpenBabel-ECFP8/1 FingerprintType parameter is:

• nBits - the number of bits in the fingerprint (default: 4096 and must be a power of 2)

# OpenBabelECFP10FingerprintType\_v1

# class chemfp.openbabel\_types.OpenBabelECFP10FingerprintType\_v1

Open Babel's implementation of the ECFP10 fingerprint

This is a circular fingerprint of diameter 10.

The OpenBabel-ECFP10/1 FingerprintType parameter is:

• nBits - the number of bits in the fingerprint (default: 4096 and must be a power of 2)

# SubstructOpenBabelFingerprinter\_v1

# $\verb|class| chemfp.openbabel_patterns.SubstructOpenBabelFingerprinter_v1|$

chemfp's Substruct fingerprint implementation for Open Babel, version 1

WARNING: these fingerprints have not been validated.

The Substruct fingerprints are CACTVS/PubChem-like fingerprints designed for use across multiple toolkits.

The ChemFP-Substruct-OpenBabel/1 FingerprintType has no parameters.

## RDMACCSOpenBabelFingerprinter\_v1

## class chemfp.openbabel\_patterns.RDMACCSOpenBabelFingerprinter\_v1

chemfp's RDMACCS fingerprint implementation for Open Babel, version 1

The RDMACSS keys are MACCS-166-like fingerprints based on RDKit's MACCS116 definition, but designed to be (slightly) more portable across multiple chemistry toolkits.

This version does not define key 44.

The RDMACSS-OpenBabel/1 FingerprintType has no parameters.

## RDMACCSOpenBabelFingerprinter\_v2

#### class chemfp.openbabel\_patterns.RDMACCSOpenBabelFingerprinter\_v2

chemfp's RDMACCS fingerprint implementation for Open Babel, version 2

The RDMACSS keys are MACCS-166-like fingerprints based on RDKit's MACCS116 definition, but designed to be (slightly) more portable across multiple chemistry toolkits.

This version defines key 44.

The RDMACSS-OpenBabel/2 FingerprintType has no parameters.

# 8.2.4 OpenEye fingerprints

OpenEye's OEGraphSim library implements four bitstring-based fingerprint families, and chemfp implements two fingerprint families based on OEChem. These are:

- OpenEye-Path exhaustive enumeration of all linear fragments up to a given size
- OpenEye-Circular exhaustive enumeration of all circular fragments grown radially from each heavy atom up to a given radius
- OpenEye-Tree exhaustive enumeration of all trees up to a given size

- OpenEye-MACCS166 an implementation of the 166 MACCS keys
- RDMACCS-OpenEye a chemfp implementation of the 166 MACCS keys
- ChemFP-Substruct-OpenEye an experimental chemfp implementation of the PubChem keys

Note: chemfp-2.0 implements both RDMACCS-OpenEye/1 and RDMACCS-OpenEye/2. Version 1 did not have a definition for key 44.

# OpenEyeCircularFingerprintType\_v2

## class chemfp.openeye\_types.OpenEyeCircularFingerprintType\_v2

OEGraphSim fingerprint based on circular fingerprints around heavy atoms, version 2

See https://docs.eyesopen.com/toolkits/cpp/graphsimtk/fingerprint.html#section-fingerprint-circular

The OpenEye-Circular/2 FingerprintType parameters are:

- numbits the number of bits in the fingerprint (default: 4096)
- minradius the minimum radius (default: 0)
- maxradius the maximum radius (default: 5)
- atype the atom type (default: "Default")
- btype the bond type (default: "Default")

The atype is either 0 or a '|' separated string containing one or more of the following: Aromaticity, AtomicNumber, Chiral, EqHBondAcceptor, EqHBondDonor, EqHalogen, FormalCharge, HCount, HvyDegree, Hybridization, InRing, EqAromatic,

The btype is either 0 or a '|' separated string containing one or more of the following: BondOrder, Chiral, InRing.

## OpenEyeMACCSFingerprintType v2

# class chemfp.openeye\_types.OpenEyeMACCSFingerprintType\_v2

OEGraphSim implementation of the 166 MACCS keys, version 2

See https://docs.eyesopen.com/toolkits/cpp/graphsimtk/fingerprint.html#maccs.

The OpenEye-MACCS166/2 FingerprintType has no parameters.

This corresponds to GraphSim version '2.0.0'.

#### OpenEyeMACCSFingerprintType\_v3

## class chemfp.openeye\_types.OpenEyeMACCSFingerprintType\_v3

OEGraphSim implementation of the 166 MACCS keys, version 3

See https://docs.eyesopen.com/toolkits/cpp/graphsimtk/fingerprint.html#maccs.

The OpenEye-MACCS166/3 FingerprintType has no parameters.

This corresponds to GraphSim version '2.2.0', with fixes for bits 91 and 92.

# OpenEyePathFingerprintType\_v2

# class chemfp.openeye\_types.OpenEyePathFingerprintType\_v2

OEGraphSim fingerprint based on path-based enumeration, version 2

See https://docs.eyesopen.com/toolkits/cpp/graphsimtk/fingerprint.html#section-fingerprint-path

The OpenEye-Path/2 FingerprintType parameters are:

- numbits the number of bits in the fingerprint (default: 4096)
- minbonds the minimum number of bonds (default: 0)
- maxbonds the maximum number of bonds (default: 5)
- atype the atom type (default: "Default")
- btype the bond type (default: "Default")

The atype is either 0 or a '|' separated string containing one or more of the following: Aromaticity, AtomicNumber, Chiral, EqHBondAcceptor, EqHBondDonor, EqHalogen, FormalCharge, HCount, HvyDegree, Hybridization, InRing, EqAromatic,

The btype is either 0 or a '|' separated string containing one or more of the following: BondOrder, Chiral, InRing.

# OpenEyeTreeFingerprintType\_v2

# class chemfp.openeye\_types.OpenEyeTreeFingerprintType\_v2

OEGraphSim fingerprint based on tree fingerprints, version 2

See https://docs.eyesopen.com/toolkits/cpp/graphsimtk/fingerprint.html#section-fingerprint-tree

The OpenEye-Tree/2 FingerprintType parameters are:

- numbits the number of bits in the fingerprint (default: 4096)
- minbonds minimum number of bonds in the tree
- maxbonds maximum number of bonds in the tree
- atype the atom type (default: "Default")
- btype the bond type (default: "Default")

The atype is either 0 or a '|' separated string containing one or more of the following: Aromaticity, AtomicNumber, Chiral, EqHBondAcceptor, EqHBondDonor, EqHalogen, FormalCharge, HCount, HvyDegree, Hybridization, InRing, EqAromatic,

The btype is either 0 or a '|' separated string containing one or more of the following: BondOrder, Chiral, InRing.

#### OpenEyeMoleculeScreenFingerprintType\_v1

## class chemfp.openeye\_types.OpenEyeMoleculeScreenFingerprintType\_v1

OEChem molecule screen using OESubSearchScreenType::Molecule

See http://https://docs.eyesopen.com/toolkits/cpp/oechemtk/OEChemClasses/OESubSearchScreen.html This OpenEyeMoleculeScreenFingerprintType\_v1 FingerprintType takes no parameters. Calling the fingerprinter with a QMol returns the query screen, calling with an OEMol returns a target screen.

## OpenEyeSMARTSScreenFingerprintType\_v1

# class chemfp.openeye\_types.OpenEyeSMARTSScreenFingerprintType\_v1 OEChem SMARTS screen using OESubSearchScreenType::SMARTS

See http://https://docs.eyesopen.com/toolkits/cpp/oechemtk/OEChemClasses/OESubSearchScreen.html This OpenEyeSMARTSScreenFingerprintType\_v1 FingerprintType takes no parameters. Calling the fingerprinter with a QMol returns the query screen, calling with an OEMol returns a target screen.

# OpenEyeMDLScreenFingerprintType\_v1

# $\verb|class|| chemfp.openeye_types.OpenEyeMDLScreenFingerprintType_v1|$

OEChem MDL screen using OESubSearchScreenType::MDL

See http://https://docs.eyesopen.com/toolkits/cpp/oechemtk/OEChemClasses/OESubSearchScreen.html This OpenEyeMDLScreenFingerprintType\_v1 FingerprintType takes no parameters. Calling the fingerprinter with a QMol returns the query screen, calling with an OEMol returns a target screen.

# SubstructOpenEyeFingerprinter\_v1

# $\verb|class| chemfp.openeye_patterns.SubstructOpenEyeFingerprinter_v1|\\$

chemfp's Substruct fingerprint implementation for OEChem, version 1

WARNING: these fingerprints have not been validated.

The Substruct fingerprints are CACTVS/PubChem-like fingerprints designed for use across multiple toolkits.

The ChemFP-Substruct-OpenEye/1 FingerprintType has no parameters.

# RDMACCSOpenEyeFingerprinter\_v1

# class chemfp.openeye\_patterns.RDMACCSOpenEyeFingerprinter\_v1

chemfp's RDMACCS fingerprint implementation for OEChem, version 1

The RDMACSS keys are MACCS-166-like fingerprints based on RDKit's MACCS116 definition, but designed to be (slightly) more portable across multiple chemistry toolkits.

This version does not define key 44.

The RDMACSS-OpenEye/1 FingerprintType has no parameters.

## RDMACCSOpenEyeFingerprinter\_v2

#### class chemfp.openeye\_patterns.RDMACCSOpenEyeFingerprinter\_v2

chemfp's RDMACCS fingerprint implementation for OEChem, version 2

The RDMACSS keys are MACCS-166-like fingerprints based on RDKit's MACCS116 definition, but designed to be (slightly) more portable across multiple chemistry toolkits.

This version defines key 44.

The RDMACSS-OpenEye/2 FingerprintType has no parameters.

# 8.2.5 RDKit fingerprints

RDKit implements six fingerprint families, and chemfp implements two fingerprint families based on RDKit. These are:

- RDKit-Fingerprint exhaustive enumeration of linear and branched trees
- RDKit-MACCS166 The RDKit implementation of the MACCS keys
- RDKit-Morgan EFCP-like circular fingerprints
- RDKit-AtomPair atom pair fingerprints
- RDKit-Torsion topological-torsion fingerprints
- RDKit-Pattern substructure screen fingerprint
- RDMACCS-RDKit a chemfp implementation of the 166 MACCS keys
- ChemFP-Substruct-RDKit an experimental chemfp implementation of the PubChem keys

Note: chemfp-2.0 implements both RDMACCS-RDKit/1 and RDMACCS-RDKit/2. Version 1 did not have a definition for key 44.

# RDKitFingerprintType\_v1

# class chemfp.rdkit\_types.RDKitFingerprintType\_v1

RDKit's Daylight-like fingerprint based on linear path and branched tree enumeration, version 1

See http://www.rdkit.org/Python Docs/rdkit.Chem.rdmolops-module.html#RDKFingerprint

The RDKit-Fingerprint/1 FingerprintType parameters are:

- fpSize number of bits in the fingerprint (default: 2048)
- minPath minimum number of bonds (default: 1)
- maxPath maximum number of bonds (default: 7)
- nBitsPerHash number of bits to set for each path hash (default: 2)
- useHs include information about the number of hydrogens on each atom? (default: True)

Note: this version is only available in older (pre-2014) versions of RDKit

## RDKitFingerprintType\_v2

## class chemfp.rdkit\_types.RDKitFingerprintType\_v2

RDKit's Daylight-like fingerprint based on linear path and branched tree enumeration, version 2

See http://www.rdkit.org/Python Docs/rdkit.Chem.rdmolops-module.html#RDKFingerprint

The RDKit-Fingerprint/2 FingerprintType parameters are:

- fpSize number of bits in the fingerprint (default: 2048)
- minPath minimum number of bonds (default: 1)
- maxPath maximum number of bonds (default: 7)
- nBitsPerHash number of bits to set for each path hash (default: 2)
- useHs include information about the number of hydrogens on each atom? (default: True)
- branchedPaths include both branched and unbranched paths (default: True)

- useBondOrder use both bond orders in the path hashes (default: True)
- from Atoms a comma-separated list of atom indices which must be part of the path enumeration

# RDKitMACCSFingerprintType\_v1

## class chemfp.rdkit\_types.RDKitMACCSFingerprintType\_v1

RDKit's implementation of the 166 MACCS keys, version 1

 $\label{lem:condition} \textbf{See} \qquad \qquad \text{http://rdkit.org/Python\_Docs/rdkit.Chem.rdMolDescriptors-module.html} \\ \text{GetMACCSKeysFingerprint}$ 

The RDKit-MACCS166/1 fingerprints have no parameters.

This version of RDKit does not support MACCS key 44 ("OTHER").

# RDKitMACCSFingerprintType\_v2

## class chemfp.rdkit types.RDKitMACCSFingerprintType v2

RDKit's implementation of the 166 MACCS keys, version 2

 $\label{lem:condition} \textbf{See} \qquad \qquad \text{http://rdkit.org/Python\_Docs/rdkit.Chem.rdMolDescriptors-module.html} \\ \# \textbf{GetMACCSKeysFingerprint}$ 

The RDKit-MACCS166/2 fingerprints have no parameters. RDKit version added this version in late 2014.

## RDKitMorganFingerprintType\_v1

#### class chemfp.rdkit\_types.RDKitMorganFingerprintType\_v1

RDKit Morgan (ECFP-like) fingerprints, version 1

 $\label{lem:condition} \textbf{See} \qquad \qquad \text{http://rdkit.org/Python\_Docs/rdkit.Chem.rdMolDescriptors-module.html} \\ \textbf{GetMorganFingerprintAsBitVect}$ 

The RDKit-Morgan/1 FingerprintType parameters are:

- fpSize number of bits in the fingerprint (default: 2048)
- radius radius for the Morgan algorithm (default: 2)
- useFeatures use chemical-feature invariants (default: 0)
- useChirality use chirality information (default: 0)
- useBondTypes include bond type information (default: 1)
- includeRedundantEnvironments if set, the check for redundant atom environments will not be done (added in RDKit 2020-3) (default: 0)
- from Atoms a comma-separated list of atom indices to use as centers

## RDKitAtomPairFingerprint\_v1

## class chemfp.rdkit\_types.RDKitAtomPairFingerprint\_v1

RDKit atom pair fingerprints, version 1"

 $\label{lem:condition} \textbf{See} & \text{http://rdkit.org/Python\_Docs/rdkit.Chem.rdMolDescriptors-module.html} \# \textbf{GetHashedAtomPairFingerprintAsBitVect}$ 

The RDKit-AtomPair/1 FingerprintType parameters are:

- fpSize number of bits in the fingerprint (default: 2048)
- minLength minimum bond count for a pair (default: 1)
- maxLength maximum bond count for a pair (default: 30)

Note: this version is only available in older (pre-2012) versions of RDKit

## RDKitAtomPairFingerprint\_v2

# class chemfp.rdkit\_types.RDKitAtomPairFingerprint\_v2

RDKit atom pair fingerprints, version 2"

 $\label{lem:condition} \textbf{See} & \text{http://rdkit.org/Python\_Docs/rdkit.Chem.rdMolDescriptors-module.html} \# GetHashedAtomPairFingerprintAsBitVect$ 

The RDKit-AtomPair/2 FingerprintType parameters are:

- fpSize number of bits in the fingerprint (default: 2048)
- minLength minimum bond count for a pair (default: 1 bond)
- maxLength maximum bond count for a pair (default: 30, max: 63)
- nBitsPerEntry number of bits to use in simulating counts (default: 4)
- include Chirality if set, chirality will be used in the atom invariants (default: 0)
- use2D if 1, use a 2D distance matrix, if 0 use the 3D matrix from the first set of conformers, or return an empty fingerprint if no conformers (default: 1)
- from Atoms a comma-separated list of atom indices which must be in the pair

## RDKitTorsionFingerprintType\_v1

## class chemfp.rdkit\_types.RDKitTorsionFingerprintType\_v1

RDKit torsion fingerprints, version 1

See http://www.rdkit.org/Python\_Docs/rdkit.Chem.AtomPairs.Torsions-module.html

An implementation of Topological-torsion fingerprints, as described in: R. Nilakantan, N. Bauman, J. S. Dixon, R. Venkataraghavan; "Topological Torsion: A New Molecular Descriptor for SAR Applications. Comparison with Other Descriptors" JCICS 27, 82-85 (1987).

The RDKit-Torsion/1 FingerprintType parameters are:

- fpSize number of bits in the fingerprint (default: 2048)
- targetSize number of bonds per torsion (default: 4)

Note: this version is only available in older (pre-2014) versions of RDKit

## RDKitTorsionFingerprintType\_v2

# ${\tt class\ chemfp.rdkit\_types.RDKitTorsionFingerprintType\_v2}$

RDKit torsion fingerprints, version 2

See http://www.rdkit.org/Python Docs/rdkit.Chem.AtomPairs.Torsions-module.html

An implementation of Topological-torsion fingerprints, as described in: R. Nilakantan, N. Bauman, J. S. Dixon, R. Venkataraghavan; "Topological Torsion: A New Molecular Descriptor for SAR Applications. Comparison with Other Descriptors" JCICS 27, 82-85 (1987).

The RDKit-Torsion/2 FingerprintType parameters are:

- fpSize number of bits in the fingerprint (default: 2048)
- targetSize number of bonds per torsion (default: 4)
- nBitsPerEntry number of bits to set per entry (default: 4)
- include Chirality include chirality information (default: 0)
- from Atoms a comma-separated list of atom indices which must be part of the torsion

# RDKitPatternFingerprint\_v1

## class chemfp.rdkit\_types.RDKitPatternFingerprint\_v1

RDKit's experimental substructure screen fingerprint, version 1

 $\textbf{See } \ \text{http://www.rdkit.org/Python\_Docs/rdkit.Chem.rdmolops-module.html} \# Pattern Fingerprint + \text{Community} + \text{Commu$ 

The RDKit-Pattern/1 fingerprint has no parameters.

# RDKitPatternFingerprint\_v2

# class chemfp.rdkit\_types.RDKitPatternFingerprint\_v2

RDKit's experimental substructure screen fingerprint, version 2

 $See \ http://www.rdkit.org/Python\_Docs/rdkit.Chem.rdmolops-module.html \#PatternFingerprint + the property of the property of$ 

The RDKit-Pattern/2 fingerprint has no parameters.

# RDKitPatternFingerprint\_v3

#### class chemfp.rdkit types.RDKitPatternFingerprint v3

RDKit's experimental substructure screen fingerprint, version 3

See http://www.rdkit.org/Python Docs/rdkit.Chem.rdmolops-module.html#PatternFingerprint

The RDKit-Pattern/3 fingerprint has no parameters. This version was released 2017.03.1.

## RDKitSECFPFingerprintType\_v1

# 

The SMILES Extended Connectivity Fingerprint, as described in: Probst, D., Reymond, J. A probabilistic molecular fingerprint for big data settings. J Cheminform 10, 66 (2018). https://doi.org/10.1186/s13321-018-0321-8 https://jcheminf.biomedcentral.com/articles/10.1186/s13321-018-0321-8

These are circular fingerprints which encode the circular region as a fragment SMILES, which is then hashed to produce the fingerprint bits.

The RDKit-SECFP/1 FingerprintType parameters are:

• fpSize - number of bits in the fingerprint (default: 2048)

- radius analogous to the radius for the Morgan algorithm (default: 3)
- rings include ring membership (default: 1)
- isomeric use isomeric SMILES (default: 0)
- kekulize Kekulize the molecule and use Kekule SMILES (default: 1)
- min radius minimum radius for the Morgan algorithm (default: 1)

## RDKitAvalonFingerprintType\_v1

# 

The Avalon Cheminformatics toolkit is available from https://sourceforge.net/projects/avalontoolkit/. It is not part of the core RDKit distribution. Instead, RDKit has a compile-time option to download and include it as part of the build process.

The Avalon fingerprint are described in the supplemental information for "QSAR - How Good Is It in Practice? Comparison of Descriptor Sets on an Unbiased Cross Section of Corporate Data Sets", Peter Gedeck, Bernhard Rohde, and Christian Bartels, J. Chem. Inf. Model., 2006, 46 (5), pp 1924-1936, DOI: 10.1021/ci050413p. The supplemental information is available from http://pubs.acs.org/doi/suppl/10.1021/ci050413p

It uses a set of feature classes which "have been fine-tuned to provide good screen-out for the set of substructure queries encounted at Novartis while limiting redundancy." The classes are ATOM\_COUNT, ATOM\_SYMBOL\_PATH, AUGMENTED\_ATOM, AUGMENTED\_BOND, HCOUNT\_PAIR, HCOUNT\_PATH, RING\_PATH, BOND\_PATH, HCOUNT\_CLASS\_PATH, ATOM\_CLASS\_PATH, RING\_PATTERN, RING\_SIZE\_COUNTS, DEGREE\_PATHS, CLASS\_SPIDERS, FEATURE\_PAIRS and ALL\_PATTERNS.

## SubstructRDKitFingerprintType\_v1

# class chemfp.rdkit\_patterns.SubstructRDKitFingerprintType\_v1

chemfp's Substruct fingerprint implementation for RDKit, version 1

WARNING: these fingerprints have not been validated.

The Substruct fingerprints are CACTVS/PubChem-like fingerprints designed for use across multiple toolkits.

The ChemFP-Substruct-RDKit/1 FingerprintType has no parameters.

#### RDMACCSRDKitFingerprinter\_v1

# class chemfp.rdkit\_patterns.RDMACCSRDKitFingerprinter\_v1

chemfp's RDMACCS fingerprint implementation for RDKit, version 1

The RDMACSS keys are MACCS-166-like fingerprints based on RDKit's MACCS116 definition, but designed to be (slightly) more portable across multiple chemistry toolkits.

This version does not define key 44.

The RDMACSS-RDKit/1 FingerprintType has no parameters.

#### RDMACCSRDKitFingerprinter\_v2

# class chemfp.rdkit\_patterns.RDMACCSRDKitFingerprinter\_v2

chemfp's RDMACCS fingerprint implementation for RDKit, version 2

The RDMACSS keys are MACCS-166-like fingerprints based on RDKit's MACCS116 definition, but designed to be (slightly) more portable across multiple chemistry toolkits.

This version defines key 44.

The RDMACSS-RDKit/2 FingerprintType has no parameters.

# 8.2.6 CDK fingerprints

CDK implements 19 fingerprint families, and chemfp implements two fingerprint families based on CDK. These are:

- CDK-Daylight Enumeration-based fingerprint based on the Daylight fingerprint algorithm.
- CDK-GraphOnly Modified version of the Daylight fingerprint where all bond types are treated identically.
- CDK-MACCS CDK's implementation of the 166-bit MACCS keys.
- CDK-EState 79-bit fingerprints using the E-State fragments.
- CDK-Extended Modified version of the Daylight fingerprint with 25 bits reserved for ring features.
- CDK-Hybridization Modified version of the Daylight fingerprint using SP2 hybridization instead of aromaticity.
- CDK-KlekotaRoth SMARTS based substructure fingerprint based on chemical substructures that enrich for biological activity.
- CDK-Pubchem CDK implementation of the CACTVS/PubChem fingerprints.
- CDK-Substructure 307-bit fingerprint based on substructure features defined by SMARTS patterns.
- CDK-ShortestPath A fingerprint based on the shortest path between two atoms, along with information about ring systems, charges, and more.
- CDK-ECFP0 ECFP-like circular fingerprint of diameter 0 (just the atom type).
- CDK-ECFP2 ECFP-like circular fingerprint of diameter 2.
- CDK-ECFP4 ECFP-like circular fingerprint of diameter 4.
- CDK-ECFP6 ECFP-like circular fingerprint of diameter 6.
- CDK-FCFP0 ECFP-like circular fingerprint of diameter 0 (just the atom feature type).
- CDK-FCFP2 ECFP-like circular fingerprint of diameter 2.
- CDK-FCFP4 ECFP-like circular fingerprint of diameter 4.
- CDK-FCFP6 ECFP-like circular fingerprint of diameter 6.
- CDK-AtomPairs2D An implementation of the PaDEL fingerprint.
- RDMACCS-CDK a chemfp implementation of the 166 MACCS keys. (You should likely use CDK-MACCS instead of this fingerprint.)
- ChemFP-Substruct-CDK an experimental chemfp implementation of the PubChem keys. (You should likely use CDK-Pubchem instead of this fingerprint.)

Note: RDMACCS-RDKit/1 does not have a definition for key 44.

# CDKDaylightFingerprintType\_v20

# ${\tt class~chemfp.cdk\_types.CDKDaylightFingerprintType\_v20}$

CDK's Daylight-like fingerprint, version 2.0

The CDK-Daylight/2.0 FingerprintType parameters are:

- size the number of bits in the fingerprint (default: 1024)
- searchDepth maximum path length (default: 7)
- pathLimit maximum number of paths (default: 42000)
- hashPseudoAtoms include pseudo-atoms in the hash calculation (default: 0)

# CDKGraphOnlyFingerprintType\_v20

# $\verb|class|| chemfp.cdk\_types.CDKGraphOnlyFingerprintType\_v20|$

CDK's GraphOnly fingerprint, version 2.0

The CDK-GraphOnly/2.0 FingerprintType parameters are:

- size the number of bits in the fingerprint (default: 1024)
- searchDepth maximum path length (default: 7)
- pathLimit maximum number of paths (default: 42000)
- hashPseudoAtoms include pseudo-atoms in the hash calculation (default: 0)

### CDKMACCSFingerprintType\_v20

### class chemfp.cdk types.CDKMACCSFingerprintType v20

CDK's implementation of the 166 MACCS keys, version 2.0

The CDK-MACCS/2.0 fingerprints have no parameters.

### CDKEStateFingerprintType\_v20

# class chemfp.cdk\_types.CDKEStateFingerprintType\_v20

CDK's implementation of the EState fingerprint, version 2.0

The CDK-EState/2.0 fingerprints have no parameters.

### CDKExtendedFingerprintType\_v20

#### class chemfp.cdk\_types.CDKExtendedFingerprintType\_v20

CDK's Extended fingerprint, version 2.0

The CDK-Extended/2.0 FingerprintType parameters are:

- size the number of bits in the fingerprint (default: 1024)
- searchDepth maximum path length (default: 7)
- pathLimit maximum number of paths (default: 42000)
- hashPseudoAtoms include pseudo-atoms in the hash calculation (default: 0)

# CDKHybridizationFingerprintType\_v20

# ${\tt class~chemfp.cdk\_types.CDKHybridizationFingerprintType\_v20} \\ {\tt CDK's~Hybridization~fingerprint,~version~2.0}$

The CDK-Hybridization/2.0 FingerprintType parameters are:

- size the number of bits in the fingerprint (default: 1024)
- searchDepth maximum path length (default: 7)
- pathLimit maximum number of paths (default: 42000)
- hashPseudoAtoms include pseudo-atoms in the hash calculation (default: 0)

# CDKKlekotaRothFingerprintType\_v20

# ${\tt class\ chemfp.cdk\_types.CDKKlekotaRothFingerprintType\_v20}\\ {\tt CDK's\ implementation\ of\ the\ Klekota-Roth\ fingerprints}$

The CDK-KlekotaRoth/2.0 fingerprints have no parameters.

# CDKPubchemFingerprintType\_v20

# class chemfp.cdk\_types.CDKPubchemFingerprintType\_v20

CDK's implementation of the Klekota-Roth fingerprints

The CDK-Pubchem/2.0 fingerprints have no parameters.

### CDKSubstructureFingerprintType\_v20

# 

The CDK-Substructure/2.0 fingerprints have no parameters.

# CDKShortestPathFingerprintType\_v20

# 

The CDK-ShortestPath/2.0 FingerprintType parameter is:

• size - the number of bits in the fingerprint (default: 1024)

# CDKECFP0FingerprintType\_v20

# class chemfp.cdk\_types.CDKECFP0FingerprintType\_v20

CDK's implementation of the ECFP0 fingerprint, version 2.0

The CDK-ECFP0/2.0 FingerprintType parameters are:

- size the number of bits in the fingerprint (default: 1024)
- perceiveStereochemistry if True, re-perceive stereochemistry from 2D/3D coordinates

# CDKECFP2FingerprintType\_v20

# class chemfp.cdk\_types.CDKECFP2FingerprintType\_v20

CDK's implementation of the ECFP2 fingerprint, version 2.0

The CDK-ECFP2/2.0 FingerprintType parameters are:

- size the number of bits in the fingerprint (default: 1024)
- perceiveStereochemistry if True, re-perceive stereochemistry from 2D/3D coordinates

# CDKECFP4FingerprintType\_v20

# class chemfp.cdk\_types.CDKECFP4FingerprintType\_v20

CDK's implementation of the ECFP4 fingerprint, version 2.0

The CDK-ECFP4/2.0 FingerprintType parameters are:

- size the number of bits in the fingerprint (default: 1024)
- perceiveStereochemistry if True, re-perceive stereochemistry from 2D/3D coordinates

# CDKECFP6FingerprintType\_v20

# class chemfp.cdk\_types.CDKECFP6FingerprintType\_v20

CDK's implementation of the ECFP6 fingerprint, version 2.0

The CDK-ECFP6/2.0 FingerprintType parameters are:

- size the number of bits in the fingerprint (default: 1024)
- perceiveStereochemistry if True, re-perceive stereochemistry from 2D/3D coordinates

# CDKFCFP0FingerprintType\_v20

# class chemfp.cdk\_types.CDKFCFP0FingerprintType\_v20

CDK's implementation of the FCFP0 fingerprint, version 2.0

The CDK-FCFP0/2.0 FingerprintType parameters are:

- size the number of bits in the fingerprint (default: 1024)
- perceiveStereochemistry if True, re-perceive stereochemistry from 2D/3D coordinates

### CDKFCFP2FingerprintType\_v20

#### class chemfp.cdk\_types.CDKFCFP2FingerprintType\_v20

CDK's implementation of the FCFP2 fingerprint, version 2.0

The CDK-FCFP2/2.0 FingerprintType parameters are:

- size the number of bits in the fingerprint (default: 1024)
- perceiveStereochemistry if True, re-perceive stereochemistry from 2D/3D coordinates

# CDKFCFP4FingerprintType\_v20

# class chemfp.cdk\_types.CDKFCFP4FingerprintType\_v20

CDK's implementation of the FCFP4 fingerprint, version 2.0

The CDK-FCFP4/2.0 FingerprintType parameters are:

- size the number of bits in the fingerprint (default: 1024)
- perceiveStereochemistry if True, re-perceive stereochemistry from 2D/3D coordinates

# CDKFCFP6FingerprintType\_v20

# class chemfp.cdk\_types.CDKFCFP6FingerprintType\_v20

CDK's implementation of the FCFP6 fingerprint, version 2.0

The CDK-FCFP6/2.0 FingerprintType parameters are:

- size the number of bits in the fingerprint (default: 1024)
- perceiveStereochemistry if True, re-perceive stereochemistry from 2D/3D coordinates

# CDKAtomPairs2DFingerprintType\_v20

### class chemfp.cdk\_types.CDKAtomPairs2DFingerprintType\_v20

CDK's implementation of the atom pairs fingerprint from Yap Chun Wei's PaDEL.

The CDK-AtomPairs2D/2.0 FingerprintType takes no parameters.

### SubstructCDKFingerprinter\_v1

### class chemfp.cdk\_patterns.SubstructCDKFingerprinter\_v1

chemfp's Substruct fingerprint implementation for CDK, version 1

WARNING: these fingerprints have not been validated.

The Substruct fingerprints are CACTVS/PubChem-like fingerprints designed for use across multiple toolkits.

The ChemFP-Substruct-CDK/1 FingerprintType has no parameters.

# RDMACCSCDKFingerprinter\_v1

### class chemfp.cdk\_patterns.RDMACCSCDKFingerprinter\_v1

chemfp's RDMACCS fingerprint implementation for CDK, version 1

The RDMACSS keys are MACCS-166-like fingerprints based on RDKit's MACCS116 definition, but designed to be (slightly) more portable across multiple chemistry toolkits.

This version does not define key 44.

The RDMACSS-CDK/1 FingerprintType has no parameters.

### RDMACCSCDKFingerprinter\_v2

# class chemfp.cdk\_patterns.RDMACCSCDKFingerprinter\_v2

chemfp's RDMACCS fingerprint implementation for CDK, version 2

The RDMACSS keys are MACCS-166-like fingerprints based on RDKit's MACCS116 definition, but designed to be (slightly) more portable across multiple chemistry toolkits.

This version defines key 44.

The RDMACSS-CDK/2 FingerprintType has no parameters.

# 8.3 chemfp.arena module

There should be no reason for you to import this module yourself. It contains the *FingerprintArena* implementation. FingerprintArena instances are returned as part of the public API but should not be constructed directly. Instead, use *chemfp.load\_fingerprints()* to create an arena.

# 8.3.1 FingerprintArena

### class chemfp.arena.FingerprintArena

Store fingerprints in a contiguous block of memory for fast searches

A fingerprint arena implements the chemfp.FingerprintReader API.

A fingerprint arena stores all of the fingerprints in a continuous block of memory, so the per-molecule overhead is very low.

The fingerprints can be sorted by popcount, so the fingerprints with no bits set come first, followed by those with 1 bit, etc. If self.popcount\_indices is a non-empty string then the string contains information about the start and end offsets for all the fingerprints with a given popcount. This information is used for the sublinear search methods.

The public attributes are:

#### metadata

chemfp. Metadata about the fingerprints

#### ids

list of identifiers, in index order

# fingerprints

Added in version 3.3.

a FingerprintList list-like view of the fingerprints, in index order

### Other attributes, which might be subject to change, and which I won't fully explain, are:

- arena a contiguous block of memory, which contains the fingerprints
- start\_padding number of bytes to the first fingerprint in the block
- end\_padding number of bytes after the last fingerprint in the block
- storage size number of bytes used to store a fingerprint
- num\_bytes number of bytes in each fingerprint (must be <= storage\_size)

- num bits number of bits in each fingerprint
- alignment the fingerprint alignment
- start the index for the first fingerprint in the arena/subarena
- end the index for the last fingerprint in the arena/subarena
- arena ids all of the identifiers for the parent arena

The FingerprintArena is its own context manager, but it does nothing on context exit. The derived FPBFingerprintArena may use a memory-mapped FPB file, which will be closed by the context manager or by an explicit call to close().

### \_\_len\_\_()

Number of fingerprint records in the FingerprintArena

### \_\_getitem\_\_(i)

Return the (id, fingerprint) pair at index i

### \_\_iter\_\_()

Iterate over the (id, fingerprint) contents of the arena

### get\_fingerprint\_type()

Get the fingerprint type object based on the metadata's type field

This uses self.metadata.type to get the fingerprint type string then calls chemfp. get\_fingerprint\_type() to get and return a chemfp.types.FingerprintType instance.

This will raise a TypeError if there is no metadata, and a ValueError if the type field was invalid or the fingerprint type isn't available.

Returns a chemfp.types.FingerprintType

# get\_fingerprint(i)

Return the fingerprint at index i

Raises an IndexError if index i is out of range.

#### get\_by\_id(id)

Given the record identifier, return the (id, fingerprint) pair,

If the *id* is not present then return None.

### get index by id(id)

Given the record identifier, return the record index

If the id is not present then return None.

#### get fingerprint by id(id)

Given the record identifier, return its fingerprint

If the *id* is not present then return None

# save(destination, format=None, level=None)

Save the fingerprints to a given destination and format

The output format is based on the *format*. If the format is None then the format depends on the *destination* file extension. If the extension isn't recognized then the fingerprints will be saved in "fps" format.

If the output format is "fps", "fps.gz", or "fps.zst" then destination may be a filename, a file object, or None; None writes to stdout.

If the output format is "fpb" then *destination* must be a filename or seekable file object. Chemfp cannot save to compressed FPB files.

#### Parameters

- destination (a filename, file object, or None) the output destination
- format (None, "fps", "fps.gz", "fps.zst", or "fpb") the output format
- level (an integer, or "min", "default", or "max" for compressor-specific values) compression level when writing .gz or .zst files

#### Returns None

```
iter_arenas(arena\_size = 1000)
```

Base class for all chemfp objects holding fingerprint records

All FingerprintReader instances have a metadata attribute containing a Metadata and can be iteratated over to get the (id, fingerprint) for each record.

```
copy(indices=None, reorder=None)
```

Create a new arena using either all or some of the fingerprints in this arena

By default this create a new arena. The fingerprint data block and ids may be shared with the original arena, which makes this a shallow copy. If the original arena is a slice, or "sub-arena" of an arena, then the copy will allocate new space to store just the fingerprints in the slice and use its own list for the ids.

The *indices* parameter, if not None, is an iterable which contains the indices of the fingerprint records to copy. Duplicates are allowed, though discouraged.

If *indices* are specified then the default *reorder* value of None, or the value True, will reorder the fingerprints for the new arena by popcount. This improves overall search performance. If *reorder* is False then the new arena will preserve the order given by the indices.

If *indices* are not specified, then the default is to preserve the order type of the original arena. Use reorder=True to always reorder the fingerprints in the new arena by popcount, and reorder=False to always leave them in the current ordering.

```
>>> import chemfp
>>> arena = chemfp.load_fingerprints("pubchem_queries.fps")
>>> arena.ids[1], arena.ids[5], arena.ids[10], arena.ids[18]
(b'9425031', b'9425015', b'9425040', b'9425033')
>>> len(arena)
19
>>> new_arena = arena.copy(indices=[1, 5, 10, 18])
>>> len(new_arena)
4
>>> new_arena.ids
[b'9425031', b'9425015', b'9425040', b'9425033']
>>> new_arena = arena.copy(indices=[18, 10, 5, 1], reorder=False)
>>> new_arena.ids
[b'9425033', b'9425040', b'9425015', b'9425031']
```

#### **Parameters**

• indices (iterable containing integers, or None) - indices of the records to copy into the new arena

• reorder (True to reorder, False to leave in input order, None for default action) - describes how to order the fingerprints

 ${\tt random\_choice}(\mathit{rng}{=}None)$ 

Added in version 3.5.

return a randomly selected (id, fp) pair

If rng is None then use Python's random.sample() for the sampling. If rng is an integer then use random.Random(rng).sample(). Otherwise, use rng.sample().

Parameters rng (None, int, or a random.Random()) - method to use for random sampling

Returns a 2-element tuple of identifier string and fingerprint bytes

```
sample(num_samples, reorder=True, rng=None)
Added in version 3.4.1.
```

return a new arena containing num samples randomly selected fingerprints, without replacement

If  $num\_samples$  is an integer then it must be between 0 and the size of the arena. If  $num\_samples$  is a float then it must be between 0.0 and 1.0 and is interpreted as the proportion of the arena to include.

By default the new arena is sorted by popcount. Set *reorder* to *False* to return the fingerprints in random order.

If rng is None then use Python's random.sample() for the sampling. If rng is an integer then use random.Random(rng).sample(). Otherwise, use rng.sample().

#### **Parameters**

- num\_samples (int or float) number of fingerprints to select
- reorder (True to reorder, False to leave in the sampling order) describes how to order the sampled fingerprints
- rng (None, int, or a random.Random()) method to use for random sampling

Returns a FingerprintArena

```
train_test_split(train_size=None, test_size=None, reorder=True, rng=None)
Added in version 3.4.1.
```

return are nas containing  $train\_size$  and  $test\_size$  randomly selected finger prints, without replacement

If  $train\_size$  is an integer then it must be between 0 and the size of the arena. If  $train\_size$  is a float then it must be between 0.0 and 1.0 and is interpreted as the proportion of the arena to include. If  $train\_size$  is None then it is set to the complement of  $test\_size$ . If both  $train\_size$  and  $test\_size$  are None then the default  $train\_size$  is 0.75.

If  $test\_size$  is an integer then it must be between 0 and the size of the arena. If  $test\_size$  is a float then it must be between 0.0 and 1.0 and is interpreted as the proportion of the arena to include. If  $test\_size$  is None then it is set to the complement of  $train\_size$ . If both  $test\_size$  and  $train\_size$  are None then the default  $test\_size$  is 0.25.

By default the new arena is sorted by popcount. Set *reorder* to *False* to return the fingerprints in random order.

If rng is None then use Python's random.sample() for the sampling. If rng is an integer then use random.Random(rng).sample(). Otherwise, use rng.sample().

This method API is modelled on scikit-learn's model\_selection.train\_test\_split() function, described at: https://scikit-learn.org/stable/modules/generated/sklearn.model\_selection.train\_test\_split.html

#### **Parameters**

- $train_size(int, float, or None)$  number of fingerprints for the training set arena
- test\_size (int, float, or None) number of fingerprints for the test set arena
- reorder (True to reorder, False to leave in the sampling order) describes how to order the sampled fingerprints
- rng (None, int, or a random.Random()) method to use for random sampling

Returns a training set FingerprintArena and a test set FingerprintArena

# to\_numpy\_array()

Added in version 3.4.

Get the fingerprint bytes in a chemfp arena as NumPy uint8 array.

A chemfp arena stores fingerprints in a contiguous byte string. This function returns a 2D NumPy array which is a view of that string. The array has len(arena) rows and  $arena.storage\_size$  columns.

The storage size may be larger than the minimum number of bytes in the fingerprint because of zero padding used to improve performance. For example, the 166-bit MACCS keys uses 24 bytes of storage when only 21 bytes are needed, because then chemfp can use the fast POPCNT instruction when computing the Tanimoto.

To remove extra padding bytes, use NumPy indexing to copy the fingerprint bytes to a new array:

```
arr[:,0:arena.num_bytes]
```

The last column of this new array may contain padding bits if the number of bits in a fingerprint is not a multiple of 8.

Warning: Do not attempt to access the contents of a NumPy view of a FPBFingerprintArena (the arena from an FPB file) after the FPB file has been closed as that will likely cause a segmentation fault or other severe failure.

Returns a NumPy array of type uint8

### to\_numpy\_bitarray(bitlist=None)

Added in version 3.4.

Get the fingerprint bits in a chemfp arena as NumPy uint8 array.

This function returns a 2D NumPy array with len(arena) rows and one column for each bit. The default returns  $arena.num\_bits$  columns, where column 0 is the first bit, etc. Use bitlist to specify the indices of which columns to return. Negative indices are supported; -1 is the last bit, -2 is the second to last. Out of range indices raise an IndexError.

Parameters bitlist (iterable of integers) – bit column indices to use (default: all bits)

Returns a NumPy array of type uint8

### count\_tanimoto\_hits\_fp(query\_fp, threshold=0.7)

Count the fingerprints which are sufficiently similar to the query fingerprint

Return the number of fingerprints in the arena which are at least *threshold* similar to the query fingerprint *query\_fp*.

### **Parameters**

- query\_fp (byte string) query fingerprint
- threshold (float between 0.0 and 1.0, inclusive) minimum similarity threshold (default: 0.7)

Returns integer count

# $\verb|threshold_tanimoto_search_fp| (query\_fp, threshold=0.7)$

Find the fingerprints which are sufficiently similar to the query fingerprint

Find all of the fingerprints in this arena which are at least *threshold* similar to the query fingerprint *query\_fp*. The hits are returned as a *SearchResult*, in arbitrary order.

#### **Parameters**

- query\_fp (byte string) query fingerprint
- threshold (float between 0.0 and 1.0, inclusive) minimum similarity threshold (default: 0.7)

Returns a SearchResult

# $knearest_tanimoto_search_fp(query_fp, k=3, threshold=0.7)$

Find the k-nearest fingerprints which are sufficiently similar to the query fingerprint

Find all of the fingerprints in this arena which are at least threshold similar to the query fingerprint, and of those, select the top k hits. The hits are returned as a SearchResult, sorted from highest score to lowest.

#### **Parameters**

- queries (a FingerprintArena) query fingerprints
- threshold (float between 0.0 and 1.0, inclusive) minimum similarity threshold (default: 0.7)

Returns a SearchResult

# count\_tversky\_hits\_fp(query\_fp, threshold=0.7, alpha=1.0, beta=1.0)

Count the fingerprints which are sufficiently similar to the query fingerprint

Return the number of fingerprints in the arena which are at least *threshold* similar to the query fingerprint *query* fp.

### **Parameters**

- query\_fp (byte string) query fingerprint
- threshold (float between 0.0 and 1.0, inclusive) minimum similarity threshold (default: 0.7)

Returns integer count

# threshold\_tversky\_search\_fp(query\_fp, threshold=0.7, alpha=1.0, beta=1.0)

Find the fingerprints which are sufficiently similar to the query fingerprint

Find all of the fingerprints in this arena which are at least *threshold* similar to the query fingerprint *query\_fp*. The hits are returned as a *SearchResult*, in arbitrary order.

### **Parameters**

- query\_fp (byte string) query fingerprint
- threshold (float between 0.0 and 1.0, inclusive) minimum similarity threshold (default: 0.7)

Returns a SearchResult

 $knearest\_tversky\_search\_fp(query\_fp, k=3, threshold=0.7, alpha=1.0, beta=1.0)$ 

Find the k-nearest fingerprints which are sufficiently similar to the query fingerprint

Find all of the fingerprints in this arena which are at least threshold similar to the query fingerprint, and of those, select the top k hits. The hits are returned as a SearchResult, sorted from highest score to lowest.

#### **Parameters**

- queries (a FingerprintArena) query fingerprints
- threshold (float between 0.0 and 1.0, inclusive) minimum similarity threshold (default: 0.7)

Returns a SearchResult

# 8.3.2 FingerprintList

# class chemfp.arena.FingerprintList

Added in version 3.3.

A read-only list-like view of the arena fingerprints

This implements the standard Python list API, including indexing and iteration.

Note: fingerprint searches like "fp in fingerprint\_list" and "fingerprint\_list.index(fp)" are not fast.

# random\_choice(rng=None)

Added in version 3.5.

return a randomly selected fingerprint

If rng is None then use Python's random.sample() for the sampling. If rng is an integer then use random.Random(rng).sample(). Otherwise, use rng.sample().

Parameters rng (None, int, or a random.Random()) - method to use for random sampling

Returns a 2-element tuple of identifier string and fingerprint bytes

# 8.4 chemfp.search module

The following functions and classes are in the chemfp.search module.

There are three main classes of functions. The ones ending with \*\_fp use a query fingerprint to search a target arena. The ones ending with \*\_arena use a query arena to search a target arena. The ones ending with \*\_symmetric use arena to search itself, except that a fingerprint is not tested against itself.

These functions share the same name with very similar functions in the top-level chemfp module. My apologies for any confusion. The top-level functions are designed to work with both arenas and iterators as

the target. They give a simple search API, and automatically process in blocks, to give a balanced trade-off between performance and response time for the first results.

The functions in this module only work with arena as the target. By default it searches the entire arena before returning. If you want to process portions of the arena then you need to specify the range yourself.

# 8.4.1 count\_tanimoto\_hits\_fp

```
chemfp.search.count_tanimoto_hits_fp(query_fp, target_arena, threshold=0.7)

Count the number of hits in target_arena at least threshold similar to the query_fp
```

# Example:

```
query_id, query_fp = chemfp.load_fingerprints("queries.fps")[0]
targets = chemfp.load_fingerprints("targets.fps")
print(chemfp.search.count_tanimoto_hits_fp(query_fp, targets, threshold=0.1))
```

#### **Parameters**

- query\_fp (a byte string) the query fingerprint
- target\_arena the target arena
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

Returns an integer count

# 8.4.2 count\_tanimoto\_hits\_arena

 $\verb|chemfp.search.count_tanimoto_hits_arena| (query\_arena, target\_arena, threshold=0.7)|$ 

For each fingerprint in  $query\_arena$ , count the number of hits in  $target\_arena$  at least threshold similar to it

### Example:

```
queries = chemfp.load_fingerprints("queries.fps")
targets = chemfp.load_fingerprints("targets.fps")
counts = chemfp.search.count_tanimoto_hits_arena(queries, targets, threshold=0.1)
print(counts[:10])
```

The result is implementation specific. You'll always be able to get its length and do an index lookup to get an integer count. Currently it's a ctypes array of longs, but it could be an array array or Python list in the future.

#### **Parameters**

- query\_arena (a chemfp.arena.FinqerprintArena) The query fingerprints.
- target\_arena (a chemfp.arena.FingerprintArena) The target fingerprints.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

Returns an array of counts

# 8.4.3 count\_tanimoto\_hits\_symmetric

chemfp.search.count\_tanimoto\_hits\_symmetric(arena, threshold=0.7, batch\_size=100)

For each fingerprint in the arena, count the number of other fingerprints at least threshold similar to it

A fingerprint never matches itself.

The computation can take a long time. Python won't check check for a  $^{\circ}$ C until the function finishes. This can be irritating. Instead, process only *batch\_size* rows at a time before checking for a  $^{\circ}$ C.

Note: the *batch\_size* may disappear in future versions of chemfp. I can't detect any performance difference between the current value and a larger value, so it seems rather pointless to have. Let me know if it's useful to keep as a user-defined parameter.

### Example:

```
arena = chemfp.load_fingerprints("targets.fps")
counts = chemfp.search.count_tanimoto_hits_symmetric(arena, threshold=0.2)
print(counts[:10])
```

The result object is implementation specific. You'll always be able to get its length and do an index lookup to get an integer count. Currently it's a ctype array of longs, but it could be an array.array or Python list in the future.

#### Parameters

- arena (a chemfp.arena.FingerprintArena) the set of fingerprints
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.
- batch\_size (integer) the number of rows to process before checking for a ^C

Returns an array of counts

# 8.4.4 partial\_count\_tanimoto\_hits\_symmetric

```
\label{lem:chemfp.search.partial_count_tanimoto_hits_symmetric} (counts, \quad arena, \quad threshold = 0.7, \\ query\_start = 0, \quad query\_end = None, \\ target \quad start = 0, \quad target \quad end = None)
```

Compute a portion of the symmetric Tanimoto counts

For most cases, use chemfp.search.count\_tanimoto\_hits\_symmetric() instead of this function!

This function is only useful for thread-pool implementations. In that case, set the number of OpenMP threads to 1.

counts is a contiguous array of integers. It should be initialized to zeros, and reused for successive calls.

The function adds counts for counts [query\_start:query\_end] based on computing the upper-triangle portion contained in the rectangle query\_start:query\_end and target\_start:target\_end\* and using symmetry to fill in the lower half.

You know, this is pretty complicated. Here's the bare minimum example of how to use it correctly to process 10 rows at a time using up to 4 threads:

```
import chemfp
import chemfp.search
from chemfp import futures
import array
```

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#### **Parameters**

- counts (a contiguous block of integer) the accumulated Tanimoto counts
- arena (a chemfp.arena.FingerprintArena) the fingerprints.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.
- query\_start (an integer) the query start row
- query\_end (an integer, or None to mean the last query row) the query end row
- target\_start (an integer) the target start row
- target\_end (an integer, or None to mean the last target row) the target end row

Returns None

# 8.4.5 count\_tversky\_hits\_fp

```
 \begin{array}{ll} \texttt{chemfp.search.count\_tversky\_hits\_fp}(\textit{query\_fp}, & \textit{target\_arena}, & \textit{threshold=0.7}, & \textit{alpha=1.0}, \\ & \textit{beta=1.0}) \end{array}
```

Count the number of hits in  $target\_arena$  least threshold similar to the  $query\_fp$  (Tversky)

Example:

```
query_id, query_fp = chemfp.load_fingerprints("queries.fps")[0]
targets = chemfp.load_fingerprints("targets.fps")
print(chemfp.search.count_tversky_hits_fp(query_fp, targets, threshold=0.1))
```

#### Parameters

- query\_fp (a byte string) the query fingerprint
- target\_arena the target arena
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

Returns an integer count

# 8.4.6 count\_tversky\_hits\_arena

 $\label{lem:count_tversky_hits_arena} $$ (query\_arena, target\_arena, threshold=0.7, alpha=1.0, beta=1.0)$$ 

For each fingerprint in query\_arena, count the number of hits in target\_arena at least threshold similar to it

Example:

The result is implementation specific. You'll always be able to get its length and do an index lookup to get an integer count. Currently it's a ctypes array of longs, but it could be an array array or Python list in the future.

#### **Parameters**

- query\_arena (a chemfp.arena.FingerprintArena) The query fingerprints.
- target\_arena (a chemfp.arena.FingerprintArena) The target fingerprints.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

Returns an array of counts

# 8.4.7 count\_tversky\_hits\_symmetric

```
\label{lem:count_tversky_hits_symmetric} (arena, threshold=0.7, alpha=1.0, beta=1.0, \\ batch size=100)
```

For each fingerprint in the arena, count the number of other fingerprints at least threshold similar to it

A fingerprint never matches itself.

The computation can take a long time. Python won't check check for a  $^{\text{C}}$  until the function finishes. This can be irritating. Instead, process only  $batch\_size$  rows at a time before checking for a  $^{\text{C}}$ .

Note: the *batch\_size* may disappear in future versions of chemfp. I can't detect any performance difference between the current value and a larger value, so it seems rather pointless to have. Let me know if it's useful to keep as a user-defined parameter.

Example:

```
arena = chemfp.load_fingerprints("targets.fps")
counts = chemfp.search.count_tversky_hits_symmetric(
    arena, threshold=0.2, alpha=0.5, beta=0.5)
print(counts[:10])
```

The result object is implementation specific. You'll always be able to get its length and do an index lookup to get an integer count. Currently it's a ctype array of longs, but it could be an array.array or Python list in the future.

### **Parameters**

• arena (a chemfp.arena.FingerprintArena) - the set of fingerprints

- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.
- batch\_size (integer) the number of rows to process before checking for a ^C

Returns an array of counts

# 8.4.8 partial\_count\_tversky\_hits\_symmetric

```
\label{lem:chemfp.search.partial_count_tversky_hits_symmetric} (counts, \quad arena, \quad threshold=0.7, \quad al-pha=1.0, \quad beta=1.0, \quad query\_start=0, \\ query\_end=None, \quad target\_start=0, \\ target\_end=None)
```

Compute a portion of the symmetric Tversky counts

For most cases, use chemfp.search.count\_tversky\_hits\_symmetric() instead of this function!

This function is only useful for thread-pool implementations. In that case, set the number of OpenMP threads to 1.

counts is a contiguous array of integers. It should be initialized to zeros, and reused for successive calls.

The function adds counts for counts [query\_start:query\_end] based on computing the upper-triangle portion contained in the rectangle query\_start:query\_end and target\_start:target\_end\* and using symmetry to fill in the lower half.

You know, this is pretty complicated. Here's the bare minimum example of how to use it correctly to process 10 rows at a time using up to 4 threads:

#### Parameters

- counts (a contiquous block of integer) the accumulated Tversky counts
- arena (a chemfp.arena.FingerprintArena) the fingerprints.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold
- query\_start (an integer) the query start row

- query\_end (an integer, or None to mean the last query row) the query end row
- target\_start (an integer) the target start row
- target\_end (an integer, or None to mean the last target row) the target end row

Returns None

# 8.4.9 threshold\_tanimoto\_search\_fp

chemfp.search.threshold\_tanimoto\_search\_fp(query\_fp, target\_arena, threshold=0.7)

Search for fingerprint hits in target\_arena which are at least threshold similar to query\_fp

The hits in the returned chemfp.search.SearchResult are in arbitrary order.

Example:

#### Parameters

- query\_fp (a byte string) the query fingerprint
- target\_arena (a chemfp.arena.FingerprintArena) the target arena
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

Returns a chemfp.search.SearchResult

# 8.4.10 threshold\_tanimoto\_search\_arena

 $\label{lem:chemfp.search.threshold_tanimoto_search_arena} (\textit{query\_arena}, \textit{target\_arena}, \textit{threshold} = 0.7) \\ \text{Search for the hits in the } \textit{target\_arena} \text{ at least } \textit{threshold} \text{ similar to the fingerprints in } \textit{query\_arena} \\ \text{Search} \text{ for the hits in the } \textit{target\_arena} \text{ at least } \textit{threshold} \text{ similar to the fingerprints in } \textit{query\_arena} \\ \text{Search} \text{ for the hits in the } \textit{target\_arena} \text{ at least } \textit{threshold} \text{ similar to the fingerprints in } \textit{query\_arena} \\ \text{Search} \text{ for the hits in the } \textit{target\_arena} \text{ at least } \textit{threshold} \text{ similar to the fingerprints in } \textit{query\_arena} \\ \text{ for the hits in the } \textit{target\_arena} \text{ at least } \textit{threshold} \text{ similar to the fingerprints in } \textit{query\_arena} \\ \text{ for the hits in the } \textit{target\_arena} \text{ at least } \textit{threshold} \text{ similar to the fingerprints in } \textit{query\_arena} \\ \text{ for the hits } \text{ for the hits$ 

The hits in the returned *chemfp.search.SearchResults* are in arbitrary order.

Example:

#### Parameters

- $query\_arena$  (a chemfp.arena.FingerprintArena) The query fingerprints.
- target\_arena (a chemfp.arena.FingerprintArena) The target fingerprints.

• threshold (float between 0.0 and 1.0, inclusive) - The minimum score threshold.

Returns a chemfp.search.SearchResults

# 8.4.11 threshold\_tanimoto\_search\_symmetric

```
 \begin{array}{c} \texttt{chemfp.search.threshold\_tanimoto\_search\_symmetric} (arena, & threshold=0.7, & in-clude\_lower\_triangle=True, \\ & batch & size=100) \end{array}
```

Search for the hits in the arena at least threshold similar to the fingerprints in the arena

When *include\_lower\_triangle* is True, compute the upper-triangle similarities, then copy the results to get the full set of results. When *include\_lower\_triangle* is False, only compute the upper triangle.

The hits in the returned chemfp.search.SearchResults are in arbitrary order.

The computation can take a long time. Python won't check check for a  $^{\text{C}}$  until the function finishes. This can be irritating. Instead, process only  $batch\_size$  rows at a time before checking for a  $^{\text{C}}$ .

Note: the *batch\_size* may disappear in future versions of chemfp. Let me know if it really is useful for you to have as a user-defined parameter.

# Example:

### **Parameters**

- arena (a chemfp.arena.FingerprintArena) the set of fingerprints
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.
- include\_lower\_triangle (boolean) if False, compute only the upper triangle, otherwise use symmetry to compute the full matrix
- batch\_size (integer) the number of rows to process before checking for a ^C

Returns a chemfp.search.SearchResults

# 8.4.12 partial\_threshold\_tanimoto\_search\_symmetric

```
\label{eq:chemfp.search.partial_threshold_tanimoto_search_symmetric} cresults, & arena, & threshold=0.7, & query\_start=0, \\ & query\_end=None, & target\_end=None, & target\_end=None, \\ & results & offset=0) \\ \end{array}
```

Compute a portion of the symmetric Tanimoto search results

For most cases, use <code>chemfp.search.threshold\_tanimoto\_search\_symmetric()</code> instead of this function!

This function is only useful for thread-pool implementations. In that case, set the number of OpenMP threads to 1.

results is a chemfp.search.SearchResults instance which is at least as large as the arena. It should be reused for successive updates.

The function adds hits to results [query\_start:query\_end], based on computing the upper-triangle portion contained in the rectangle query\_start:query\_end and target\_start:target\_end.

It does not fill in the lower triangle. To get the full matrix, call fill\_lower\_triangle.

You know, this is pretty complicated. Here's the bare minimum example of how to use it correctly to process 10 rows at a time using up to 4 threads:

The hits in the chemfp.search.SearchResults are in arbitrary order.

#### Parameters

- $\bullet$   ${\tt results}$  (a  ${\it chemfp.search.SearchResults}$  instance) the intermediate search results
- arena (a chemfp.arena.FingerprintArena) the fingerprints.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.
- query\_start (an integer) the query start row
- query\_end (an integer, or None to mean the last query row) the query end row
- target\_start (an integer) the target start row
- target\_end (an integer, or None to mean the last target row) the target end row
- results\_offset use results[results offset] as the base for the results
- results\_offset an integer

Returns None

# 8.4.13 fill\_lower\_triangle

```
chemfp.search.fill_lower_triangle(results)
```

Duplicate each entry of results to its transpose

This is used after the symmetric threshold search to turn the upper-triangle results into a full matrix.

Parameters results (a chemfp.search.SearchResults) - search results

# 8.4.14 threshold\_tversky\_search\_fp

Search for fingerprint hits in target\_arena which are at least threshold similar to query\_fp

The hits in the returned chemfp.search.SearchResult are in arbitrary order.

Example:

#### **Parameters**

- query\_fp (a byte string) the query fingerprint
- target\_arena (a chemfp.arena.FingerprintArena) the target arena
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

Returns a chemfp.search.SearchResult

# 8.4.15 threshold\_tversky\_search\_arena

 $\label{lem:chemfp.search_threshold_tversky_search_arena} (\textit{query\_arena}, \; \textit{target\_arena}, \; \textit{threshold=0.7}, \; \textit{al-pha=1.0}, \; \textit{beta=1.0})$ 

Search for the hits in the target\_arena at least threshold similar to the fingerprints in query\_arena

The hits in the returned chemfp.search.SearchResults are in arbitrary order.

Example:

### Parameters

- query arena (a chemfp.arena.FingerprintArena) The query fingerprints.
- target arena (a chemfp.arena.FingerprintArena) The target fingerprints.

• threshold (float between 0.0 and 1.0, inclusive) - The minimum score threshold.

Returns a chemfp.search.SearchResults

# 8.4.16 threshold\_tversky\_search\_symmetric

```
\label{lem:chemfp.search_threshold_tversky_search_symmetric} (arena, & threshold=0.7, & alpha=1.0, \\ beta=1.0, & include\_lower\_triangle=True, \\ batch & size=100) \\
```

Search for the hits in the arena at least threshold similar to the fingerprints in the arena

When *include\_lower\_triangle* is True, compute the upper-triangle similarities, then copy the results to get the full set of results. When *include\_lower\_triangle* is False, only compute the upper triangle.

The hits in the returned chemfp.search.SearchResults are in arbitrary order.

The computation can take a long time. Python won't check check for a  $^{\text{C}}$  until the function finishes. This can be irritating. Instead, process only  $batch\_size$  rows at a time before checking for a  $^{\text{C}}$ 

Note: the *batch\_size* may disappear in future versions of chemfp. Let me know if it really is useful for you to have as a user-defined parameter.

# Example:

```
arena = chemfp.load_fingerprints("queries.fps")
full_result = chemfp.search.threshold_tversky_search_symmetric(
    arena, threshold=0.2, alpha=0.5, beta=0.5)
upper_triangle = chemfp.search.threshold_tversky_search_symmetric(
    arena, threshold=0.2, alpha=0.5, beta=0.5, include_lower_triangle=False)
assert sum(map(len, full_result)) == sum(map(len, upper_triangle))*2
```

#### **Parameters**

- arena (a chemfp.arena.FingerprintArena) the set of fingerprints
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.
- include\_lower\_triangle (boolean) if False, compute only the upper triangle, otherwise use symmetry to compute the full matrix
- batch\_size (integer) the number of rows to process before checking for a ^C

Returns a chemfp.search.SearchResults

# 8.4.17 partial\_threshold\_tversky\_search\_symmetric

```
\label{eq:chemfp.search.partial_threshold_tversky_search_symmetric} (\textit{results}, & \textit{arena}, & \textit{threshold} = 0.7, & \textit{alpha} = 1.0, \\ \textit{beta} = 1.0, & \textit{query\_start} = 0, \\ \textit{query\_end} = None, & \textit{target\_end} = None, \\ \textit{results\_offset} = 0) \\ \end{cases}
```

Compute a portion of the symmetric Tversky search results

For most cases, use chemfp.search.threshold\_tversky\_search\_symmetric() instead of this function!

This function is only useful for thread-pool implementations. In that case, set the number of OpenMP threads to 1.

results is a chemfp.search.SearchResults instance which is at least as large as the arena. It should be reused for successive updates.

The function adds hits to results [query\_start:query\_end], based on computing the upper-triangle portion contained in the rectangle query\_start:query\_end and target\_start:target\_end.

It does not fill in the lower triangle. To get the full matrix, call fill lower triangle.

You know, this is pretty complicated. Here's the bare minimum example of how to use it correctly to process 10 rows at a time using up to 4 threads:

The hits in the chemfp.search.SearchResults are in arbitrary order.

#### Parameters

- counts (a SearchResults instance) the intermediate search results
- arena (a chemfp.arena.FingerprintArena) the fingerprints.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.
- query\_start (an integer) the query start row
- query\_end (an integer, or None to mean the last query row) the query end row
- target\_start (an integer) the target start row
- target\_end (an integer, or None to mean the last target row) the target end row
- results\_offset use results[results offset] as the base for the results
- results\_offset an integer

Returns None

# 8.4.18 knearest tanimoto search fp

chemfp.search.knearest\_tanimoto\_search\_fp(query\_fp, target\_arena, k=3, threshold=0.7)
Search for k-nearest hits in target\_arena which are at least threshold similar to query\_fp

The hits in the chemfp.search.SearchResults are ordered by decreasing similarity score.

Example:

#### Parameters

- query\_fp (a byte string) the query fingerprint
- target\_arena (a chemfp.arena.FingerprintArena) the target arena
- k (positive integer) the number of nearest neighbors to find.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

Returns a chemfp.search.SearchResult

# 8.4.19 knearest\_tanimoto\_search\_arena

 $\begin{array}{c} \texttt{chemfp.search.knearest\_tanimoto\_search\_arena} (\textit{query\_arena}, & \textit{target\_arena}, & \textit{k=3}, & \textit{thresh-old=0.7}) \end{array}$ 

Search for the k nearest hits in the  $target\_arena$  at least threshold similar to the fingerprints in  $query\_arena$ 

The hits in the chemfp.search.SearchResults are ordered by decreasing similarity score.

Example:

# Parameters

- query\_arena (a chemfp.arena.FingerprintArena) The query fingerprints.
- target\_arena (a chemfp.arena.FingerprintArena) The target fingerprints.
- k (positive integer) the number of nearest neighbors to find.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

Returns a chemfp.search.SearchResults

# 8.4.20 knearest\_tanimoto\_search\_symmetric

```
\label{lem:chemfp.search.knearest_tanimoto_search_symmetric} (arena, & k=3, & threshold=0.7, \\ & batch & size=100) \\
```

Search for the k-nearest hits in the arena at least threshold similar to the fingerprints in the arena

The hits in the SearchResults are ordered by decreasing similarity score.

The computation can take a long time. Python won't check check for a  $^{\circ}$ C until the function finishes. This can be irritating. Instead, process only *batch size* rows at a time before checking for a  $^{\circ}$ C.

Note: the *batch\_size* may disappear in future versions of chemfp. Let me know if it really is useful for you to keep as a user-defined parameter.

### Example:

### Parameters

- arena (a chemfp.arena.FingerprintArena) the set of fingerprints
- k (positive integer) the number of nearest neighbors to find.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.
- include\_lower\_triangle (boolean) if False, compute only the upper triangle, otherwise use symmetry to compute the full matrix
- batch\_size (integer) the number of rows to process before checking for a  ${^{\smallfrown}C}$

Returns a chemfp.search.SearchResults

# 8.4.21 knearest tversky search fp

Search for k-nearest hits in target arena which are at least threshold similar to query fp

The hits in the chemfp.search.SearchResults are ordered by decreasing similarity score.

### Example:

#### Parameters

- query\_fp (a byte string) the query fingerprint
- target\_arena the target arena

- k (positive integer) the number of nearest neighbors to find.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

Returns a chemfp.search.SearchResults

# 8.4.22 knearest\_tversky\_search\_arena

 $\label{lem:chemfp.search.knearest_tversky_search_arena} \\ (\textit{query\_arena}, \; \textit{target\_arena}, \; k=3, \; \textit{threshold} = 0.7, \\ & \textit{alpha} = 1.0, \; \textit{beta} = 1.0) \\ \end{aligned}$ 

Search for the k nearest hits in the  $target\_arena$  at least threshold similar to the fingerprints in  $query\_arena$ 

The hits in the chemfp.search.SearchResults are ordered by decreasing similarity score.

# Example:

#### Parameters

- query\_arena (a chemfp.arena.FingerprintArena) The query fingerprints.
- target\_arena (a chemfp.arena.FingerprintArena) The target fingerprints.
- k (positive integer) the number of nearest neighbors to find.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.

Returns a chemfp.search.SearchResults

# 8.4.23 knearest\_tversky\_search\_symmetric

Search for the k-nearest hits in the arena at least threshold similar to the fingerprints in the arena

The hits in the SearchResults are ordered by decreasing similarity score.

The computation can take a long time. Python won't check check for a  $^{\circ}C$  until the function finishes. This can be irritating. Instead, process only *batch\_size* rows at a time before checking for a  $^{\circ}C$ .

Note: the *batch\_size* may disappear in future versions of chemfp. Let me know if it really is useful for you to keep as a user-defined parameter.

### Example:

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#### Parameters

- arena (a chemfp.arena.FingerprintArena) the set of fingerprints
- k (positive integer) the number of nearest neighbors to find.
- threshold (float between 0.0 and 1.0, inclusive) The minimum score threshold.
- include\_lower\_triangle (boolean) if False, compute only the upper triangle, otherwise use symmetry to compute the full matrix
- batch\_size (integer) the number of rows to process before checking for a ^C

Returns a chemfp.search.SearchResults

# 8.4.24 contains\_fp

chemfp.search.contains\_fp(query\_fp, target\_arena)

Find the target fingerprints which contain the query fingerprint bits as a subset

A target fingerprint contains a query fingerprint if all of the on bits of the query fingerprint are also on bits of the target fingerprint. This function returns a <code>chemfp.search.SearchResult</code> containing all of the target fingerprints in <code>target\_arena</code> that contain the <code>query\_fp</code>.

The SearchResult scores are all 0.0.

There is currently no direct way to limit the arena search range. Instead create a subarena by using Python's slice notation on the arena then search the subarena.

#### **Parameters**

- query\_fp (a byte string) the query fingerprint
- target\_arena (a chemfp.arena.FingerprintArena) The target fingerprints.

Returns a SearchResult instance

# 8.4.25 contains\_arena

chemfp.search.contains arena(query arena, target arena)

Find the target fingerprints which contain the query fingerprints as a subset

A target fingerprint contains a query fingerprint if all of the on bits of the query fingerprint are also on bits of the target fingerprint. This function returns a *chemfp.search.SearchResults* where SearchResults[i] contains all of the target fingerprints in *target\_arena* that contain the fingerprint for entry *query\_arena* [i].

The SearchResult scores are all 0.0.

There is currently no direct way to limit the arena search range, though you can create and search a subarena by using Python's slice notation.

### Parameters

- query\_arena (a chemfp.arena.FingerprintArena) the query fingerprints
- target\_arena (a chemfp.arena.FingerprintArena) the target fingerprints

Returns a chemfp.search.SearchResults instance, of the same size as query\_arena

# 8.4.26 SearchResults

# class chemfp.search.SearchResults

Search results for a list of query fingerprints against a target arena

This acts like a list of SearchResult elements, with the ability to iterate over each search results, look them up by index, and get the number of scores.

In addition, there are helper methods to iterate over each hit and to get the hit indicies, scores, and identifiers directly as Python lists, sort the list contents, and more.

### \_\_len\_\_()

The number of rows in the SearchResults

### \_\_iter\_\_()

Iterate over each SearchResult hit

### \_\_getitem\_\_(i)

Get the *i*-th SearchResult

#### shape

Read-only attribute.

the tuple (number of rows, number of columns)

The number of columns is the size of the target arena.

#### iter\_indices()

For each hit, yield the list of target indices

### iter\_ids()

For each hit, yield the list of target identifiers

### iter\_scores()

For each hit, yield the list of target scores

#### iter\_indices\_and\_scores()

For each hit, yield the list of (target index, score) tuples

# iter\_ids\_and\_scores()

For each hit, yield the list of (target id, score) tuples

# clear\_all()

Remove all hits from all of the search results

Deprecated since version 3.5: This function will likely be removed in a future version of chemfp as it doesn't seem useful and because clearing the hits when there is a NumPy array view of the search results often causes chemfp to crash.

```
count_all(min_score=None, max_score=None, interval="[]")
```

Count the number of hits with a score between min\_score and max\_score

Using the default parameters this returns the number of hits in the result.

The default  $min\_score$  of None is equivalent to -infinity. The default  $max\_score$  of None is equivalent to +infinity.

The *interval* parameter describes the interval end conditions. The default of "[]" uses a closed interval, where min\_score <= score <= max\_score. The interval "()" uses the open interval where min\_score < score < max\_score. The half-open/half-closed intervals "(]" and "[)" are also supported.

#### **Parameters**

- min\_score (a float, or None for -infinity) the minimum score in the range.
- max\_score (a float, or None for +infinity) the maximum score in the range.
- interval (one of "[]", "()", "(]", "[)") specify if the end points are open or closed.

### Returns an integer count

cumulative\_score\_all(min\_score=None, max\_score=None, interval="[]")

The sum of all scores in all rows which are between  $min\_score$  and  $max\_score$ 

Using the default parameters this returns the sum of all of the scores in all of the results. With a specified range this returns the sum of all of the scores in that range. The cumulative score is also known as the raw score.

The default *min\_score* of None is equivalent to -infinity. The default *max\_score* of None is equivalent to +infinity.

The *interval* parameter describes the interval end conditions. The default of "[]" uses a closed interval, where min\_score <= score <= max\_score. The interval "()" uses the open interval where min\_score < score < max\_score. The half-open/half-closed intervals "(]" and "[)" are also supported.

# Parameters

- min\_score (a float, or None for -infinity) the minimum score in the range.
- max\_score (a float, or None for +infinity) the maximum score in the range.
- interval (one of "[]", "()", "(]", "[)") specify if the end points are open or closed.

# Returns a floating point count

reorder\_all(order="decreasing-score-plus")

Reorder the hits for all of the rows based on the requested *order*.

The available orderings are:

- increasing-score sort by increasing score
- decreasing-score sort by decreasing score
- increasing-score-plus sort by increasing score, break ties by increasing index
- decreasing-score-plus sort by decreasing score, break ties by increasing index
- increasing-index sort by increasing target index
- decreasing-index sort by decreasing target index
- move-closest-first move the hit with the highest score to the first position
- reverse reverse the current ordering

Parameters ordering (string) – the name of the ordering to use

#### to\_csr(dtype=None)

Return the results as a SciPy compressed sparse row matrix.

The returned matrix has the same shape as the SearchResult instance and can be passed into, for example, a scikit-learn clustering algorithm.

By default the scores are stored with the dtype is "float64".

This method requires that SciPy (and NumPy) be installed.

Parameters dtype (string or NumPy type) - a NumPy numeric data type

### 8.4.27 SearchResult

### class chemfp.search.SearchResult

Search results for a query fingerprint against a target arena.

The results contains a list of hits. Hits contain a target index, score, and optional target ids.

The hits can be reordered based on score or index.

### \_\_len\_\_()

The number of hits

### \_\_iter\_\_()

Iterate through the pairs of (target index, score) using the current ordering

#### clear()

Remove all hits from this result

Deprecated since version 3.5: This function will likely be removed in a future version of chemfp as it doesn't seem useful and because clearing the hits when there is a NumPy array view of the search results often causes chemfp to crash.

### get\_indices()

The list of target indices, in the current ordering.

This returns a copy of the scores. See get\_indices\_as\_numpy\_array() to get a NumPy array view of the indices.

Returns an array.array() of type 'i'

#### get\_ids()

The list of target identifiers (if available), in the current ordering

Returns a list of strings

### iter\_ids()

Iterate over target identifiers (if available), in the current ordering

### get\_scores()

The list of target scores, in the current ordering

This returns a copy of the scores. See get\_scores\_as\_numpy\_array() to get a NumPy array view of the scores.

**Returns** an array.array() of type 'd'

### get\_ids\_and\_scores()

The list of (target identifier, target score) pairs, in the current ordering

Raises a TypeError if the target IDs are not available.

**Returns** a Python list of 2-element tuples

### get\_indices\_and\_scores()

The list of (target index, target score) pairs, in the current ordering

**Returns** a Python list of 2-element tuples

#### as\_buffer()

Added in version 3.5.

Return a Python buffer object for the underlying indices and scores.

This provides a byte-oriented view of the raw data. You probably want to use as\_ctypes() or as numpy array() to get the indices and scores in a more structured form.

Warning: Do not attempt to access the buffer contents after the search result has been deallocated as that will likely cause a segmentation fault or other severe failure.

**Returns** a Python buffer object

### as\_ctypes()

Added in version 3.5.

Return a ctypes view of the underlying indices and scores

Each (index, score) pair is represented as a ctypes structure named *Hit* with fields *index* (c\_int) and *score* (c\_double).

For example, to get the score of the 5th entry use:

```
result.as_ctypes()[4].score
```

This method returns an array of type (Hit\*len(search\_result)). Modifications to this view will change chemfp's data values and vice versa. USE WITH CARE!

**Warning:** Do not attempt to access the ctype array contents after the search result has been deallocated as that will likely cause a segmentation fault or other severe failure.

This method exists to make it easier to work with C extensions without going through NumPy. If you want to pass the search results to NumPy then use  $as\_numpy\_array()$  instead.

**Returns** a ctypes array of type Hit\*len(self)

# as\_numpy\_array()

Added in version 3.5.

Return a NumPy array view of the underlying indices and scores

The view uses a structured types with fields 'index' (i4) and 'score' (f8), mapped directly onto chemfp's own data structure. For example, to get the score of the 4th entry use:

Modifications to this view will change chemfp's data values and vice versa. USE WITH CARE!

Warning: Do not attempt to access the NumPy array contents after the search result has been deallocated as that will likely cause a segmentation fault or other severe failure.

As a short-hand to get just the indices or just the scores, use get\_indices\_as\_numpy\_array() or get\_scores\_as\_numpy\_array().

Returns a NumPy array with a structured data type

# get\_indices\_as\_numpy\_array()

Added in version 3.5.

Return a NumPy array view of the underlying indices.

This is a short-cut for self.as\_numpy\_array()["index"]. See that method documentation for details and warning.

Returns a NumPy array of type 'i4'

# get\_scores\_as\_numpy\_array()

Added in version 3.5.

Return a NumPy array view of the underlying scores.

This is a short-cut for self.as\_numpy\_array()["score"]. See that method documentation for details and warning.

Returns a NumPy array of type 'f8'

# reorder(ordering="decreasing-score-plus")

Reorder the hits based on the requested ordering.

### The available orderings are:

- increasing-score sort by increasing score
- decreasing-score sort by decreasing score
- increasing-score-plus sort by increasing score, break ties by increasing index
- decreasing-score-plus sort by decreasing score, break ties by increasing index
- increasing-index sort by increasing target index
- decreasing-index sort by decreasing target index
- move-closest-first move the hit with the highest score to the first position
- reverse reverse the current ordering

Parameters ordering (string) - the name of the ordering to use

```
count(min_score=None, max_score=None, interval="[]")
```

Count the number of hits with a score between min\_score and max\_score

Using the default parameters this returns the number of hits in the result.

The default  $min\_score$  of None is equivalent to -infinity. The default  $max\_score$  of None is equivalent to +infinity.

The *interval* parameter describes the interval end conditions. The default of "[]" uses a closed interval, where min\_score <= score <= max\_score. The interval "()" uses the open interval where min\_score < score < max\_score. The half-open/half-closed intervals "(]" and "[)" are also supported.

#### **Parameters**

- min\_score (a float, or None for -infinity) the minimum score in the range.
- max\_score (a float, or None for +infinity) the maximum score in the range.
- interval (one of "[]", "()", "(]", "[)") specify if the end points are open or closed.

Returns an integer count

```
\verb|cumulative_score| (min\_score=None, max\_score=None, interval="[]") \\
```

The sum of the scores which are between min\_score and max\_score

Using the default parameters this returns the sum of all of the scores in the result. With a specified range this returns the sum of all of the scores in that range. The cumulative score is also known as the raw score.

The default  $min\_score$  of None is equivalent to -infinity. The default  $max\_score$  of None is equivalent to +infinity.

The *interval* parameter describes the interval end conditions. The default of "[]" uses a closed interval, where min\_score <= score <= max\_score. The interval "()" uses the open interval where min\_score < score < max\_score. The half-open/half-closed intervals "(]" and "[)" are also supported.

#### **Parameters**

- min\_score (a float, or None for -infinity) the minimum score in the range.
- max\_score (a float, or None for +infinity) the maximum score in the range.
- interval (one of "[]", "()", "(]", "[)") specify if the end points are open or closed.

Returns a floating point value

```
format_ids_and_scores_as_bytes(ids=None, precision=4)
Added in version 3.3.
```

Format the ids and scores as the byte string needed for simsearch output

If there are no hits then the result is the empty string b"", otherwise it returns a byte string containing the tab-seperated ids and scores, in the order ids[0], scores[0], ids[1], scores[1], ...

If the ids is not specified then the ids come from self.get\_ids(). If no ids are available, a ValueError is raised. The ids must be a list of Unicode strings.

The *precision* sets the number of decimal digits to use in the score output. It must be an integer value between 1 and 10, inclusive.

This function is 3-4x faster than the Python equivalent, which is roughly:

```
ids = ids if (ids is not None) else self.get_ids()
formatter = ("%s\t%." + str(precision) + "f").encode("ascii")
return b"\t".join(formatter % pair for pair in zip(ids, self.get_scores()))
```

# Parameters

- ids (a list of Unicode strings, or None to use the default) the identifiers to use for each hit.
- precision (an integer from 1 to 10, inclusive) the precision to use for each score

**Returns** a byte string

# 8.5 chemfp.bitops module

The following functions from the chemfp.bitops module provide low-level bit operations on byte and hex fingerprints.

### chemfp.bitops.byte\_contains(sub\_fp, super\_fp)

Return 1 if the on bits of sub fp are also 1 bits in super fp, that is, if super fp contains sub fp.

# chemfp.bitops.byte\_contains\_bit(fp, bit\_index)

Return True if the the given bit position is on, otherwise False

# chemfp.bitops.byte\_difference(fp1, fp2)

Return the absolute difference (xor) between the two byte strings, fp1 ^ fp2

# chemfp.bitops.byte\_from\_bitlist( $fp[, num\_bits=1024]$ )

Convert a list of bit positions into a byte fingerprint, including modulo folding

# chemfp.bitops.byte\_hex\_tanimoto(fp1, fp2)

Compute the Tanimoto similarity between the byte fingerprint fp1 and the hex fingerprint fp2. Return a float between 0.0 and 1.0, or raise a ValueError if fp2 is not a hex fingerprint

# chemfp.bitops.byte\_hex\_tversky(fp1, fp2, alpha=1.0, beta=1.0)

Compute the Tversky index between the byte fingerprint fp1 and the hex fingerprint fp2. Return a float between 0.0 and 1.0, or raise a ValueError if fp2 is not a hex fingerprint

#### chemfp.bitops.byte\_intersect(fp1, fp2)

Return the intersection of the two byte strings, fp1 & fp2

# chemfp.bitops.byte\_intersect\_popcount(fp1, fp2)

Return the number of bits set in the instersection of the two byte fingerprints fp1 and fp2

# chemfp.bitops.byte\_popcount(fp)

Return the number of bits set in the byte fingerprint fp

### chemfp.bitops.byte\_tanimoto(fp1, fp2)

Compute the Tanimoto similarity between the two byte fingerprints fp1 and fp2

# chemfp.bitops.byte\_to\_bitlist(bitlist)

Return a sorted list of the on-bit positions in the byte fingerprint

### chemfp.bitops.byte\_tversky(fp1, fp2, alpha=1.0, beta=1.0)

Compute the Tversky index between the two byte fingerprints fp1 and fp2

### chemfp.bitops.byte\_union(fp1, fp2)

Return the union of the two byte strings,  $fp1 \mid fp2$ 

# chemfp.bitops.hex contains(sub fp, super fp)

Return 1 if the on bits of sub\_fp are also on bits in super\_fp, otherwise 0. Return -1 if either string is not a hex fingerprint

### chemfp.bitops.hex\_contains\_bit(fp, bit\_index)

Return True if the the given bit position is on, otherwise False.

This function does not validate that the hex fingerprint is actually in hex.

# chemfp.bitops.hex\_difference(fp1, fp2)

Return the absolute difference (xor) between the two hex strings,  $fp1 \hat{\ } fp2$ . Raises a ValueError for non-hex fingerprints.

# chemfp.bitops.hex\_from\_bitlist(fp|, $num\_bits=1024$ |)

Convert a list of bit positions into a hex fingerprint, including modulo folding

# chemfp.bitops.hex\_intersect(fp1, fp2)

Return the intersection of the two hex strings, fp1 & fp2. Raises a ValueError for non-hex fingerprints.

### chemfp.bitops.hex intersect popcount (fp1, fp2)

Return the number of bits set in the intersection of the two hex fingerprints fp1 and fp2, or raise a ValueError if either string is a non-hex string

# chemfp.bitops.hex\_isvalid(s)

Return 1 if the string s is a valid hex fingerprint, otherwise 0

# chemfp.bitops.hex\_popcount(fp)

Return the number of bits set in a hex fingerprint fp, or -1 for non-hex strings

# chemfp.bitops.hex\_tanimoto(fp1, fp2)

Compute the Tanimoto similarity between two hex fingerprints. Return a float between 0.0 and 1.0, or raise a ValueError if either string is not a hex fingerprint

# chemfp.bitops.hex\_tversky(fp1, fp2, alpha=1.0, beta=1.0)

Compute the Tversky index between two hex fingerprints. Return a float between 0.0 and 1.0, or raise a ValueError if either string is not a hex fingerprint

### chemfp.bitops.hex\_to\_bitlist(bitlist)

Return a sorted list of the on-bit positions in the hex fingerprint

### chemfp.bitops.hex\_union(fp1, fp2)

Return the union of the two hex strings,  $fp1 \mid fp2$ . Raises a ValueError for non-hex fingerprints.

#### chemfp.bitops.hex\_encode(s)

Encode the byte string or ASCII string to hex. Returns a text string.

# chemfp.bitops.hex encode as bytes(s)

Encode the byte string or ASCII string to hex. Returns a byte string.

# chemfp.bitops.hex\_decode(s)

Decode the hex-encoded value to a byte string

# 8.6 chemfp.encodings

Decode different fingerprint representations into chemfp form. (Currently only decoders are available. Future released may include encoders.)

The chemfp fingerprints are stored as byte strings, with the bytes in least-significant bit order (bit #0 is stored in the first/left-most byte) and with the bits in most-significant bit order (bit #0 is stored in the first/right-most bit of the first byte).

#### Other systems use different encodings. These include:

- the '0 and '1' characters, as in '00111101'
- hex encoding, like '3d'
- base64 encoding, like 'SGVsbG8h'

• CACTVS's variation of base64 encoding

plus variations of different LSB and MSB orders.

This module decodes most of the fingerprint encodings I have come across. The fingerprint decoders return a 2-ple of the bit length and the chemfp fingerprint. The bit length is None unless the bit length is known exactly, which currently is only the case for the binary and CACTVS fingerprints. (The hex and other encoders must round the fingerprints up to a multiple of 8 bits.)

# 8.6.1 from\_binary\_lsb

```
chemfp.encodings.from_binary_lsb(text)
```

Convert a string like '00010101' (bit 0 here is off) into 'xa8'

The encoding characters '0' and '1' are in LSB order, so bit 0 is the left-most field. The result is a 2-ple of the fingerprint length and the decoded chemfp fingerprint

```
>>> from_binary_lsb('00010101')
(8, b'\xa8')
>>> from_binary_lsb('11101')
(5, b'\x17')
>>> from_binary_lsb('000000000000000000000)
(29, b'\x00\x80\x00\x00')
>>>
```

# 8.6.2 from\_binary\_msb

chemfp.encodings.from\_binary\_msb(text)

Convert a string like '10101000' (bit 0 here is off) into 'xa8'

The encoding characters '0' and '1' are in MSB order, so bit 0 is the right-most field.

```
>>> from_binary_msb(b'10101000')
(8, b'\xa8')
>>> from_binary_msb(b'00010101')
(8, b'\x15')
>>> from_binary_msb(b'00111')
(5, b'\x07')
>>> from_binary_msb(b'0000000000000000000)
(29, b'\x00\x80\x00\x00')
>>>
```

# 8.6.3 from\_base64

chemfp.encodings.from\_base64(text)

Decode a base64 encoded fingerprint string

The encoded fingerprint must be in chemfp form, with the bytes in LSB order and the bits in MSB order.

```
>>> from_base64("SGk=")
(None, b'Hi')
>>> from binascii import hexlify
```

(continues on next page)

(continued from previous page)

```
>>> hexlify(from_base64("SGk=")[1])
b'4869'
>>>
```

# 8.6.4 from\_hex

chemfp.encodings.from\_hex(text)

Decode a hex encoded fingerprint string

The encoded fingerprint must be in chemfp form, with the bytes in LSB order and the bits in MSB order.

```
>>> from_hex(b'10f2')
(None, b'\x10\xf2')
>>>
```

Raises a ValueError if the hex string is not a multiple of 2 bytes long or if it contains a non-hex character.

# 8.6.5 from\_hex\_msb

chemfp.encodings.from\_hex\_msb(text)

Decode a hex encoded fingerprint string where the bits and bytes are in MSB order

```
>>> from_hex_msb(b'10f2')
(None, b'\xf2\x10')
>>>
```

Raises a ValueError if the hex string is not a multiple of 2 bytes long or if it contains a non-hex character.

# 8.6.6 from\_hex\_lsb

chemfp.encodings.from\_hex\_lsb(text)

Decode a hex encoded fingerprint string where the bits and bytes are in LSB order

```
>>> from_hex_lsb(b'102f')
(None, b'\x08\xf4')
>>>
```

Raises a ValueError if the hex string is not a multiple of 2 bytes long or if it contains a non-hex character.

# 8.6.7 from\_cactvs

chemfp.encodings.from\_cactvs(text)

Decode a 881-bit CACTVS-encoded fingerprint used by PubChem

For format details, see ftp://ftp.ncbi.nlm.nih.gov/pubchem/specifications/pubchem\_fingerprints.

txt

## 8.6.8 from\_daylight

chemfp.encodings.from\_daylight(text)
Decode a Daylight ASCII fingerprint

```
>>> from_daylight(b"I5Z2MLZgOKRcR...1")
(None, b'PyDaylight')
```

See the implementation for format details.

## 8.6.9 from\_on\_bit\_positions

chemfp.encodings.from\_on\_bit\_positions(text, num\_bits=1024, separator="")

Decode from a list of integers describing the location of the on bits

```
>>> from_on_bit_positions("1 4 9 63", num_bits=32)
(32, b'\x12\x02\x00\x80')
>>> from_on_bit_positions("1,4,9,63", num_bits=64, separator=",")
(64, b'\x12\x02\x00\x00\x00\x00\x00\x80')
```

The text contains a sequence of non-negative integer values separated by the *separator* text. Bit positions are folded modulo num bits.

This is often used to convert sparse fingerprints into a dense fingerprint.

Note: if you have a list of bit position as integer values then you probably want to use  $chemfp.bitops.byte\_from\_bitlist()$ .

# 8.7 chemfp.fps\_io module

This module is part of the private API. Do not import it directly.

The function <code>chemfp.open()</code> returns an FPSReader if the source is an FPS file. The function <code>chemfp.open\_fingerprint\_writer()</code> returns an FPSWriter if the destination is an FPS file.

## 8.7.1 FPSReader

### class chemfp.fps\_io.FPSReader

FPS file reader

This class implements the *chemfp.FingerprintReader* API. It is also its own a context manager, which automatically closes the file when the manager exists.

The public attributes are:

#### metadata

a chemfp. Metadata instance with information about the fingerprint type

#### location

a chemfp.io.Location instance with parser location and state information

#### closed

True if the file is open, else False

The FPSReader.location only tracks the "lineno" variable.

```
__iter__()
```

Iterate through the (id, fp) pairs

```
iter_arenas(arena_size=1000)
```

iterate through arena\_size fingerprints at a time, as subarenas

Iterate through arena\_size fingerprints at a time, returned as chemfp.arena.FingerprintArena instances. The arenas are in input order and not reordered by popcount.

This method helps trade off between performance and memory use. Working with arenas is often faster than processing one fingerprint at a time, but if the file is very large then you might run out of memory, or get bored while waiting to process all of the fingerprint before getting the first answer.

If  $arena\_size$  is None then this makes an iterator which returns a single arena containing all of the fingerprints.

Parameters arena\_size (positive integer, or None) - The number of fingerprints to put into each arena.

**Returns** an iterator of *chemfp.arena.FingerprintArena* instances

```
save(destination, format=None, level=None)
```

Save the fingerprints to a given destination and format

The output format is based on the *format*. If the format is None then the format depends on the *destination* file extension. If the extension isn't recognized then the fingerprints will be saved in "fps" format.

If the output format is "fps", "fps.gz", or "fps.zst" then *destination* may be a filename, a file object, or None; None writes to stdout.

If the output format is "fpb" then *destination* must be a filename or seekable file object. Chemfp cannot save to compressed FPB files.

#### **Parameters**

- destination (a filename, file object, or None) the output destination
- format (None, "fps", "fps.gz", "fps.zst", or "fpb") the output format

• level (an integer, or "min", "default", or "max" for compressor-specific values) - compression level when writing .gz or .zst files

#### Returns None

### get\_fingerprint\_type()

Get the fingerprint type object based on the metadata's type field

This uses self.metadata.type to get the fingerprint type string then calls chemfp.  $get\_fingerprint\_type()$  to get and return a chemfp.types.FingerprintType instance.

This will raise a TypeError if there is no metadata, and a ValueError if the type field was invalid or the fingerprint type isn't available.

### Returns a chemfp.types.FingerprintType

### close()

Close the file

### count\_tanimoto\_hits\_fp(query\_fp, threshold=0.7)

Count the fingerprints which are sufficiently similar to the query fingerprint

Return the number of fingerprints in the reader which are at least threshold similar to the query fingerprint  $query\_fp$ .

### **Parameters**

- query\_fp (byte string) query fingerprint
- threshold (float between 0.0 and 1.0, inclusive) minimum similarity threshold (default: 0.7)

## Returns integer count

### count tanimoto hits arena(queries, threshold=0.7)

Count the fingerprints which are sufficiently similar to each query fingerprint

Returns a list containing a count for each query fingerprint in the *queries* arena. The count is the number of fingerprints in the reader which are at least *threshold* similar to the query fingerprint.

The order of results is the same as the order of the queries.

### Parameters

- queries (a FingerprintArena) query fingerprints
- threshold (float between 0.0 and 1.0, inclusive) minimum similarity threshold (default: 0.7)

**Returns** list of integer counts, one for each query

## count\_tversky\_hits\_fp(query\_fp, threshold=0.7, alpha=1.0, beta=1.0)

Count the fingerprints which are sufficiently similar to the query fingerprint

Return the number of fingerprints in the reader which are at least *threshold* similar to the query fingerprint *query* fp.

#### **Parameters**

- query\_fp (byte string) query fingerprint
- threshold (float between 0.0 and 1.0, inclusive) minimum similarity threshold (default: 0.7)

Returns integer count

#### threshold\_tanimoto\_search\_fp(query\_fp, threshold=0.7)

Find the fingerprints which are sufficiently similar to the query fingerprint

Find all of the fingerprints in this reader which are at least *threshold* similar to the query fingerprint *query\_fp*. The hits are returned as a *SearchResult*, in arbitrary order.

#### **Parameters**

- query\_fp (byte string) query fingerprint
- threshold (float between 0.0 and 1.0, inclusive) minimum similarity threshold (default: 0.7)

Returns a SearchResult

### threshold\_tanimoto\_search\_arena(queries, threshold=0.7)

Find the fingerprints which are sufficiently similar to each of the query fingerprints

For each fingerprint in the *queries* arena, find all of the fingerprints in this arena which are at least *threshold* similar. The hits are returned as a *SearchResults*, where the hits in each *SearchResult* is in arbitrary order.

#### **Parameters**

- queries (a FingerprintArena) query fingerprints
- threshold (float between 0.0 and 1.0, inclusive) minimum similarity threshold (default: 0.7)

Returns a SearchResults

## $\verb|threshold_tversky_search_fp| (query\_fp, threshold=0.7, alpha=1.0, beta=1.0)|$

Find the fingerprints which are sufficiently similar to the query fingerprint

Find all of the fingerprints in this reader which are at least *threshold* similar to the query fingerprint *query\_fp*. The hits are returned as a *SearchResult*, in arbitrary order.

### **Parameters**

- query\_fp (byte string) query fingerprint
- threshold (float between 0.0 and 1.0, inclusive) minimum similarity threshold (default: 0.7)

Returns a SearchResult

## $\verb|knearest_tanimoto_search_fp| (\textit{query\_fp}, \textit{k=3}, \textit{threshold=0.7})$

Find the k-nearest fingerprints which are sufficiently similar to the query fingerprint

Find all of the fingerprints in this reader which are at least threshold similar to the query fingerprint, and of those, select the top k hits. The hits are returned as a SearchResult, sorted from highest score to lowest.

### **Parameters**

- queries (a FingerprintArena) query fingerprints
- threshold (float between 0.0 and 1.0, inclusive) minimum similarity threshold (default: 0.7)

Returns a SearchResult

## $knearest_tanimoto_search_arena(queries, k=3, threshold=0.7)$

Find the k-nearest fingerprints which are sufficiently similar to each of the query fingerprints

For each fingerprint in the *queries* arena, find the fingerprints in this reader which are at least threshold similar to the query fingerprint, and of those, select the top k hits. The hits are returned as a SearchResults, where the hits in each SearchResult are sorted by similarity score.

#### **Parameters**

- queries (a FingerprintArena) query fingerprints
- threshold (float between 0.0 and 1.0, inclusive) minimum similarity threshold (default: 0.7)

Returns a SearchResults

knearest\_tversky\_search\_fp(query\_fp, k=3, threshold=0.7, alpha=1.0, beta=1.0)

Find the k-nearest fingerprints which are sufficiently similar to the query fingerprint

Find all of the fingerprints in this reader which are at least threshold similar to the query fingerprint, and of those, select the top k hits. The hits are returned as a SearchResult, sorted from highest score to lowest.

#### **Parameters**

- queries (a FingerprintArena) query fingerprints
- threshold (float between 0.0 and 1.0, inclusive) minimum similarity threshold (default: 0.7)

Returns a SearchResult

## 8.7.2 FPSWriter

class chemfp.fps\_io.FPSWriter

Write fingerprints in FPS format.

This is a subclass of chemfp.FingerprintWriter.

Instances have the following attributes:

- metadata a chemfp. Metadata instance
- format the string 'fps'
- closed False when the file is open, else True
- location a chemfp. io. Location instance

An FPSWriter is its own context manager, and will close the output file on context exit.

The Location instance supports the "recno", "output\_recno", and "lineno" properties.

### write\_fingerprint(id, fp)

Write a single fingerprint record with the given id and fp

### **Parameters**

- id (string) the record identifier
- fp (bytes) the fingerprint

write\_fingerprints(id\_fp\_pairs)

Write a sequence of fingerprint records

Parameters id\_fp\_pairs - An iterable of (id, fingerprint) pairs.

```
close()
```

Close the writer

This will set self.closed to False.

# 8.8 chemfp.fpb\_io module

This module is part of the private API. Do not import directly.

The function <code>chemfp.open\_fingerprint\_writer()</code> returns an OrderedFPBWriter if the destination is an FPB file and <code>reorder</code> is True, or an InputOrderFPBWriter if <code>reorder</code> is False.

### 8.8.1 OrderedFPBWriter

```
class chemfp.fpb_io.OrderedFPBWriter
```

Fingerprint writer for FPB files where the input fingerprint order is preserved

This is a subclass of chemfp.FingerprintWriter.

Instances have the following public attributes:

#### metadata

a chemfp.Metadata instance

#### format

the string 'fpb'

#### closed

False when the file is open, else True

Other attributes (like "alignment", "include\_hash", "include\_popc", "max\_spool\_size", and "tmpdir") are undocumented and subject to change in the future. Let me know if they are useful.

An OrderedFPBWriter is also is own context manager, and will close the writer on context exit.

#### write\_fingerprint(id, fp)

Write a single fingerprint record with the given id and fp to the destination

## Parameters

- id (string) the record identifier
- fp (bytes) the fingerprint

### write\_fingerprints(id\_fp\_iter)

Write a sequence of (id, fingerprint) pairs to the destination

Parameters id\_fp\_pairs - An iterable of (id, fingerprint) pairs.

close()

Close the output writer

### 8.8.2 InputOrderFPBWriter

class chemfp.fpb\_io.InputOrderFPBWriter

Fingerprint writer for FPB files which preserves the input fingerprint order

This is a subclass of chemfp.FingerprintWriter.

Instances have the following public attributes:

#### metadata

```
a chemfp. Metadata instance
```

#### format

the string 'fpb'

#### closed

False when the file is open, else True

Other attributes (like "alignment", "include\_hash", "include\_popc", "max\_spool\_size", and "tmpdir") are undocumented and subject to change in the future. Let me know if they are useful.

An InputOrderFPBWriter is also is own context manager, and will close the writer on context exit.

## write\_fingerprint(id, fp)

Write a single fingerprint record with the given id and fp to the destination

#### **Parameters**

- id (string) the record identifier
- fp (bytes) the fingerprint

### write\_fingerprints(id\_fp\_iter)

Write a sequence of (id, fingerprint) pairs to the destination

Parameters id\_fp\_pairs - An iterable of (id, fingerprint) pairs.

### close()

Close the output writer

This will set self.closed to False

# 8.9 chemfp toolkit API

Open Babel, OEChem and RDKit have different ways to read and write molecules. The chemfp toolkit API is a common wrapper API for structure I/O. The chemfp functions work with native toolkit molecules; chemfp does not have a common molecule API. (For that, use Cinfony.)

While the API is the same across <code>openbabel\_toolkit</code>, <code>openbabel\_toolkit</code>, <code>rdkit\_toolkit</code>, and the <code>text\_toolkit</code>, there are some differences in how they work. For example, each of the toolkits has it own set of reader and writer arguments. The details are available in the documentation, and this chapter acts as a pointer to the specific toolkit documentation.

### 8.9.1 name

```
chemfp.toolkit.name
The string "openbabel", "openeye", "rdkit", or "text".
[openbabel toolkit] [openeye toolkit] [rdkit toolkit] [text toolkit]
```

## 8.9.2 software

```
chemfp.toolkit.software
```

A string like "OpenBabel/2.4.1", "OEChem/20170208", "RDKit/2016.09.3" or "chemfp/3.1".

[openbabel\_toolkit] [openeye\_toolkit] [rdkit\_toolkit] [text\_toolkit]

# 8.10 is\_licensed

```
chemfp.toolkit.is_licensed()
```

[openbabel\_toolkit] [openeye\_toolkit] [rdkit\_toolkit] [text\_toolkit]

Check if the toolkit is licensed.

# 8.11 get\_formats

```
chemfp.toolkit.get_formats(include_unavailable=False)
```

[openbabel\_toolkit] [openeye\_toolkit] [rdkit\_toolkit] [text\_toolkit]

Return a list of structure formats.

# 8.12 get\_input\_formats

```
chemfp.toolkit.get_input_formats()
```

[openbabel\_toolkit] [openeye\_toolkit] [rdkit\_toolkit] [text\_toolkit]

Return a list of input structure formats.

# 8.13 get\_output\_formats

```
chemfp.toolkit.get_output_formats()
```

[openbabel\_toolkit] [openeye\_toolkit] [rdkit\_toolkit] [text\_toolkit]

Return a list of output structure formats.

# 8.14 get\_format

```
chemfp.toolkit.get format(format)
```

[openbabel\_toolkit] [openeye\_toolkit] [rdkit\_toolkit] [text\_toolkit]

Get a named format.

# 8.15 get\_input\_format

```
chemfp.toolkit.get_input_format(format)
[openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit]
Get a named input format.
```

# 8.16 get\_output\_format

```
chemfp.toolkit.get_output_format(format)
[openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit]
Get a named output format.
```

# 8.17 get\_input\_format\_from\_source

```
chemfp.toolkit.get_input_format_from_source(source=None, format=None)
[openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit]
Get an format given an input source.
```

# 8.18 get\_output\_format\_from\_destination

```
chemfp.toolkit.get_output_format_from_destination(destination=None, format=None)
[openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit]
Get an format given an output destination.
```

# 8.19 read\_molecules

```
\label{local_control_control} $$ \chemfp.toolkit.read_molecules (source=None, format=None, id_tag=None, reader_args=None, errors="strict", location=None") $$ [openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit] $$ Read molecules from a structure file.
```

# 8.20 read\_molecules\_from\_string

```
\label{localized_molecules_from_string} (content, format, id\_tag=None, reader\_args=None, errors="strict", location=None) \\ [openbabel\_toolkit] [openeye\_toolkit] [rdkit\_toolkit] [text\_toolkit] \\ [Read molecules from structure data stored in a string. ]
```

# 8.21 read\_ids\_and\_molecules

```
\label{lem:chemfp:toolkit:read_ids_and_molecules} (source=None, & format=None, & id\_tag=None, \\ reader\_args=None, & errors="strict", location=None) \\
```

[openbabel\_toolkit] [openeye\_toolkit] [rdkit\_toolkit] [text\_toolkit]

Read ids and molecules from a structure file.

# 8.22 read\_ids\_and\_molecules\_from\_string

```
[openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit]
```

Read ids and molecules from structure data stored in a string.

# 8.23 make\_id\_and\_molecule\_parser

```
\label{local_continuous_chemfp_toolkit.make_id_and_molecule_parser} (format, id\_tag=None, reader\_args=None, errors="strict")
```

```
[openbabel\_toolkit] \ [openeye\_toolkit] \ [rdkit\_toolkit] \ [text\_toolkit]
```

Make a specialized function which returns the id and molecule given a structure record.

# 8.24 parse\_molecule

```
\label{lem:chemfp:toolkit.parse_molecule} {\it content, format, id\_tag=None, reader\_args=None, errors="strict"}) \\
```

```
[openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit]
```

Parse a structure record into a molecule.

# 8.25 parse\_id\_and\_molecule

```
\label{lem:chemfp:toolkit.parse_id_and_molecule} (content,\ format,\ id\_tag=None,\ reader\_args=None,\ errors="strict")
```

```
[openbabel\_toolkit] \ [openeye\_toolkit] \ [rdkit\_toolkit] \ [text\_toolkit]
```

Parse a structure record into an id and molecule.

# 8.26 create\_string

chemfp.toolkit.create\_string(mol, format, id=None, writer\_args=None, errors="strict")

```
[openbabel toolkit] [openeye toolkit] [rdkit toolkit] [text toolkit]
```

Convert a molecule into a Unicode string containg a structure record.

# 8.27 create\_bytes

```
 \begin{tabular}{ll} $chemfp.toolkit.create\_bytes (mol, format, id=None, writer\_args=None, errors="strict") \\ [openbabel\_toolkit] [openeye\_toolkit] [rdkit\_toolkit] [text\_toolkit] \\ \end{tabular}
```

Convert a molecule into a byte string containing a structure record.

# 8.28 open\_molecule\_writer

```
\label{lem:chemfp:toolkit.open_molecule_writer} (\textit{destination} = None, \; \textit{format} = None, \; \textit{writer\_args} = None, \; \textit{errors} = "\textit{strict"}, \; \textit{location} = None)
```

```
[openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit]
```

Create an output molecule writer, for writing to a file.

# 8.29 open\_molecule\_writer\_to\_string

```
\label{location} {\tt chemfp.toolkit.open\_molecule\_writer\_to\_string} (format, writer\_args=None, errors="strict", location=None)
```

```
[openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit]
```

Create an output molecule writer, for writing to a Unicode string.

# 8.30 open\_molecule\_writer\_to\_bytes

```
\label{localization}  \mbox{chemfp.toolkit.open\_molecule\_writer\_to\_bytes} (format, \ writer\_args=None, \ errors="strict", \ location=None)
```

```
[openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit]
```

Create an output molecule writer, for writing to a byte string.

# 8.31 copy\_molecule

```
chemfp.toolkit.copy_molecule(mol)
[openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit]
Make a copy of a toolkit molecule.
```

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# 8.32 add\_tag

```
chemfp.toolkit.add_tag(mol, tag, value)
[openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit]
Add an SD tag to the molecule.
```

# 8.33 get\_tag

```
chemfp.toolkit.get_tag(mol, tag)
[openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit]
Get an SD tag for a molecule.
```

# 8.34 get\_tag\_pairs

```
chemfp.toolkit.get_tag_pairs()
[openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit]
Get the list of tag name and tag value pairs.
```

# 8.35 get\_id

```
chemfp.toolkit.get_id(mol)
[openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit]
Get the molecule id.
```

# 8.36 set\_id

```
chemfp.toolkit.set_id(mol, id)
[openbabel_toolkit] [openeye_toolkit] [rdkit_toolkit] [text_toolkit]
Set the molecule id.
```

# 8.37 chemfp.base\_toolkit

The chemfp.base\_toolkit module contains a few objects which are shared by the different toolkit. There should be no reason for you to import the module yourself.

## 8.37.1 molecule I/O file metadata

The metadata attribute of the toolkit readers and writers is a FormatMetadata instance. It contains information about the structure file.

Note that this is **not** the same as the fingerprint *chemfp.Metadata* instance, which contains information about the fingerprint file.

### 8.37.2 FormatMetadata

### class chemfp.base\_toolkit.FormatMetadata

Information about the reader or writer

The public attributes are:

#### filename

the source or destination filename, the string "<string>" for string-based I/O, or None if not known

### record\_format

the normalized record format name. All SMILES formats are "smi", and this does not contain compression information

#### args

the final reader\_args or writer\_args, after all processing, and as used by the reader and writer

#### \_\_repr\_\_()

Return a string like 'FormatMeta(filename="cmpds.sdf.gz", record\_format="sdf", args={})'

## 8.38 Toolkit readers

The toolkit readers read from structure files. There are several different variations, depending on the function used to read the file. All of the readers are subclasses of <code>chemfp.base\_toolkit.BaseMoleculeReader</code>.

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Function	Returned reader
$chemfp.toolkit.read\_molecules()$	chemfp.base_toolkit.
	MoleculeReader
$chemfp.toolkit.read\_molecules\_from\_string()$	$chemfp.base\_toolkit.$
	MoleculeReader
$chemfp.toolkit.read\_ids\_and\_molecules()$	$chemfp.base\_toolkit.$
	IdAndMoleculeReader
$chemfp.toolkit.read\_ids\_and\_molecules\_from\_string()$	${\it chemfp.base\_toolkit.}$
	${\it IdAndMoleculeReader}$
${\it chemfp.text\_toolkit.read\_sdf\_records()}$	$chemfp.base\_toolkit.RecordReader$
${\it chemfp.text\_toolkit.read\_sdf\_records\_from\_string()}$	$chemfp.base\_toolkit.RecordReader$
${\it chemfp.text\_toolkit.read\_sdf\_ids\_and\_records()}$	chemfp.base_toolkit.
	IdAndRecordReader
$chemfp.text\_toolkit.read\_sdf\_ids\_and\_records\_from\_structure and and and and an advantage and a substitution of the substitut$	r <b>ċhg</b> m <b>j</b> p.base_toolkit.
	IdAndRecordReader
$chemfp.text\_toolkit.read\_sdf\_ids\_and\_values()$	${\it chemfp.base\_toolkit.}$
	IdAndRecordReader
$chemfp.text\_toolkit.read\_sdf\_ids\_and\_values\_from\_stron_str$	ri <b>ng∉n</b> fp.base_toolkit.
	IdAndRecordReader

All of the readers have the same API. The major difference is that some readers return a single object during iteration while the others (those with an "And" in the name) return a pair of objects.

## 8.38.1 BaseMoleculeReader

## class chemfp.base\_toolkit.BaseMoleculeReader

Base class for the toolkit readers

The public attributes are:

#### metadata

a chemfp.base\_toolkit.FormatMetadata instance

## location

a chemfp.io.Location instance

### closed

False if the reader is open, otherwise True

Readers are iterators, so iter(reader) returns itself. next(reader) returns either a single object or a pair of objects depending on reader.

Readers are also a context manager, and call self.close() during exit.

## close()

Close the reader

If the reader wasn't previously closed then close it. This will set the location properties to their final values, close any files that the reader may have opened, and set self.closed to False.

## class chemfp.base\_toolkit.MoleculeReader

Read structures from a file and iterate over the toolkit molecules

The public attributes are:

### metadata

a chemfp.base\_toolkit.FormatMetadata instance

```
a chemfp.io.Location instance
     closed
          False if the reader is open, otherwise True
     Note: the toolkit implementation is free to reuse a molecule instead of returning a new one each time.
class chemfp.base_toolkit.IdAndMoleculeReader
     Read structures from a file and iterate over the (id, toolkit molecule) pairs
     The public attributes are:
     metadata
          a chemfp.base_toolkit.FormatMetadata instance
     location
          a chemfp.io.Location instance
     closed
          False if the reader is open, otherwise True
     Note: the toolkit implementation is free to reuse a molecule instead of returning a new one each time.
class chemfp.base_toolkit.RecordReader
     Read and iterate over records as strings
     The public attributes are:
     metadata
          a chemfp.base_toolkit.FormatMetadata instance
     location
          a chemfp.io.Location instance
     closed
          False if the reader is open, otherwise True
class chemfp.base_toolkit.IdAndRecordReader
     Read records from file and iterate over the (id, record string) pairs
     The public attributes are:
     metadata
          a chemfp.base_toolkit.FormatMetadata instance
     location
          a chemfp.io.Location instance
     closed
          False if the reader is open, otherwise True
```

## 8.39 Toolkit writers

location

The chemfp.open\_molecule\_writer() function returns a chemfp.base\_toolkit.MoleculeWriter, and chemfp.open\_molecule\_writer\_to\_string() returns a chemfp.base\_toolkit.MoleculeStringWriter. The two classes implement the chemfp.base\_toolkit.BaseMoleculeWriter API, and MoleculeWriter-ToString also implements getvalue().

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## 8.39.1 BaseMoleculeWriter

### class chemfp.base\_toolkit.BaseMoleculeWriter

The base molecule writer API, implemented by MoleculeWriter and MoleculeStringWriter

The public attributes are:

#### metadata

a chemfp.base\_toolkit.FormatMetadata instance

#### location

a chemfp.io.Location instance

#### closed

False if the reader is open, otherwise True

The writer is a context manager, which calls self.close() when the manager exits.

#### write molecule (mol)

Write a toolkit molecule

Parameters mol (a toolkit molecule) - the molecule to write

#### write\_molecules(mols)

Write a sequence of molecules

Parameters mols (a toolkit molecule iterator) - the molecules to write

### write\_id\_and\_molecule(id, mol)

Write an identifier and toolkit molecule

If id is None then the output uses the molecule's own id/title. Specifying the id may modify the molecule's id/title, depending on the format and toolkit.

#### **Parameters**

- id (string, or None) the identifier to use for the molecule
- mol (a toolkit molecule) the molecule to write

#### write ids and molecules (ids and mols)

Write a sequence of (id, molecule) pairs

This function works well with <code>chemfp.toolkit.read\_ids\_and\_molecules()</code>, for example, to convert an SD file to SMILES file, and use an alternate <code>id\_tag</code> to specify an alternative identifier.

Parameters mols (a (id string, toolkit molecule) iterator) - the molecules to write

#### close()

Close the writer

If the reader wasn't previously closed then close it. This will set the location properties to their final values, close any files that the writer may have opened, and set self.closed to False.

### class chemfp.base\_toolkit.MoleculeWriter

A BaseMoleculeWriter which writes molecules to a file.

The public attributetes are:

#### metadata

a chemfp.base\_toolkit.FormatMetadata instance

```
location
          a chemfp.io.Location instance
     closed
          False if the reader is open, otherwise True
     The writer is a context manager, which calls self.close() when the manager exits.
class chemfp.base_toolkit.MoleculeStringWriter
          A BaseMoleculeWriter which writes molecules to a string.
          This class implements the chemfp.base_toolkit.BaseMoleculeWriter API.
          metadata
              a chemfp.base_toolkit.FormatMetadata instance
          location
              a chemfp.io.Location instance
          closed
              False if the reader is open, otherwise True
          The writer is a context manager, which calls self.close() when the manager exits.
     getvalue()
          Get the string containing all of the written record.
          This function can also be called after the writer is closed.
              Returns a string
8.39.2 Format
class chemfp.base_toolkit.Format
          Information about a toolkit format.
          Use chemfp.toolkit.get_format() and related functions to return a Format instance.
          The public properties are:
     __repr__()
          Return a string like 'Format("openeye/sdf.gz")'
     prefix
          Read-only attribute.
          Return the prefix to turn an unqualified parameter into a fully qualified parameter
              Returns a string like "rdkit.smi" or "openbabel.sdf"
     is_input_format
          Read-only attribute.
          Return True if this toolkit can read molecules in this format
     is_output_format
          Read-only attribute.
          Return True if this toolkit can write molecules in this format
     is_available
          Read-only attribute.
```

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Return True if this version of the toolkit understands this format

For example, if your version of RDKit does not support InChI then this would return False for the "inchi" and "inchikey" formats.

## supports\_io

Read-only attribute.

Return True if this format support reading or writing records

This will return False for formats like "smistring" and "inchikeystring" because those are not record-based formats.

Note: I don't like this name. I may change it to is\_record\_format. Let me know if you have ideas, or if changing the name will be a problem.

### get\_reader\_args\_from\_text\_settings(reader\_settings)

Process the reader\_settings and return the reader\_args for this format.

This function exists to help convert string settings, eg, from the command-line or a configuration, into usable  $reader\_args$ .

Setting names may be fully-qualified names like "rdkit.sdf.sanitize", partially qualified names like "rdkit.\*.sanitize" or "openeye.smi.delimiter", or unqualified names like "delimiter". The qualifiers act as a namespace so the settings can be specified without needing to know the actual toolkit or format.

The function turns the format-appropriate qualified names into unqualified ones and converts the string values into usable Python objects. For example:

Parameters reader\_settings (a dictionary with string keys and values) – the reader settings

**Returns** a dictionary of unqualified argument names as keys and processed Python values as values

### get\_writer\_args\_from\_text\_settings(writer\_settings)

Process writer\_settings and return the writer\_args for this format.

This function exists to help convert string settings, eg, from the command-line or a configuration, into usable  $writer\ args.$ 

Setting names may be fully-qualified names like "rdkit.sdf.kekulize", partially qualified names like "rdkit.\*.delimiter" or "openeye.smi.delimiter", or unqualified names like "delimiter". The qualifiers act as a namespace so the settings can be specified without needing to know the actual toolkit or format.

The function turns the format-appropriate qualified names into unqualified ones and converts the string values into usable Python objects. For example:

Parameters writer\_settings (a dictionary with string keys and values) - the writer settings

**Returns** a dictionary of unqualified argument names as keys and processed Python values as values

#### get\_default\_reader\_args()

Return a dictionary of the default reader arguments

The keys are unqualified (ie, without dots).

```
>>> from chemfp import openbabel_toolkit as T
>>> fmt = T.get_format("smi")
>>> fmt.get_default_reader_args()
{'has_header': False, 'delimiter': None, 'options': None}
```

Returns a dictionary of string keys and Python objects for values

## get\_default\_writer\_args()

Return a dictionary of the default writer arguments

The keys are unqualified (ie, without dots).

```
>>> from chemfp import openbabel_toolkit as T
>>> fmt = T.get_format("smi")
>>> fmt.get_default_writer_args()
{'explicit_hydrogens': False, 'isomeric': True, 'delimiter': None,
'options': None, 'canonicalization': 'default'}
```

**Returns** a dictionary of string keys and Python objects for values

## get\_unqualified\_reader\_args(reader\_args)

Convert possibly qualified reader args into unqualified reader args for this format

The *reader\_args* dictionary can be confusing because of the priority rules in how to resolve qualifiers, and because it can include irrelevant parameters, which are ignored.

The get\_unqualified\_reader\_args function applies the qualifier resolution algorithm and removes irrelevant parameters to return a dictionary containing the equivalent unqualified reader args dictionary for this format.

Parameters reader\_args reader arguments, which can contain qualified and unqualified arguments

**Returns** a dictionary of reader arguments, containing only unqualified arguments appropriate for this format.

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#### get\_unqualified\_writer\_args(writer\_args)

Convert possibly qualified writer args into unqualified writer args for this format

The *writer\_args* dictionary can be confusing because of the priority rules in how to resolve qualifiers, and because it can include irrelevant parameters, which are ignored.

The get\_unqualified\_writer\_args function applies the qualifier resolution algorithm and removes irrelevant parameters to return a dictionary containing the equivalent unqualified writer args dictionary for this format.

Parameters writer\_args writer arguments, which can contain qualified and unqualified arguments

**Returns** a dictionary of writer arguments, containing only unqualified arguments appropriate for this format.

# 8.40 chemfp.openbabel\_toolkit module

The chemfp toolkit layer for Open Babel.

#### 8.40.1 name

```
chemfp.openbabel_toolkit.name
The string "openbabel".
```

## 8.40.2 software

```
chemfp.openbabel_toolkit.software
```

A string like "OpenBabel/2.4.1", where the second part of the string comes from OBReleaseVersion.

## 8.40.3 is\_licensed (openbabel\_toolkit)

```
chemfp.openbabel_toolkit.is_licensed()
Return True - Open Babel is always licensed

Returns True
```

## 8.40.4 get\_formats (openbabel\_toolkit)

```
\verb|chemfp.openbabel_toolkit.get_formats| (include\_unavailable=False)|
```

Get the list of structure formats that Open Babel supports

If *include\_unavailable* is True then also include Open Babel formats which aren't available to this specific version of Open Babel.

Parameters include\_unavailable (True or False) - include unavailable formats?

Returns a list of chemfp.base\_toolkit.Format objects

## 8.40.5 get\_input\_formats (openbabel\_toolkit)

```
chemfp.openbabel_toolkit.get_input_formats()
```

Get the list of supported Open Babel input formats

Returns a list of chemfp.base\_toolkit.Format objects

## 8.40.6 get\_output\_formats (openbabel\_toolkit)

```
chemfp.openbabel_toolkit.get_output_formats()
```

Get the list of supported Open Babel output formats

Returns a list of chemfp.base\_toolkit.Format objects

## 8.40.7 get\_format (openbabel\_toolkit)

```
chemfp.openbabel_toolkit.get_format(format_name)
```

Get the named format, or raise a ValueError

This will raise a ValueError if Open Babel does not implement the format <u>format\_name</u> or that format is not available.

Parameters format\_name (a string) - the format name

Returns a chemfp.base\_toolkit.Format object

## 8.40.8 get\_input\_format (openbabel\_toolkit)

```
chemfp.openbabel_toolkit.get_input_format(format_name)
```

Get the named input format, or raise a ValueError

This will raise a ValueError if Open Babel does not implement the format <u>format\_name</u> or that format is not an input format.

Parameters format name (a string) - the format name

Returns a chemfp.base toolkit.Format object

## 8.40.9 get\_output\_format (openbabel\_toolkit)

chemfp.openbabel\_toolkit.get\_output\_format(format\_name)
Get the named format, or raise a ValueError

This will raise a ValueError if Open Babel does not implement the format <u>format\_name</u> or that format is not an output format.

Parameters format\_name (a string) - the format name

Returns a chemfp.base\_toolkit.Format object

## 8.40.10 get\_input\_format\_from\_source (openbabel\_toolkit)

chemfp.openbabel\_toolkit.get\_input\_format\_from\_source(source=None, mat=None) for-

Get the most appropriate format given the available source and format information

If format is a chemfp.base\_toolkit.Format then return it. If it's a Format-like object with "name" and "compression" attributes use it to make a real Format object with the same attributes. If it's a string then use it to create a Format object.

If format is None, use the source to auto-detect the format. If auto-detection is not possible, assume it's an uncompressed SMILES file.

#### **Parameters**

- source (a filename (as a string), a file object, or None to read from stdin) the structure data source.
- format (a Format(-like) object, string, or None) format information. if known.

Returns a chemfp.base toolkit.Format object

## 8.40.11 get\_output\_format\_from\_destination (openbabel\_toolkit)

 ${\tt chemfp.openbabel\_toolkit.get\_output\_format\_from\_destination} (\textit{destination} = None, \\ \textit{format} = None)$ 

Get the most appropriate format given the available destination and format information

If format is a chemfp.base\_toolkit.Format then return it. If it's a Format-like object with "name" and "compression" attributes use it to make a real Format object with the same attributes. If it's a string then use it to create a Format object.

If format is None, use the destination to auto-detect the format. If auto-detection is not possible, assume it's an uncompressed SMILES file.

### **Parameters**

- destination (a filename (as a string), a file object, or None to read from stdin) the structure data source.
- format (a Format(-like) object, string, or None) format information, if known.

Returns a chemfp.base\_toolkit.Format object

## 8.40.12 read\_molecules (openbabel\_toolkit)

```
 \begin{array}{c} \texttt{chemfp.openbabel\_toolkit.read\_molecules}(source=None, & format=None, \\ id\_tag=None, & reader\_args=None, & errors="strict", & location=None, & encoding="utf8", encoding\_errors="strict") \end{array}
```

Return an iterator that reads OBMol molecules from a structure file

Iterate through the *format* structure records in *source*. If *format* is None then auto-detect the format based on the *source*. For SD files, use  $id\_tag$  to get the record id from the given SD tag instead of the title line. (read\_molecules() will ignore the  $id\_tag$ . It exists to make it easier to switch between reader functions.)

Note: the reader will clear and reuse the OBMol instance. Make a copy if you want to keep the molecule around.

The reader\_args dictionary parameters depend on the format. Every Open Babel format supports an "options" entry, which is passed to SetOptions(). See that documentation for details. Some formats support additional parameters:

- SMILES and InChI
  - delimiter one of "tab", "space", "to-eol", the space or tab characters, or None
  - has header True or False
- SDF
  - implementation if "openbabel" or None, use the Open Babel record parser; if "chemfp", use chemfp's own record parser, which has better location tracking

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and goes to the next record, and "ignore" goes to the next record.

The *location* parameter takes a *chemfp.io.Location* instance. If None then a default Location will be created.

See chemfp.openbabel\_toolkit.read\_ids\_and\_molecules() if you want (id, OBMol) pairs instead of just the molecules.

#### **Parameters**

- source (a filename, file object, or None to read from stdin) the structure source
- format (a format name string, or Format object, or None to auto-detect) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.MoleculeReader iterating OBMol molecules

## 8.40.13 read\_molecules\_from\_string (openbabel\_toolkit)

```
chemfp.openbabel\_toolkit.read\_molecules\_from\_string(content, format, id\_tag=None, reader\_args=None, errors="strict", location=None) format, id\_tag=None, f
```

Return an iterator that reads OBMol molecules from a string containing structure records

content is a string containing 0 or more records in the format format. See chemfp. openbabel\_toolkit.read\_molecules() for details about the other parameters. See chemfp.openbabel\_toolkit.read\_ids\_and\_molecules\_from\_string() if you want to read (id, OBMol) pairs instead of just molecules.

Note: the reader will clear and reuse the OBMol instance. Make a copy if you want to keep the molecule around.

#### **Parameters**

- content (a string) the string containing structure records
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

 $\textbf{Returns} \ \ \textbf{a} \ \ \textit{chemfp.base\_toolkit.MoleculeReader} \ \ \textbf{iterating OBMol molecules}$ 

### 8.40.14 read\_ids\_and\_molecules (openbabel\_toolkit)

Return an iterator that reads (id, OBMol molecule) pairs from a structure file

See chemfp.openbabel\_toolkit.read\_molecules() for full parameter details. The major difference is that this returns an iterator of (id, OBMol) pairs instead of just the molecules.

Note: the reader will clear and reuse the OBMol instance. Make a copy if you want to keep the molecule around.

#### **Parameters**

- source (a filename, file object, or None to read from stdin) the structure source
- format (a format name string, or Format object, or None to auto-detect) the input structure format

- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

 $\begin{array}{lll} \textbf{Returns} & a & \textit{chemfp.base\_toolkit.IdAndMoleculeReader} & \text{iterating (id, OBMol)} \\ & \text{pairs} & \end{array}$ 

## 8.40.15 read\_ids\_and\_molecules\_from\_string (openbabel\_toolkit)

Return an iterator that reads (id, OBMol) pairs from a string containing structure records

content is a string containing 0 or more records in the format format. See chemfp. openbabel\_toolkit.read\_molecules() for details about the other parameters. See chemfp.openbabel\_toolkit.read\_molecules\_from\_string() if you just want to read the OBMol molecules instead of (id, OBMol) pairs.

Note: the reader will clear and reuse the OBMol instance. Make a copy if you want to keep the molecule around.

#### **Parameters**

- content (a string) the string containing structure records
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- $\bullet$   ${\tt location}$  (a  ${\it chemfp.io.Location}$  object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.IdAndMoleculeReader iterating (id, OBMol) pairs

## 8.40.16 make\_id\_and\_molecule\_parser (openbabel\_toolkit)

The returned function is optimized for reading many records from individual strings because it only does parameter validation once. The function will reuse the OBMol for successive calls, so make a copy if you want to keep it around. However, I haven't really noticed much of a performance difference between this and <code>chemfp.openbabel\_toolkit.parse\_id\_and\_molecule()</code> so I suggest you use that function directly instead of making a specialized function. (Let me know if making a specialized function is useful.)

See chemfp.openbabel\_toolkit.read\_molecules() for details about the other parameters.

#### **Parameters**

- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns a function of the form parser(record string) -> (id, OBMol)

## 8.40.17 parse\_molecule (openbabel\_toolkit)

Parse the first structure record from the content string and return an OBMol molecule.

content is a string containing a single structure record in format format. (Additional records are ignored). See chemfp.openbabel\_toolkit.read\_molecules() for details about the other parameters. See chemfp.openbabel\_toolkit.parse\_id\_and\_molecule() if you want the (id, OBMol) pair instead of just the molecule.

### Parameters

- content (a string) the string containing a structure record
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit.
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns an OBMol molecule

# 8.40.18 parse\_id\_and\_molecule (openbabel\_toolkit)

Parse the first structure record from *content* and return the (id, OBMol) pair.

content is a string containing a single structure record in format format. (Additional records are ignored). See <code>chemfp.openbabel\_toolkit.read\_molecules()</code> for details about the other parameters.

See chemfp.openbabel\_toolkit.read\_molecules() for details about the other parameters. See chemfp.openbabel\_toolkit.parse\_molecule() if just want the OBMol molecule and not the (id, OBMol) pair.

#### **Parameters**

- content (a string) the string containing a structure record
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns an (id, OBMol molecule) pair

## 8.40.19 create\_string (openbabel\_toolkit)

Convert an OBMol into a structure record in the given format as a Unicode string

If id is not None then use it instead of the molecule's own title. Warning: this may briefly modify the molecule, so may not be thread-safe.

#### **Parameters**

- mol (an Open Babel molecule) the molecule to use for the output
- format (a format name string, or Format object) the output structure format
- $\bullet$  id (a string, or None to use the molecule's own id) an alternate record id
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns a Unicode string

## 8.40.20 create\_bytes (openbabel\_toolkit)

```
chemfp.openbabel\_toolkit.create\_bytes(\mathit{mol}, \mathit{format}, \mathit{id}=None, \mathit{writer}\_\mathit{args}=None, \mathit{errors}="strict", \mathit{level}=None)
```

Convert an OBMol into a structure record in the given format as a byte string

If id is not None then use it instead of the molecule's own title. Warning: this may briefly modify the molecule, so may not be thread-safe.

#### **Parameters**

- mol (an Open Babel molecule) the molecule to use for the output
- format (a format name string, or Format object) the output structure format
- id (a string, or None to use the molecule's own id) an alternate record id
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- level (None, a positive integer, or one of the strings 'min', 'default', or 'max') compression level to use for compressed formats

**Returns** a byte string

## 8.40.21 open\_molecule\_writer (openbabel\_toolkit)

```
\label{location} {\tt chemfp.openbabel\_toolkit.open\_molecule\_writer} (destination=None, & format=None, \\ writer\_args=None, & errors="strict", \\ location=None, & encoding="utf8", \\ encoding\_errors="strict", \\ level=None) \\
```

Return a MoleculeWriter which can write Open Babel molecules to a destination.

A chemfp.base\_toolkit.MoleculeWriter has the methods write\_molecule, write\_molecules, and write\_ids\_and\_molecules, which are ways to write an OB-Mol molecule, an OBMol molecule iterator, or an (id, OBMol molecule) pair iterator to a file.

Molecules are written to *destination*. The output format can be a string like "sdf.gz" or "smi", a *chemfp.base\_toolkit.Format*, or Format-like object with "name" and "compression" attributes, or None to auto-detect based on the *destination*. If auto-detection is not possible, the output will be written as uncompressed SMILES.

The writer\_args dictionary parameters depend on the format. Every format supports an options entry, which is passed to Open Babel's SetOptions(). See the Open Babel documentation for details. Some formats supports additional parameters:

### • SMILES

- delimiter one of "tab", "space", "to-eol", the space or tab characters, or None
- isomeric True to write isomeric SMILES, False or default is non-isomeric

- canonicalization True, "default", or None uses Open Babel's own canonicalization algorithm; False or "none" to use no canonicalization; "universal" generates a universal SMILES; "anticanonical" generates a SMILES with randomly assigned atom classes; "inchified" uses InChI-fied SMILES
- InChI and InChIKey
  - delimiter one of "tab", "space", "to-eol", the space or tab characters, or None
  - include\_id True or default to include the id as the second column; False has no id column

#### • SDF

- always\_v3000 True to always write V3000 files; False or default to write V3000 files only if needed.
- include atom class True to include atom class; False or default does not
- include\_hcount True to include hcount; False or default does not

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and goes to the next record, and "ignore" goes to the next record.

The *location* parameter takes a *chemfp.io.Location* instance. If None then a default Location will be created.

#### **Parameters**

- destination (a filename, file object, or None to write to stdout) the structure destination
- format (a format name string, or Format(-like) object, or None to auto-detect) the output structure format
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track writer state information
- level (None, a positive integer, or one of the strings 'min', 'default', or 'max') compression level to use for compressed formats (does not affect Open Babel)

 $\begin{tabular}{lll} \bf Returns & a & {\it chemfp.base\_toolkit.MoleculeWriter} & {\it expecting} & {\it Open} & {\it Babel} \\ & {\it molecules} & \\ \end{tabular}$ 

## 8.40.22 open\_molecule\_writer\_to\_string (openbabel\_toolkit)

Return a MoleculeStringWriter which can write Open Babel molecule records to a string.

See chemfp.openbabel\_toolkit.open\_molecule\_writer() for full parameter details.

Use the writer's <code>chemfp.base\_toolkit.MoleculeStringWriter.getvalue()</code> to get the output as a Unicode string.

#### **Parameters**

- format (a format name string, or Format(-like) object, or None to auto-detect) the output structure format
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track writer state information

Returns a chemfp.base\_toolkit.MoleculeStringWriter expecting Open Babel molecules

## 8.40.23 open\_molecule\_writer\_to\_bytes (openbabel\_toolkit)

```
chemfp.openbabel\_toolkit.open\_molecule\_writer\_to\_bytes(format, writer\_args=None, errors="strict", location=None, level=None)
```

Return a MoleculeStringWriter which can write Open Babel molecule records to a byte string

See chemfp.openbabel\_toolkit.open\_molecule\_writer() for full parameter details.

Use the writer's <code>chemfp.base\_toolkit.MoleculeStringWriter.getvalue()</code> to get the output as a byte string.

#### **Parameters**

- format (a format name string, or Format(-like) object, or None to auto-detect) the output structure format
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track writer state information
- level (None, a positive integer, or one of the strings 'min', 'default', or 'max') compression level to use for compressed formats (does not affect Open Babel)

 $\textbf{Returns} \ \ a \ \textit{chemfp.base\_toolkit.MoleculeStringWriter} \ \text{expecting Open Babel} \\ \ \ \text{molecules}$ 

## 8.40.24 copy\_molecule (openbabel\_toolkit)

```
chemfp.openbabel_toolkit.copy_molecule(mol)
```

Return a new OBMol molecule which is a copy of the given Open Babel molecule

Parameters mol (an Open Babel molecule) - the molecule to copy

Returns a new OBMol instance

## 8.40.25 add\_tag (openbabel\_toolkit)

```
chemfp.openbabel_toolkit.add_tag(mol, tag, value)
Add an SD tag value to the Open Babel molecule
```

Raises a KeyError if the tag is a special internal Open Babel name.

#### **Parameters**

- mol (an Open Babel molecule) the molecule
- tag (string) the SD tag name
- value (string) the text for the tag

Returns None

## 8.40.26 get\_tag (openbabel\_toolkit)

```
chemfp.openbabel_toolkit.get_tag(mol, tag)
Get the named SD tag value, or None if it doesn't exist
```

### Parameters

- mol (an Open Babel molecule) the molecule
- tag (string) the SD tag name

Returns a string, or None

## 8.40.27 get\_tag\_pairs (openbabel\_toolkit)

```
chemfp.openbabel_toolkit.get_tag_pairs(mol)
Get a list of all SD tag (name, value) pairs for the molecule
```

Parameters mol (an Open Babel molecule) - the molecule

**Returns** a list of (string name, string value) pairs

## 8.40.28 get\_id (openbabel\_toolkit)

```
chemfp.openbabel_toolkit.get_id(mol)

Get the molecule's id using Open Babel's GetTitle()
```

Parameters mol (an Open Babel molecule) - the molecule

Returns a string

# 8.40.29 set\_id (openbabel\_toolkit)

```
chemfp.openbabel_toolkit.set_id(mol, id)
    Set the molecule's id using Open Babel's SetTitle()
```

#### Parameters

- mol (an Open Babel molecule) the molecule
- id (string) the new id

Returns None

# 8.41 chemfp.openeye\_toolkit module

The chemfp toolkit layer for OpenEye.

### 8.41.1 name

chemfp.openeye\_toolkit.name

The string "openeye".

## 8.41.2 software

chemfp.openeye\_toolkit.software

A string like "OEChem/20170208", where the second part of the string comes from OEChemGetVersion().

## 8.41.3 is\_licensed (openeye\_toolkit)

chemfp.openeye\_toolkit.is\_licensed()

Return True if the OEChem toolkit license is valid, otherwise False.

This does not check if the OEGraphSim license is valid. I haven't yet figured out how I want to handle that distinction. In the meanwhile you'll need to use the OEChem API yourself.

Returns True or False

## 8.41.4 get\_formats (openeye\_toolkit)

chemfp.openeye\_toolkit.get\_formats(include\_unavailable=False)

Get the list of structure formats that OEChem supports

If  $include\_unavailable$  is True then also include OEChem formats which aren't available to this specific version of OEChem.

Parameters include\_unavailable (True or False) – include unavailable formats?

Returns a list of chemfp.base\_toolkit.Format objects

## 8.41.5 get\_input\_formats (openeye\_toolkit)

```
chemfp.openeye_toolkit.get_input_formats()
```

Get the list of supported OEChem input formats

Returns a list of chemfp.base\_toolkit.Format objects

## 8.41.6 get\_output\_formats (openeye\_toolkit)

```
chemfp.openeye_toolkit.get_output_formats()
```

Get the list of supported OEChem output formats

Returns a list of chemfp.base\_toolkit.Format objects

## 8.41.7 get\_format (openeye\_toolkit)

```
chemfp.openeye_toolkit.get_format(format)
```

Get the named format, or raise a ValueError

This will raise a ValueError if OEChem does not implement the format <u>format\_name</u> or that format is not available.

Parameters format\_name (a string) - the format name

Returns a chemfp.base\_toolkit.Format object

## 8.41.8 get\_input\_format (openeye\_toolkit)

```
chemfp.openeye_toolkit.get_input_format(format)
```

Get the named input format, or raise a ValueError

This will raise a ValueError if OEChem does not implement the format <u>format\_name</u> or that format is not an input format.

Parameters format\_name (a string) - the format name

Returns a chemfp.base\_toolkit.Format object

## 8.41.9 get\_output\_format (openeye\_toolkit)

chemfp.openeye\_toolkit.get\_output\_format(format)

Get the named format, or raise a ValueError

This will raise a ValueError if OEChem does not implement the format <u>format\_name</u> or that format is not an output format.

Parameters format\_name (a string) - the format name

Returns a chemfp.base toolkit.Format object

## 8.41.10 get\_input\_format\_from\_source (openeye\_toolkit)

 $\begin{array}{c} \texttt{chemfp.openeye\_toolkit.get\_input\_format\_from\_source}(source = None, \\ mat = None) \end{array}$ 

Get the most appropriate format given the available source and format information

If format is a chemfp.base\_toolkit.Format then return it. If it's a Format-like object with "name" and "compression" attributes use it to make a real Format object with the same attributes. If it's a string then use it to create a Format object.

If format is None, use the source to auto-detect the format. If auto-detection is not possible, assume it's an uncompressed SMILES file.

### Parameters

- source (a filename (as a string), a file object, or None to read from stdin) the structure data source.
- format (a Format(-like) object, string, or None) format information. if known.

Returns a chemfp.base\_toolkit.Format object

for-

## 8.41.11 get\_output\_format\_from\_destination (openeye\_toolkit)

 $\label{lem:chemfp.openeye_toolkit.get_output_format_from_destination} (\textit{destination} = None, \\ \textit{format} = None)$ 

Get the most appropriate format given the available destination and format information

If format is a chemfp.base\_toolkit.Format then return it. If it's a Format-like object with "name" and "compression" attributes use it to make a real Format object with the same attributes. If it's a string then use it to create a Format object.

If format is None, use the destination to auto-detect the format. If auto-detection is not possible, assume it's an uncompressed SMILES file.

#### **Parameters**

- destination (a filename (as a string), a file object, or None to read from stdin) the structure data source.
- format (a Format(-like) object, string, or None) format information, if known.

Returns a chemfp.base\_toolkit.Format object

## 8.41.12 read\_molecules (openeye\_toolkit)

```
\label{lem:chemfp:openeye_toolkit:read_molecules} (source=None, \ format=None, \ id\_tag=None, \\ reader\_args=None, \ errors="strict", \ location=None, \ encoding="utf8", \ encoding="utf8", \ encoding="reader_args="strict")
```

Return an iterator that reads OEGraphMol molecules from a structure file

Iterate through the *format* structure records in *source*. If *format* is None then auto-detect the format based on the *source*. For SD files, use  $id\_tag$  to get the record id from the given SD tag instead of the title line. (read\_molecules() will ignore the  $id\_tag$ . It exists to make it easier to switch between reader functions.)

Note: the reader will clear and reuse the OEGraphMol instance. Make a copy if you want to keep the molecule around.

The reader\_args dictionary parameters depend on the format. Every OEChem format supports:

- aromaticity one of "default", "openeye", "daylight", "tripos", "mdl", "mmff", or None
- flavor a number, string-encoded number, or flavor string

A "flavor string" is a "|" or "," separated list of format-specific flavor terms. It can be a simple as "Default", or a more complex string like "Default|-ENDM|DELPHI" which for the PDB reader starts with the default settings, removes the ENDM flavor, and adds the CHARGE and RADIUS flavors.

The supported input flavor terms for each format are:

- SMILES Canon, Strict, Default
- sdf Default
- skc Default
- mol2, mol2h M2H, Default
- mmod FormalCrg, Default

- pdb ALL, ALTLOC, BondOrder, CHARGE, Connect, DATA, DELPHI, END, ENDM, FORMALCHARGE, FormalCrg, ImplicitH, RADIUS, Rings, SecStruct, TER, Ter-Mask, Default
- xyz BondOrder, Connect, FormalCrg, ImplicitH, Rings, Default
- cdx SuperAtoms, Default
- oeb Default

You can also pass in a numeric value like 123 or a numeric string like "0".

In addition, the SMILES record readers have limited support for the "delimiter" reader arg:

• delimiter - one of "tab", "space", "to-eol", the space or tab characters, or None

Note: the first whitespace after the SMILES string will always be treated as a delimiter.

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and goes to the next record, and "ignore" goes to the next record.

The *location* parameter takes a *chemfp.io.Location* instance. If None then a default Location will be created.

See chemfp.openeye\_toolkit.read\_ids\_and\_molecules() if you want (id, OEGraphMol) pairs instead of just the molecules.

#### **Parameters**

- source (a filename, file object, or None to read from stdin) the structure source
- format (a format name string, or Format object, or None to auto-detect) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader parameters passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.MoleculeReader iterating OEGraphMol molecules

## 8.41.13 read\_molecules\_from\_string (openeye\_toolkit)

```
\label{lem:chemfp:openeye_toolkit.read_molecules_from_string} (content, format, id\_tag=None, \\ reader\_args=None, \\ errors="strict", location=None) \\
```

Return an iterator that reads molecules from a string containing structure records

content is a string containing 0 or more records in the format format. See chemfp. openeye\_toolkit.read\_molecules() for details about the other parameters. See chemfp. openeye\_toolkit.read\_ids\_and\_molecules\_from\_string() if you want to read (id, OE-GraphMol) pairs instead of just molecules.

Note: the reader will clear and reuse the OEGraphMol instance. Make a copy if you want to keep the molecule around.

#### **Parameters**

- content (a string) the string containing structure records
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit.
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.MoleculeReader iterating OEGraphMol molecules

## 8.41.14 read\_ids\_and\_molecules (openeye\_toolkit)

Return an iterator that reads (id, OEGraphMol molecule) pairs from a structure file

See *chemfp.openeye\_toolkit.read\_molecules()* for full parameter details. The major difference is that this returns an iterator of (id, OEGraphMol) pairs instead of just the molecules.

Note: the reader will clear and reuse the OEGraphMol instance. Make a copy if you want to keep the molecule around.

### **Parameters**

- source (a filename, file object, or None to read from stdin) the structure source
- format (a format name string, or Format object, or None to auto-detect) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.IdAndMoleculeReader iterating (id, OE-GraphMol) pairs

### 8.41.15 read\_ids\_and\_molecules\_from\_string (openeye\_toolkit)

Return an iterator that reads (id, OEGraphMol) pairs from a string containing structure records

content is a string containing 0 or more records in the format format. See chemfp. openeye\_toolkit.read\_molecules() for details about the other parameters. See chemfp. openeye\_toolkit.read\_molecules\_from\_string() if you just want to read the OEGraph-Mol molecules instead of (id, OEGraphMol) pairs.

Note: the reader will clear and reuse the OEGraphMol instance. Make a copy if you want to keep the molecule around.

#### **Parameters**

- content (a string) the string containing structure records
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.IdAndMoleculeReader iterating (id, OE-GraphMol) pairs

### 8.41.16 make\_id\_and\_molecule\_parser (openeye\_toolkit)

```
\label{lem:chemfp:openeye_toolkit.make_id_and_molecule_parser} (format, & id\_tag=None, \\ reader\_args=None, & errors="strict") \\
```

Create a specialized function which takes a record and returns an (id, OEGraphMol) pair

The returned function is optimized for reading many records from individual strings because it only does parameter validation once. The function will reuse the OEGraphMol for successive calls, so make a copy if you want to keep it around. However, I haven't really noticed much of a performance difference between this and <code>chemfp.openeye\_toolkit.parse\_id\_and\_molecule()</code> so I suggest you use that function directly instead of making a specialized function. (Let me know if making a specialized function is useful.)

See chemfp.openeye\_toolkit.read\_molecules() for details about the other parameters.

#### **Parameters**

- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit.
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns a function of the form parser(record string) -> (id, OEGraphMol)

## 8.41.17 parse\_molecule (openeye\_toolkit)

```
\label{lem:chemfp:openeye_toolkit.parse_molecule} content, \qquad format, \qquad id\_tag=None, \\ reader\_args=None, \ errors="strict")
```

Parse the first structure record from the *content* string and return an OEGraphMol molecule.

content is a string containing a single structure record in format format. (Additional records are ignored). See chemfp.openeye\_toolkit.read\_molecules() for details about the other parameters. See chemfp.openeye\_toolkit.parse\_id\_and\_molecule() if you want the (id, OEGraphMol) pair instead of just the molecule.

#### **Parameters**

- content (a string) the string containing a structure record
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns an OEGraphMol molecule

## 8.41.18 parse\_id\_and\_molecule (openeye\_toolkit)

```
chemfp.openeye_toolkit.parse_id_and_molecule(content, format, id_tag=None, reader_args=None, errors="strict")
```

Parse the first structure record from *content* and return the (id, OEGraphMol) pair.

content is a string containing a single structure record in format format. (Additional records are ignored). See chemfp.openeye\_toolkit.read\_molecules() for details about the other parameters.

See <code>chemfp.openeye\_toolkit.read\_molecules()</code> for details about the other parameters. See <code>chemfp.openeye\_toolkit.parse\_molecule()</code> if just want the OEGraphMol molecule and not the (id, OEGraphMol) pair.

- content (a string) the string containing a structure record
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit.
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns an (id, OEGraphMol molecule) pair

## 8.41.19 create\_string (openeye\_toolkit)

```
chemfp.openeye_toolkit.create_string(mol, format, id=None, writer_args=None, errors="strict")
```

Convert an OEChem molecule into a structure record in the given format as a Unicode string

If id is not None then use it instead of the molecule's own title. Warning: this may briefly modify the molecule, so may not be thread-safe.

#### **Parameters**

- mol (an OEChem molecule) the molecule to use for the output
- format (a format name string, or Format object) the output structure format
- id (a string, or None to use the molecule's own id) an alternate record id
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns a string

# 8.41.20 create\_bytes (openeye\_toolkit)

 $chemfp.openeye\_toolkit.create\_bytes(\mathit{mol}, \mathit{format}, \mathit{id}=None, \mathit{writer}\_\mathit{args}=None, \mathit{er-rors}="strict", \mathit{level}=None)$ 

Convert an OEChem molecule into a structure record in the given format as a byte string

If id is not None then use it instead of the molecule's own title. Warning: this may briefly modify the molecule, so may not be thread-safe.

- mol (an OEChem molecule) the molecule to use for the output
- format (a format name string, or Format object) the output structure format
- id (a string, or None to use the molecule's own id) an alternate record id

- writer\_args (a dictionary) writer arguments passed to the underlying toolkit.
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- level (None, a positive integer, or one of the strings 'min', 'default', or 'max') compression level to use for compressed formats

**Returns** a string

## 8.41.21 open\_molecule\_writer (openeye\_toolkit)

Return a Molecule Writer which can write OEChem molecules to a destination.

A chemfp.base\_toolkit.MoleculeWriter has the methods write\_molecule, write\_molecules, and write\_ids\_and\_molecules, which are ways to write an OEChem molecule, an OEChem molecule iterator, or an (id, OEChem molecule) pair iterator to a file.

Molecules are written to *destination*. The output format can be a string like "sdf.gz" or "smi", a *chemfp.base\_toolkit.Format*, or Format-like object with "name" and "compression" attributes, or None to auto-detect based on the *destination*. If auto-detection is not possible, the output will be written as uncompressed SMILES.

The *writer\_args* dictionary parameters depend on the format. Every OEChem format supports:

- aromaticity one of "default", "openeye", "daylight", "tripos", "mdl", "mmff", or None
- flavor a number, string-encoded number, or flavor string

A "flavor string" is a "|" or "," separated list of format-specific flavor terms. It can be as simple as "Default", or a more complex string like DEFAULT|-AtomStereo|-BondStero|Canonical to generate a canonical SMILES string without stereo information.

The supported output flavor terms for each format are:

- SMILES AtomMaps, AtomStereo, BondStereo, Canonical, ExtBonds, Hydrogens, ImpHCount, Isotopes, Kekule, RGroups, SuperAtoms
- sdf CurrentParity, MCHG, MDLParity, MISO, MRGP, MV30, NoParity, Default
- mol2, mol2h AtomNames, AtomTypeNames, BondTypeNames, Hydrogens, Order-Atoms, Substructure, Default
- sln Default
- pdb BONDS, BOTH, CHARGE, CurrentResidues, DELPHI, ELEMENT, FOR-MALCHARGE, FormalCrg, HETBONDS, NoResidues, OEResidues, ORDERS, OrderAtoms, RADIUS, TER, Default
- xyz Charges, Symbols, Default
- cdx Default
- mopac CHARGES, XYZ, Default
- mf Title, Default

- oeb Default
- inchi, inchikey Chiral, FixedHLayer, Hydrogens, ReconnectedMetals, Stereo, RelativeStereo, RacemicStereo, Default

You can also pass in a numeric value like 123 or a numeric string like "0".

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and goes to the next record, and "ignore" goes to the next record.

The *location* parameter takes a *chemfp.io.Location* instance. If None then a default Location will be created.

#### Parameters

- destination (a filename, file object, or None to write to stdout) the structure destination
- format (a format name string, or Format(-like) object, or None to auto-detect) the output structure format
- writer\_args (a dictionary) writer parameters passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track writer state information
- level (None, a positive integer, or one of the strings 'min', 'default', or 'max') compression level to use for compressed formats (does not affect OEChem)

 $\begin{array}{lll} \textbf{Returns a} & \textit{chemfp.base\_toolkit.MoleculeWriter} & \textbf{expecting} & \textbf{OEChem} \\ & \textbf{molecules} \end{array}$ 

## 8.41.22 open\_molecule\_writer\_to\_string (openeye\_toolkit)

```
chemfp.openeye\_toolkit.open\_molecule\_writer\_to\_string(format,\\ writer\_args=None,\\ errors="strict", location=None)\\ location=None)
```

Return a MoleculeStringWriter which can write OEChem molecule records to a Unicode string.

See chemfp.openeye\_toolkit.open\_molecule\_writer() for full parameter details.

Use the writer's <code>chemfp.base\_toolkit.MoleculeStringWriter.getvalue()</code> to get the output string as a Unicode string.

- format (a format name string, or Format(-like) object, or None to auto-detect) the output structure format
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

• location (a *chemfp.io.Location* object, or None) – object used to track writer state information

Returns a chemfp.base\_toolkit.MoleculeStringWriter expecting OEChem molecules

### 8.41.23 open\_molecule\_writer\_to\_bytes (openeye\_toolkit)

```
\label{lem:chemfp:openeye_toolkit.open_molecule_writer_to_bytes} (format, writer\_args=None, errors="strict", location=None, level=None)
```

Return a MoleculeStringWriter which can write OEChem molecule records to a byte string.

See chemfp.openeye\_toolkit.open\_molecule\_writer() for full parameter details.

Use the writer's <code>chemfp.base\_toolkit.MoleculeStringWriter.getvalue()</code> to get the output string as a byte string.

#### **Parameters**

- format (a format name string, or Format(-like) object, or None to auto-detect) the output structure format
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track writer state information
- level (None, a positive integer, or one of the strings 'min', 'default', or 'max') compression level to use for compressed formats (does not affect OEChem)

 $\textbf{Returns} \ \ a \ \ \textit{chemfp.base\_toolkit.MoleculeStringWriter} \ \ \textbf{expecting} \ \ \textbf{OEChem} \\ \ \ \textbf{molecules}$ 

# 8.41.24 copy\_molecule (openeye\_toolkit)

```
{\tt chemfp.openeye\_toolkit.copy\_molecule}(\it{mol})
```

Return a new OEGraphMol which is a copy of the given OEChem molecule

Parameters mol (an Open Babel molecule) - the molecule to copy

Returns a new OBMol instance

### 8.41.25 add\_tag (openeye\_toolkit)

chemfp.openeye\_toolkit.add\_tag(mol, tag, value)
Add an SD tag value to the OEChem molecule

- mol (an OEChem molecule) the molecule
- tag (string) the SD tag name

• value (string) - the text for the tag

Returns None

## 8.41.26 get\_tag (openeye\_toolkit)

chemfp.openeve toolkit.get tag(mol, taq)

Get the named SD tag value, or None if it doesn't exist

#### **Parameters**

- mol (an OEChem molecule) the molecule
- tag (string) the SD tag name

Returns a string, or None

## 8.41.27 get\_tag\_pairs (openeye\_toolkit)

chemfp.openeye\_toolkit.get\_tag\_pairs(mol)

Get a list of all SD tag (name, value) pairs for the molecule

Parameters mol (an OEChem molecule) - the molecule

**Returns** a list of (string name, string value) pairs

### 8.41.28 get\_id (openeye\_toolkit)

chemfp.openeye\_toolkit.get\_id(mol)

Get the molecule's id using OEChem's GetTitle()

Parameters mol (an OEChem molecule) - the molecule

Returns a string

### 8.41.29 set\_id (openeye\_toolkit)

chemfp.openeye\_toolkit.set\_id(mol, id)

Set the molecule's id using OEChem's SetTitle()

#### **Parameters**

- mol (an OEChem molecule) the molecule
- id (string) the new id

Returns None

# 8.42 chemfp.rdkit\_toolkit module

The chemfp toolkit layer for RDKit.

### 8.42.1 name

```
chemfp.rdkit_toolkit.name
```

The string "rdkit".

### 8.42.2 software

```
chemfp.rdkit_toolkit.software
```

A string like "RDKit/2020.03.1", where the second part of the string comes from rdkit.rdBase.rdkitVersion.

## 8.42.3 is\_licensed (rdkit\_toolkit)

```
chemfp.rdkit_toolkit.is_licensed()
    Return True - RDKit is always licensed
```

Returns True

### 8.42.4 get\_formats (rdkit\_toolkit)

```
\verb|chemfp.rdkit_toolkit.get_formats||(include\_unavailable = False)||
```

Get the list of structure formats that RDKit supports

If <code>include\_unavailable</code> is True then also include RDKit formats which aren't available to this specific version of RDKit, such as the InChI formats if your RDKit installation wasn't compiled with InChI support.

Parameters include\_unavailable (True or False) – include unavailable formats?

Returns a list of Format objects

# 8.42.5 get\_input\_formats (rdkit\_toolkit)

```
chemfp.rdkit_toolkit.get_input_formats()
    Get the list of supported RDKit input formats
```

Returns a list of chemfp.base\_toolkit.Format objects

# 8.42.6 get\_output\_formats (rdkit\_toolkit)

```
chemfp.rdkit_toolkit.get_output_formats()
Get the list of supported RDKit output formats
```

Returns a list of chemfp.base\_toolkit.Format objects

## 8.42.7 get\_format (rdkit\_toolkit)

```
chemfp.rdkit_toolkit.get_format(format)
```

Get the named format, or raise a ValueError

This will raise a ValueError if RDKit does not implement the format *format\_name* or that format is not available.

Parameters format\_name (a string) - the format name

Returns a list of chemfp.base\_toolkit.Format objects

### 8.42.8 get\_input\_format (rdkit\_toolkit)

```
chemfp.rdkit_toolkit.get_input_format(format)
```

Get the named input format, or raise a ValueError

This will raise a ValueError if RDKit does not implement the format <u>format\_name</u> or that format is not an input format.

Parameters format\_name (a string) - the format name

Returns a list of chemfp.base\_toolkit.Format objects

### 8.42.9 get\_output\_format (rdkit\_toolkit)

```
chemfp.rdkit_toolkit.get_output_format(format)
```

Get the named format, or raise a ValueError

This will raise a ValueError if RDKit does not implement the format <u>format\_name</u> or that format is not an output format.

Parameters format\_name (a string) - the format name

Returns a list of chemfp.base toolkit.Format objects

### 8.42.10 get\_input\_format\_from\_source (rdkit\_toolkit)

chemfp.rdkit\_toolkit.get\_input\_format\_from\_source(source=None, format=None)

Get the most appropriate format given the available source and format information

If format is a chemfp.base\_toolkit.Format then return it. If it's a Format-like object with

"name" and "compression" attributes use it to make a real Format object with the same attributes. If it's a string then use it to create a Format object.

If format is None, use the source to auto-detect the format. If auto-detection is not possible, assume it's an uncompressed SMILES file.

#### **Parameters**

- source (a filename (as a string), a file object, or None to read from stdin) the structure data source.
- format (a Format(-like) object, string, or None) format information, if known.

Returns a chemfp.base\_toolkit.Format object

## 8.42.11 get\_output\_format\_from\_destination (rdkit\_toolkit)

 $\label{lem:chemfp.rdkit_toolkit.get_output_format_from_destination} (\textit{destination} = None, \textit{ format} = None)$ 

Get the most appropriate format given the available destination and format information

If format is a chemfp.base\_toolkit.Format then return it. If it's a Format-like object with "name" and "compression" attributes use it to make a real Format object with the same attributes. If it's a string then use it to create a Format object.

If format is None, use the destination to auto-detect the format. If auto-detection is not possible, assume it's an uncompressed SMILES file.

#### **Parameters**

- destination (a filename (as a string), a file object, or None to read from stdin) The structure data source.
- format (a Format(-like) object, string, or None) format information, if known.

Returns a chemfp.base\_toolkit.Format object

### 8.42.12 read\_molecules (rdkit\_toolkit)

Return an iterator that reads RDKit molecules from a structure file

Iterate through the *format* structure records in *source*. If *format* is None then auto-detect the format based on the *source*. For SD files, use  $id\_tag$  to get the record id from the given SD tag instead of the title line. (read\_molecules() will ignore the  $id\_tag$ . It exists to make it easier to switch between reader functions.)

Note: the reader returns a new RDKit molecule each time.

The reader\_args dictionary parameters depend on the format. These include:

#### • SMILES

- delimiter one of "tab", "space", "to-eol", the space or tab characters, or None
- has header True or False
- sanitize True or default sanitizes; False for unsanitized processing

### • InChI

- delimiter one of "tab", "space", "to-eol", the space or tab characters, or None
- sanitize True or default sanitizes; False for unsanitized processing
- removeHs True or default removes explicit hydrogens; False leaves them in the structure
- logLevel an integer log level
- treatWarningAsError True raises an exception on error; False or default keeps processing
- SDF

- sanitize True or default sanitizes; False for unsanitized processing
- removeHs True or default removes explicit hydrogens; False leaves them in the structure
- strictParsing True or default for strict parsing; False for lenient parsing

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and goes to the next record, and "ignore" goes to the next record.

The *location* parameter takes a *chemfp.io.Location* instance. If None then a default Location will be created.

See chemfp.rdkit\_toolkit.read\_ids\_and\_molecules() if you want (id, molecule) pairs instead of just the molecules.

#### **Parameters**

- source (a filename, file object, or None to read from stdin) the structure source
- format (a format name string, or Format object, or None to auto-detect) - the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader parameters passed to the underlying toolkit.
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.MoleculeReader iterating RDKit molecules

### 8.42.13 read\_molecules\_from\_string (rdkit\_toolkit)

```
\label{lem:chemfp:rdkit_toolkit.read_molecules_from_string} (content, \  \, format, \  \, id\_tag=None, \\ reader\_args=None, \qquad errors="strict", location=None) \\
```

Return an iterator that reads RDKit molecules from a string containing structure records

content is a string containing 0 or more records in the format format. See chemfp. rdkit\_toolkit.read\_molecules() for details about the other parameters. See chemfp. rdkit\_toolkit.read\_ids\_and\_molecules\_from\_string() if you want to read (id, RDKit) pairs instead of just molecules.

- content (a string) the string containing structure records
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title)  $\operatorname{SD}$  tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit

- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.MoleculeReader iterating RDKit molecules

## 8.42.14 read\_ids\_and\_molecules (rdkit\_toolkit)

Return an iterator that reads (id, RDKit molecule) pairs from a structure file

See chemfp.rdkit\_toolkit.read\_molecules() for full parameter details. The major difference is that this returns an iterator of (id, RDKit molecule) pairs instead of just the molecules.

#### **Parameters**

- source (a filename, file object, or None to read from stdin) the structure source
- format (a format name string, or Format object, or None to auto-detect) the input structure format
- $id_tag(string, or None to use the record title) SD tag containing the record id$
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit.
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.IdAndMoleculeReader iterating (id, RDKit molecule) pairs

### 8.42.15 read\_ids\_and\_molecules\_from\_string (rdkit\_toolkit)

Return an iterator that reads (id, RDKit molecule) pairs from a string containing structure records

content is a string containing 0 or more records in the format format. See chemfp. rdkit\_toolkit.read\_molecules() for details about the other parameters. See chemfp. rdkit\_toolkit.read\_molecules\_from\_string() if you just want to read the RDKit molecules instead of (id, molecule) pairs.

#### **Parameters**

- content (a string) the string containing structure records
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit.
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.IdAndMoleculeReader iterating (id, RDKit molecule) pairs

### 8.42.16 make\_id\_and\_molecule\_parser (rdkit\_toolkit)

Create a specialized function which takes a record and returns an (id, RDKit molecule) pair

The returned function is optimized for reading many records from individual strings because it only does parameter validation once. However, I haven't really noticed much of a performance difference between this and <code>chemfp.rdkit\_toolkit.parse\_id\_and\_molecule()</code> so you can probably so I suggest you use that function directly instead of making a specialized function. (Let me know if making a specialized function is useful.)

See chemfp.rdkit\_toolkit.read\_molecules() for details about the other parameters.

#### **Parameters**

- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit.
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns a function of the form parser(record string) -> (id, RDKit molecule)

## 8.42.17 parse molecule (rdkit\_toolkit)

```
\label{lem:chemfp:rdkit_toolkit.parse_molecule} (content, & format, & id\_tag=None, \\ reader\_args=None, & errors="strict")
```

Parse the first structure record from the *content* string and return an RDKit molecule.

content is a string containing a single structure record in format format. (Additional records are ignored). See chemfp.rdkit\_toolkit.read\_molecules() for details about the other parameters. See chemfp.rdkit\_toolkit.parse\_id\_and\_molecule() if you want the (id, RDKit molecule) pair instead of just the molecule.

#### Parameters

- content (a string) the string containing a structure record
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title)  $\operatorname{SD}$  tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns an RDKit molecule

## 8.42.18 parse\_id\_and\_molecule (rdkit\_toolkit)

```
chemfp.rdkit\_toolkit.parse\_id\_and\_molecule(content, format, id\_tag=None, reader\_args=None, errors="strict")
```

Parse the first structure record from *content* and return the (id, RDKit molecule) pair.

content is a string containing a single structure record in format format. (Additional records are ignored). See chemfp.rdkit\_toolkit.read\_molecules() for details about the other parameters.

See <code>chemfp.rdkit\_toolkit.read\_molecules()</code> for details about the other parameters. See <code>chemfp.rdkit\_toolkit.parse\_molecule()</code> if just want the RDKit molecule and not the the (id, RDKit molecule) pair.

#### **Parameters**

- content (a string) the string containing a structure record
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns an (id, RDKit molecule) pair

## 8.42.19 create\_string (rdkit\_toolkit)

```
\label{lem:chemfp:rdkit_toolkit.create_string} (mol, \ format, \ id=None, \ writer\_args=None, \ errors="strict")
```

Convert an RDKit molecule into a structure record in the given format as a Unicode string

If id is not None then use it instead of the molecule's own title. Warning: this may briefly modify the molecule, so may not be thread-safe.

#### Parameters

- mol (an RDKit molecule) the molecule to use for the output
- format (a format name string, or Format object) the output structure format
- id (a string, or None to use the molecule's own id) an alternate record id
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns a Unicode string

### 8.42.20 create\_bytes (rdkit\_toolkit)

```
chemfp.rdkit\_toolkit.create\_bytes(\mathit{mol}, \mathit{format}, \mathit{id}=None, \mathit{writer}\_\mathit{args}=None, \mathit{errors}="strict", \mathit{level}=None)
```

Convert an RDKit molecule into a structure record in the given format as a byte string

If id is not None then use it instead of the molecule's own title. Warning: this may briefly modify the molecule, so may not be thread-safe.

#### **Parameters**

- mol (an RDKit molecule) the molecule to use for the output
- format (a format name string, or Format object) the output structure format
- id (a string, or None to use the molecule's own id) an alternate record id
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- level (None, a positive integer, or one of the strings 'min', 'default', or 'max') compression level to use for compressed formats

Returns a byte string

### 8.42.21 open\_molecule\_writer (rdkit\_toolkit)

Return a Molecule Writer which can write RDKit molecules to a destination.

A chemfp.base\_toolkit.MoleculeWriter has the methods write\_molecule, write\_molecules, and write\_ids\_and\_molecules, which are ways to write an RD-Kit molecule, an RDKit molecule iterator, or an (id, RDKit molecule) pair iterator to a file.

Molecules are written to *destination*. The output format can be a string like "sdf.gz" or "smi", a *chemfp.base\_toolkit.Format*, or Format-like object with "name" and "compression" attributes, or None to auto-detect based on the *destination*. If auto-detection is not possible, the output will be written as uncompressed SMILES.

The writer\_args dictionary parameters depend on the format. These include:

#### • SMILES

- delimiter one of "tab", "space", "to-eol", the space or tab characters, or None
- isomericSmiles True to generate isomeric SMILES
- kekuleSmiles True to generate SMILES in Kekule form
- canonical True to generate a canonical SMILES
- allBondsExplicit True to write explict '-' and ':' bonds, even if they can be inferred; default is False
- allHsExplicit True to write explicit hydrogen counts; default is False
- cxsmiles True to include CXSMILES annotations; default is False

#### InChI and InChIKey

- delimiter one of "tab", "space", "to-eol", the space or tab characters, or None
- include\_id True or default to include the id as the second column; False has no id column
- options an options string passed to the underlying InChI library
- logLevel an integer log level
- treatWarningAsError True raises an exception on error; False or default keeps processing

### SDF

- includeStereo True include stereo information; False or default does not
- kekulize True or default creates the connection table with bonds in Kekeule form
- v3k True to alway export in V3000 format

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and goes to the next record, and "ignore" goes to the next record.

The *location* parameter takes a *chemfp.io.Location* instance. If None then a default Location will be created.

- destination (a filename, file object, or None to write to stdout) - the structure destination
- format (a format name string, or Format(-like) object, or None to auto-detect) the output structure format
- writer\_args (a dictionary) writer parameters passed to the underlying toolkit

- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track writer state information
- level (None, a positive integer, or one of the strings 'min', 'default', or 'max') compression level to use for compressed formats

Returns a chemfp.base toolkit.MoleculeWriter expecting RDKit molecules

### 8.42.22 open\_molecule\_writer\_to\_string (rdkit\_toolkit)

Return a MoleculeStringWriter which can write molecule records in the given format to a string.

See chemfp.rdkit\_toolkit.open\_molecule\_writer() for full parameter details.

Use the writer's <code>chemfp.base\_toolkit.MoleculeStringWriter.getvalue()</code> to get the output as a Unicode string.

#### **Parameters**

- format (a format name string, or Format(-like) object, or None to auto-detect) the output structure format
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track writer state information

Returns a chemfp.base\_toolkit.MoleculeStringWriter expecting RDKit molecules

#### 8.42.23 open\_molecule\_writer\_to\_bytes (rdkit\_toolkit)

Return a MoleculeStringWriter which can write molecule records in the given format to a text string.

See chemfp.rdkit\_toolkit.open\_molecule\_writer() for full parameter details.

Use the writer's <code>chemfp.base\_toolkit.MoleculeStringWriter.getvalue()</code> to get the output as a byte string.

- format (a format name string, or Format(-like) object, or None to auto-detect) the output structure format
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit

- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track writer state information
- level (None, a positive integer, or one of the strings 'min', 'default', or 'max') compression level to use for compressed formats

 $\begin{tabular}{lll} \bf Returns & a & chemfp. base\_toolkit. Molecule String Writer & expecting & RDKit \\ & molecules & \\ \end{tabular}$ 

### 8.42.24 copy\_molecule (rdkit\_toolkit)

chemfp.rdkit\_toolkit.copy\_molecule(mol)

Return a new RDKit molecule which is a copy of the given molecule

Parameters mol (an RDKit molecule) - the molecule to copy

Returns a new RDKit Mol instance

## 8.42.25 add\_tag (rdkit\_toolkit)

chemfp.rdkit\_toolkit.add\_tag(mol, tag, value)
Add an SD tag value to the RDKit molecule

#### **Parameters**

- mol (an RDKit molecule) the molecule
- tag (string) the SD tag name
- value (string) the text for the tag

Returns None

### 8.42.26 get\_tag (rdkit\_toolkit)

 ${\tt chemfp.rdkit\_toolkit.get\_tag}(\mathit{mol},\,\mathit{tag})$ 

Get the named SD tag value, or None if it doesn't exist

### **Parameters**

- mol (an RDKit molecule) the molecule
- tag (string) the SD tag name

**Returns** a string, or None

### 8.42.27 get\_tag\_pairs (rdkit\_toolkit)

chemfp.rdkit\_toolkit.get\_tag\_pairs(mol)

Get a list of all SD tag (name, value) pairs for the molecule

Parameters mol (an RDKit molecule) - the molecule

Returns a list of (string name, string value) pairs

# 8.42.28 get\_id (rdkit\_toolkit)

```
chemfp.rdkit_toolkit.get_id(mol)
   Get the molecule's id from RDKit's _Name property
   Parameters mol (an RDKit molecule) - the molecule
   Returns a string
```

## 8.42.29 set\_id (rdkit\_toolkit)

```
chemfp.rdkit_toolkit.set_id(mol, id)
    Set the molecule's id as RDKit's Name property
```

#### **Parameters**

- mol (an RDKit molecule) the molecule
- id (string) the new id

Returns None

# 8.43 chemfp.cdk\_toolkit module

The chemfp toolkit layer for CDK. See the CDK installation guide for help installing CDK and JPype.

#### 8.43.1 name

```
chemfp.cdk_toolkit.name
The string "cdk".
```

#### 8.43.2 software

```
chemfp.cdk_toolkit.software
```

A string like "CDK/2.3", where the second part of the string comes from cdk.CDK.getVersion().

## 8.43.3 is\_licensed (cdk\_toolkit)

```
chemfp.cdk_toolkit.is_licensed()
    Return True - CDK is always licensed
    Returns True
```

### 8.43.4 get\_formats (cdk\_toolkit)

```
chemfp.cdk_toolkit.get_formats(include_unavailable=False)
Get the list of structure formats that CDK supports
```

If  $include\_unavailable$  is True then also include CDK formats which aren't available to this specific version of CDK.

Parameters include\_unavailable (True or False) – include unavailable formats?

Returns a list of Format objects

### 8.43.5 get\_input\_formats (cdk\_toolkit)

```
chemfp.cdk_toolkit.get_input_formats()
```

Get the list of supported CDK input formats

Returns a list of chemfp.base\_toolkit.Format objects

## 8.43.6 get\_output\_formats (cdk\_toolkit)

```
chemfp.cdk_toolkit.get_output_formats()
```

Get the list of supported CDK output formats

Returns a list of chemfp.base\_toolkit.Format objects

### 8.43.7 get\_format (cdk\_toolkit)

#### chemfp.cdk\_toolkit.get\_format(format)

Get the named format, or raise a ValueError

This will raise a Value Error if CDK does not implement the format *format\_name* or that format is not available.

Parameters format\_name (a string) - the format name

Returns a list of chemfp.base\_toolkit.Format objects

### 8.43.8 get\_input\_format (cdk\_toolkit)

```
chemfp.cdk_toolkit.get_input_format(format)
```

Get the named input format, or raise a ValueError

This will raise a ValueError if CDK does not implement the format <u>format\_name</u> or that format is not an input format.

Parameters format\_name (a string) - the format name

Returns a list of chemfp.base\_toolkit.Format objects

### 8.43.9 get\_output\_format (cdk\_toolkit)

### chemfp.cdk\_toolkit.get\_output\_format(format)

Get the named format, or raise a ValueError

This will raise a ValueError if CDK does not implement the format *format\_name* or that format is not an output format.

Parameters format\_name (a string) - the format name

Returns a list of chemfp.base\_toolkit.Format objects

# 8.43.10 get\_input\_format\_from\_source (cdk\_toolkit)

chemfp.cdk\_toolkit.get\_input\_format\_from\_source(source=None, format=None)

Get the most appropriate format given the available source and format information

If format is a chemfp.base\_toolkit.Format then return it. If it's a Format-like object with "name" and "compression" attributes use it to make a real Format object with the same attributes. If it's a string then use it to create a Format object.

If format is None, use the source to auto-detect the format. If auto-detection is not possible, assume it's an uncompressed SMILES file.

#### **Parameters**

- source (a filename (as a string), a file object, or None to read from stdin) the structure data source.
- format (a Format(-like) object, string, or None) format information, if known.

Returns a chemfp.base\_toolkit.Format object

### 8.43.11 get\_output\_format\_from\_destination (cdk\_toolkit)

```
\label{lem:cdk_toolkit.get_output_format_from_destination} (\textit{destination} = None, & \textit{format} = None) \\ \\ \textit{mat} = None)
```

Get the most appropriate format given the available destination and format information

If format is a chemfp.base\_toolkit.Format then return it. If it's a Format-like object with "name" and "compression" attributes use it to make a real Format object with the same attributes. If it's a string then use it to create a Format object.

If format is None, use the destination to auto-detect the format. If auto-detection is not possible, assume it's an uncompressed SMILES file.

#### **Parameters**

- destination (a filename (as a string), a file object, or None to read from stdin) The structure data source.
- format (a Format(-like) object, string, or None) format information, if known.

Returns a chemfp.base\_toolkit.Format object

## 8.43.12 read\_molecules (cdk\_toolkit)

Return an iterator that reads CDK molecules from a structure file

Iterate through the *format* structure records in *source*. If *format* is None then auto-detect the format based on the *source*. For SD files, use  $id\_tag$  to get the record id from the given SD tag instead of the title line. (read\\_molecules() will ignore the  $id\_tag$ . It exists to make it easier to switch between reader functions.)

Note: the reader returns a new CDK molecule each time.

The reader args dictionary parameters depend on the format. These include:

#### • SMILES

- delimiter one of "tab", "space", "to-eol", the space or tab characters, or None
- has header True or False
- sanitize True or default sanitizes; False for unsanitized processing

#### InChI

- delimiter one of "tab", "space", "to-eol", the space or tab characters, or None
- sanitize True or default sanitizes; False for unsanitized processing
- removeHs True or default removes explicit hydrogens; False leaves them in the structure
- logLevel an integer log level
- treatWarningAsError True raises an exception on error; False or default keeps processing

#### • SDF

- sanitize True or default sanitizes; False for unsanitized processing
- removeHs True or default removes explicit hydrogens; False leaves them in the structure
- strictParsing True or default for strict parsing; False for lenient parsing

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and goes to the next record, and "ignore" goes to the next record.

The *location* parameter takes a *chemfp.io.Location* instance. If None then a default Location will be created.

See chemfp.cdk\_toolkit.read\_ids\_and\_molecules() if you want (id, molecule) pairs instead of just the molecules.

#### **Parameters**

- source (a filename, file object, or None to read from stdin) the structure source
- format (a format name string, or Format object, or None to auto-detect) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader parameters passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.MoleculeReader iterating CDK molecules

## 8.43.13 read\_molecules\_from\_string (cdk\_toolkit)

 $\label{lem:content} $$ chemfp.cdk\_toolkit.read\_molecules\_from\_string(content, format, id\_tag=None, reader\_args=None, errors="strict", location=None) $$$ 

Return an iterator that reads CDK molecules from a string containing structure records

content is a string containing 0 or more records in the format format. See chemfp. cdk\_toolkit.read\_molecules() for details about the other parameters. See chemfp. cdk\_toolkit.read\_ids\_and\_molecules\_from\_string() if you want to read (id, CDK molecule) pairs instead of just molecules.

#### **Parameters**

- content (a string) the string containing structure records
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit.
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.MoleculeReader iterating CDK molecules

## 8.43.14 read\_ids\_and\_molecules (cdk\_toolkit)

Return an iterator that reads (id, CDK molecule) pairs from a structure file

See *chemfp.cdk\_toolkit.read\_molecules()* for full parameter details. The major difference is that this returns an iterator of (id, CDK molecule) pairs instead of just the molecules.

- source (a filename, file object, or None to read from stdin) the structure source
- format (a format name string, or Format object, or None to auto-detect) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

• location (a *chemfp.io.Location* object, or None) – object used to track parser state information

Returns a chemfp.base\_toolkit.IdAndMoleculeReader iterating (id, CDK molecule) pairs

### 8.43.15 read\_ids\_and\_molecules\_from\_string (cdk\_toolkit)

Return an iterator that reads (id, CDK molecule) pairs from a string containing structure records

content is a string containing 0 or more records in the format format. See chemfp. cdk\_toolkit.read\_molecules() for details about the other parameters. See chemfp. cdk\_toolkit.read\_molecules\_from\_string() if you just want to read the CDK molecules instead of (id, molecule) pairs.

#### **Parameters**

- content (a string) the string containing structure records
- format (a format name string, or Format object) the input structure format
- $id\_tag(string, or None to use the record title) SD tag containing the record id$
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.IdAndMoleculeReader iterating (id, CDK molecule) pairs

### 8.43.16 make\_id\_and\_molecule\_parser (cdk\_toolkit)

```
chemfp.cdk\_toolkit.make\_id\_and\_molecule\_parser(format, id\_tag=None, reader\_args=None, errors="strict")\\
```

Create a specialized function which takes a record and returns an (id, CDK molecule) pair

The returned function is optimized for reading many records from individual strings because it only does parameter validation once. However, I haven't really noticed much of a performance difference between this and <code>chemfp.cdk\_toolkit.parse\_id\_and\_molecule()</code> so you can probably so I suggest you use that function directly instead of making a specialized function. (Let me know if making a specialized function is useful.)

See chemfp.cdk\_toolkit.read\_molecules() for details about the other parameters.

- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns a function of the form parser(record string) -> (id, CDK molecule)

### 8.43.17 parse\_molecule (cdk\_toolkit)

Parse the first structure record from the *content* string and return a CDK molecule.

content is a string containing a single structure record in format format. (Additional records are ignored). See <code>chemfp.cdk\_toolkit.read\_molecules()</code> for details about the other parameters. See <code>chemfp.cdk\_toolkit.parse\_id\_and\_molecule()</code> if you want the (id, CDK molecule) pair instead of just the molecule.

#### **Parameters**

- content (a string) the string containing a structure record
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns a CDK molecule

### 8.43.18 parse\_id\_and\_molecule (cdk\_toolkit)

Parse the first structure record from *content* and return the (id, CDK molecule) pair.

content is a string containing a single structure record in format format. (Additional records are ignored). See chemfp.cdk\_toolkit.read\_molecules() for details about the other parameters.

See <code>chemfp.cdk\_toolkit.read\_molecules()</code> for details about the other parameters. See <code>chemfp.cdk\_toolkit.parse\_molecule()</code> if just want the CDK molecule and not the the (id, CDK molecule) pair.

- content (a string) the string containing a structure record
- format (a format name string, or Format object) the input structure format
- $id\_tag(string, or None to use the record title) SD tag containing the record id$
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit.
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns an (id, CDK molecule) pair

## 8.43.19 create\_string (cdk\_toolkit)

Convert a CDK molecule into a structure record in the given format as a Unicode string

If id is not None then use it instead of the molecule's own title. Warning: this may briefly modify the molecule, so may not be thread-safe.

#### **Parameters**

- mol (a CDK molecule) the molecule to use for the output
- format (a format name string, or Format object) the output structure format
- id (a string, or None to use the molecule's own id) an alternate record id
- $\bullet$  writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

**Returns** a Unicode string

# 8.43.20 create\_bytes (cdk\_toolkit)

Convert a CDK molecule into a structure record in the given format as a byte string

If id is not None then use it instead of the molecule's own title. Warning: this may briefly modify the molecule, so may not be thread-safe.

- mol (a CDK molecule) the molecule to use for the output
- format (a format name string, or Format object) the output structure format
- $\bullet$  id (a string, or None to use the molecule's own id) an alternate record  $\operatorname{id}$

- writer\_args (a dictionary) writer arguments passed to the underlying toolkit.
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- level (None, a positive integer, or one of the strings 'min', 'default', or 'max') compression level to use for compressed formats

**Returns** a byte string

### 8.43.21 open\_molecule\_writer (cdk\_toolkit)

Return a MoleculeWriter which can write  $\overrightarrow{CDK}$  molecules to a destination.

A chemfp.base\_toolkit.MoleculeWriter has the methods write\_molecule, write\_molecules, and write\_ids\_and\_molecules, which are ways to write a CDK molecule, a CDK molecule iterator, or an (id, CDK molecule) pair iterator to a file.

Molecules are written to *destination*. The output format can be a string like "sdf.gz" or "smi", a *chemfp.base\_toolkit.Format*, or Format-like object with "name" and "compression" attributes, or None to auto-detect based on the *destination*. If auto-detection is not possible, the output will be written as uncompressed SMILES.

The writer\_args dictionary parameters depend on the format. These include:

- SMILES
  - delimiter one of "tab", "space", "to-eol", the space or tab characters, or None
  - isomericSmiles True to generate isomeric SMILES
  - kekuleSmiles True to generate SMILES in Kekule form
  - canonical True to generate a canonical SMILES
  - allBondsExplicit True to write explict '-' and ':' bonds, even if they can be inferred; default is False
  - allHsExplicit True to write explicit hydrogen counts; default is False
  - cxsmiles True to include CXSMILES annotations; default is False

#### InChI and InChIKey

- delimiter one of "tab", "space", "to-eol", the space or tab characters, or None
- include\_id True or default to include the id as the second column; False has no id column
- options an options string passed to the underlying InChI library
- logLevel an integer log level
- treatWarningAsError True raises an exception on error; False or default keeps processing

#### SDF

• includeStereo - True include stereo information; False or default does not

- kekulize True or default creates the connection table with bonds in Kekeule form
- v3k True to alway export in V3000 format

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and goes to the next record, and "ignore" goes to the next record.

The *location* parameter takes a *chemfp.io.Location* instance. If None then a default Location will be created.

#### Parameters

- destination (a filename, file object, or None to write to stdout) - the structure destination
- format (a format name string, or Format(-like) object, or None to auto-detect) the output structure format
- writer\_args (a dictionary) writer parameters passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track writer state information
- level (None, a positive integer, or one of the strings 'min', 'default', or 'max') compression level to use for compressed formats

Returns a chemfp.base\_toolkit.MoleculeWriter expecting CDK molecules

### 8.43.22 open\_molecule\_writer\_to\_string (cdk\_toolkit)

chemfp.cdk\_toolkit.open\_molecule\_writer\_to\_string(format, writer\_args=None, errors="strict", location=None)

Return a MoleculeStringWriter which can write molecule records in the given format to a string.

See chemfp.cdk\_toolkit.open\_molecule\_writer() for full parameter details.

Use the writer's <code>chemfp.base\_toolkit.MoleculeStringWriter.getvalue()</code> to get the output as a Unicode string.

#### **Parameters**

- format (a format name string, or Format(-like) object, or None to auto-detect) the output structure format
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track writer state information

Returns a chemfp.base\_toolkit.MoleculeStringWriter expecting CDE molecules

### 8.43.23 open\_molecule\_writer\_to\_bytes (cdk\_toolkit)

 $\label{lem:composition} $\operatorname{chemfp.cdk\_toolkit.open\_molecule\_writer\_to\_bytes}(format, writer\_args=None, errors="strict", location=None, level=None)$$ 

Return a MoleculeStringWriter which can write molecule records in the given format to a text string.

See chemfp.cdk\_toolkit.open\_molecule\_writer() for full parameter details.

Use the writer's chemfp.base\_toolkit.MoleculeStringWriter.getvalue() to get the output as a byte string.

#### **Parameters**

- format (a format name string, or Format(-like) object, or None to auto-detect) the output structure format
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track writer state information
- level (None, a positive integer, or one of the strings 'min', 'default', or 'max') compression level to use for compressed formats

 $\begin{tabular}{lll} \bf Returns & a & chemfp.base\_toolkit.MoleculeStringWriter & expecting & CDK \\ & molecules & \end{tabular}$ 

## 8.43.24 copy\_molecule (cdk\_toolkit)

chemfp.cdk\_toolkit.copy\_molecule(mol)

Return a new CDK molecule which is a copy of the given molecule

Parameters mol (a CDK molecule) - the molecule to copy

Returns a new CDK Mol instance

### 8.43.25 add\_tag (cdk\_toolkit)

chemfp.cdk\_toolkit.add\_tag(mol, tag, value)
Add an SD tag value to the CDK molecule

#### Parameters

- mol (a CDK molecule) the molecule
- tag (string) the SD tag name
- value (string) the text for the tag

Returns None

## 8.43.26 get\_tag (cdk\_toolkit)

```
chemfp.cdk_toolkit.get_tag(mol, tag)
Get the named SD tag value, or None if it doesn't exist
```

#### **Parameters**

- mol (a CDK molecule) the molecule
- tag (string) the SD tag name

Returns a string, or None

## 8.43.27 get\_tag\_pairs (cdk\_toolkit)

```
chemfp.cdk_toolkit.get_tag_pairs(mol)
```

Get a list of all SD tag (name, value) pairs for the molecule

Parameters mol (a CDK molecule) - the molecule

Returns a list of (string name, string value) pairs

## 8.43.28 get\_id (cdk\_toolkit)

```
chemfp.cdk_toolkit.get_id(mol)
```

Get the molecule's id from CDK's "cdk:Title" property

Parameters mol (a CDK molecule) - the molecule

Returns a string

# 8.43.29 set\_id (cdk\_toolkit)

```
chemfp.cdk_toolkit.set_id(mol, id)
```

Set the molecule's id as CDK's "cdk:Title" property

#### **Parameters**

- mol (a CDK molecule) the molecule
- id (string) the new id

Returns None

# 8.44 chemfp.text\_toolkit module

The text\_toolkit implements the chemfp toolkit API but where the "molecules" are simple TextRecord instances which store the records as text strings. It does not use a back-end chemistry toolkit, and it cannot convert between different chemistry representations.

The TextRecord is a base class. The actual records depend on the format, and will be one of:

- SDFRecord
- SmiRecord
- CanRecord

- UsmRecord
- SmiStringRecord
- CanStringRecord
- UsmStringRecord

The text toolkit will let you "convert" between the different SMILES formats, but it doesn't actually change the SMILES string. The SMILES records have the attributes id, record and smiles.

The toolkit also knows a bit about the SD format. The SDF records have the attributes id, id\_bytes and record, and there are methods to get SD tag values and add a tag to the end of the tag data block.

The text\_toolkit also supports a few SDF-specific I/O functions to read SDF records directly as a string instead of wrapped in a TextRecord.

The record types also have the attributes **encoding** and **encoding\_errors** which affect how the record bytes are parsed.

#### 8.44.1 name

```
chemfp.text_toolkit.name
The string "text"
```

#### **8.44.2** software

```
chemfp.text_toolkit.software
A string like "chemfp/3.0".
```

### 8.44.3 is\_licensed (text\_toolkit)

```
chemfp.text_toolkit.is_licensed()
    Return True - chemfp's text toolkit is always licensed
    Returns True
```

### 8.44.4 get\_formats (text\_toolkit)

```
chemfp.text_toolkit.get_formats(include_unavailable=False)
Get the list of structure formats that chemfp's text toolkit supports
```

This version of chemfp will always support the structure formats available to chemfp so 'include\_unavailable' does not affect anything. (It may affect other toolkits.)

Parameters include\_unavailable - include unavailable formats?

Value include\_unavailable True or False

Returns a list of chemfp.base\_toolkit.Format objects

### 8.44.5 get\_input\_formats (text\_toolkit)

chemfp.text\_toolkit.get\_input\_formats()

Get the list of supported chemfp text toolkit input formats

Returns a list of chemfp.base\_toolkit.Format objects

### 8.44.6 get\_output\_formats (text\_toolkit)

chemfp.text\_toolkit.get\_output\_formats()

Get the list of supported chemfp text toolkit output formats

Returns a list of chemfp.base\_toolkit.Format objects

### 8.44.7 get\_format (text\_toolkit)

chemfp.text\_toolkit.get\_format(format\_name)

Get the named format, or raise a ValueError

This will raise a ValueError for unknown format names.

Parameters format name - the format name

Value format\_name a string

Returns a chemfp.base\_toolkit.Format object

### 8.44.8 get\_input\_format (text\_toolkit)

chemfp.text\_toolkit.get\_input\_format(format\_name)

Get the named input format, or raise a ValueError

This will raise a ValueError for unknown format names or if that format is not an input format.

Parameters format\_name - the format name

Value format\_name a string

Returns a chemfp.base\_toolkit.Format object

### 8.44.9 get\_output\_format (text\_toolkit)

chemfp.text\_toolkit.get\_output\_format(format\_name)

Get the named format, or raise a ValueError

This will raise a ValueError for unknown format names or if that format is not an output format.

Parameters format\_name - the format name

Value format\_name a string

Returns a chemfp.base\_toolkit.Format object

# 8.44.10 get\_input\_format\_from\_source (text\_toolkit)

chemfp.text\_toolkit.get\_input\_format\_from\_source(source=None, format=None)
Get the most appropriate format given the available source and format information

If format is a chemfp.base\_toolkit.Format then return it. If it's a Format-like object with "name" and "compression" attributes use it to make a real Format object with the same attributes. If it's a string then use it to create a Format object.

If format is None, use the source to auto-detect the format. If auto-detection is not possible, assume it's an uncompressed SMILES file.

#### **Parameters**

- source (A filename (as a string), a file object, or None to read from stdin) The structure data source.
- format (A Format(-like) object, string, or None) Format information, if known.

Returns a chemfp.base\_toolkit.Format object

### 8.44.11 get\_output\_format\_from\_destination (text\_toolkit)

 $\label{lem:chemfp.text_toolkit.get_output_format_from_destination} (\textit{destination} = None, \quad \textit{format} = None) \\ \\ \textit{mat} = None)$ 

Get the most appropriate format given the available destination and format information

If format is a chemfp.base\_toolkit.Format then return it. If it's a Format-like object with "name" and "compression" attributes use it to make a real Format object with the same attributes. If it's a string then use it to create a Format object.

If format is None, use the destination to auto-detect the format. If auto-detection is not possible, assume it's an uncompressed SMILES file.

#### **Parameters**

- destination (A filename (as a string), a file object, or None to read from stdin) The structure data source.
- format (A Format(-like) object, string, or None) format information, if known.

Returns A chemfp.base\_toolkit.Format object

## 8.44.12 read\_molecules (text\_toolkit)

Return an iterator that reads TextRecord instances from a structure file

Iterate through the *format* structure records in *source*. If *format* is None then auto-detect the format based on the *source*. For SD files, use  $id\_tag$  to get the record id from the given SD tag instead of the title line. (read\\_molecules() will ignore the  $id\_tag$ . It exists to make it easier to switch between reader functions.)

Only the SMILES formats use the reader\_args dictionary. The supported parameters are:

- delimiter one of "tab", "space", "to-eol", the space or tab characters, or None
- has header True or False

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and goes to the next record, and "ignore" goes to the next record.

The *location* parameter takes a *chemfp.io.Location* instance. If None then a default Location will be created.

See read\_ids\_and\_molecules() if you want (id, TextRecord) pairs instead of just the molecules.

#### **Parameters**

- source (a filename, file object, or None to read from stdin) the structure source
- format (a format name string, or Format object, or None to auto-detect) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader parameters passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information
- encoding (string (typically 'utf8' or 'latin1')) the byte encoding
- encoding\_errors (string (typically 'strict', 'ignore', or 'replace')) how to handle decoding failure

### 8.44.13 read\_molecules\_from\_string (text\_toolkit)

```
\label{lem:chemfp:text_toolkit.read_molecules_from_string} (content, format, id\_tag=None, reader\_args=None, errors="strict", location=None) \\
```

Return an iterator that reads TextRecord instances from a string containing structure records

content is a string containing 0 or more records in the format format. See  $read\_molecules()$  for details about the other parameters. See  $read\_ids\_and\_molecules\_from\_string()$  if you want to read (id, TextRecord) pairs instead of just molecules.

- content (a string) the string containing structure records
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id

- reader\_args (a dictionary) reader arguments passed to the underlying toolkit.
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information
- encoding (string (typically 'utf8' or 'latin1')) the byte encoding
- encoding\_errors (string (typically 'strict', 'ignore', or 'replace')) how to handle decoding failure

Returns a chemfp.base\_toolkit.MoleculeReader iterating TextRecord molecules

## 8.44.14 read\_ids\_and\_molecules (text\_toolkit)

```
 \begin{array}{c} {\it chemfp.text\_toolkit.read\_ids\_and\_molecules}(source=None, & format=None, \\ id\_tag=None, & reader\_args=None, \\ errors="strict", location=None, encoding="utf8", encoding\_errors="strict") \\ {\it Return an iterator that reads} & (id, TextRecord) & pairs from a structure file \\ \end{array}
```

See chemfp.text\_toolkit.read\_molecules() for full parameter details. The major differ-

See chemfp.text\_toolkit.read\_molecules() for full parameter details. The major difference is that this returns an iterator of (id, TextRecord) pairs instead of just the molecules.

#### Parameters

- source (a filename, file object, or None to read from stdin) the structure source
- format (a format name string, or Format object, or None to auto-detect) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- $\bullet$   ${\tt reader\_args}$  (a  ${\tt dictionary})$  reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information
- encoding (string (typically 'utf8' or 'latin1')) the byte encoding
- encoding\_errors (string (typically 'strict', 'ignore', or 'replace')) how to handle decoding failure

Returns a chemfp.text\_toolkit.IdAndMoleculeReader iterating (id, TextRecord) pairs

# 8.44.15 read\_ids\_and\_molecules\_from\_string (text\_toolkit)

Return an iterator that reads (id, TextRecord) pairs from a string containing structure records

content is a string containing 0 or more records in the format format. See chemfp.  $rdkit\_toolkit.read\_molecules()$  for details about the other parameters. See chemfp.  $rdkit\_toolkit.read\_molecules\_from\_string()$  if you just want to read the TextRecord molecules instead of (id, TextRecord) pairs.

#### **Parameters**

- content (a string) the string containing structure records
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information
- encoding (string (typically 'utf8' or 'latin1')) the byte encoding
- encoding\_errors (string (typically 'strict', 'ignore', or 'replace')) how to handle decoding failure

Returns a chemfp.base\_toolkit.IdAndMoleculeReader iterating (id, TextRecord) pairs

### 8.44.16 make\_id\_and\_molecule\_parser (text\_toolkit)

Create a specialized function which takes a record and returns an (id, TextRecord) pair

The returned function is optimized for reading many records from individual strings because it only does parameter validation once. However, I haven't really noticed much of a performance difference between this and <code>chemfp.text\_toolkit.parse\_id\_and\_molecule()</code> so I suggest you use that function directly instead of making a specialized function. (Let me know if making a specialized function is useful.)

See  $chemfp.text\_toolkit.read\_molecules()$  for details about the other parameters. The specific TextRecord subclass returned depends on the format.

- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns a function of the form parser(record string) -> (id, text\_record)

# 8.44.17 parse\_molecule (text\_toolkit)

```
\label{lem:chemfp:text_toolkit.parse_molecule} (content, & format, & id\_tag{=}None, \\ reader\_args{=}None, & errors{=}"strict")
```

Parse the first structure record from the *content* string and return a TextRecord.

content is a string containing a single structure record in format format. (Additional records are ignored). See chemfp.text\_toolkit.read\_molecules() for details about the other parameters. See chemfp.text\_toolkit.parse\_id\_and\_molecule() if you want the (id, TextRecord) pair instead of just the text record.

#### **Parameters**

- content (a string) the string containing a structure record
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- encoding(string(typically'utf8'or'latin1')) the byte encoding
- encoding\_errors (string (typically 'strict', 'ignore', or 'replace')) how to handle decoding failure

Returns a TextRecord

### 8.44.18 parse id and molecule (text toolkit)

```
\label{lem:chemfp:text_toolkit.parse_id_and_molecule} (content, \qquad format, \qquad id\_tag{=}None, \\ reader\_args{=}None, \; errors{=}"strict")
```

Parse the first structure record from *content* and return the (id, TextRecord) pair.

content is a string containing a single structure record in format format. (Additional records are ignored). See  $chemfp.rdkit\_toolkit.read\_molecules()$  for details about the other parameters.

See chemfp.rdkit\_toolkit.read\_molecules() for details about the other parameters. See chemfp.rdkit\_toolkit.parse\_molecule() if just want the TextRecord and not the the (id, TextRecord) pair.

#### **Parameters**

- content (a string) the string containing a structure record
- format (a format name string, or Format object) the input structure format
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (a dictionary) reader arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- encoding (string (typically 'utf8' or 'latin1')) the byte encoding
- encoding\_errors (string (typically 'strict', 'ignore', or 'replace')) how to handle decoding failure

Returns an (id, TextRecord molecule) pair

# 8.44.19 create\_string (text\_toolkit)

chemfp.text\_toolkit.create\_string(mol, format, id=None, writer\_args=None, errors="strict")

Convert a TextRecord into a structure record in the given format as a Unicode string If id is not None then use it instead of the molecule's own id.

#### **Parameters**

- mol (a TextRecord) the molecule to use for the output
- format (a format name string, or Format object) the output structure format
- $\bullet$  id (a string, or None to use the molecule's own id) an alternate record id
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

Returns a Unicode string

# 8.44.20 create\_bytes (text\_toolkit)

 $chemfp.text\_toolkit.create\_bytes(\mathit{mol}, \mathit{format}, \mathit{id}=None, \mathit{writer}\_\mathit{args}=None, \mathit{er-rors}="strict", \mathit{level}=None)$ 

Convert a TextRecord into a structure record in the given format as a byte string

If id is not None then use it instead of the molecule's own id.

#### **Parameters**

- mol (a TextRecord) the molecule to use for the output
- format (a format name string, or Format object) the output structure format

- id (a string, or None to use the molecule's own id) an alternate record id
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- level (None, a positive integer, or one of the strings 'min', 'default', or 'max') compression level to use for compressed formats

**Returns** a byte string

# 8.44.21 open\_molecule\_writer (text\_toolkit)

Return a MoleculeWriter which can write TextRecord instances to a destination.

A chemfp.base\_toolkit.MoleculeWriter has the methods write\_molecule, write\_molecules, and write\_ids\_and\_molecules, which are ways to write an TextRecord, an TextRecord iterator, or an (id, TextRecord) pair iterator to a file.

TextRecords are written to destination. The output format can be a string like "sdf.gz" or "smi", a chemfp.base\_toolkit.Format, or Format-like object with "name" and "compression" attributes, or None to auto-detect based on the destination. If auto-detection is not possible, the output will be written as uncompressed SMILES.

That said, the text toolkit doesn't know how to convert between SMILES and SDF formats, and will raise an exception if you try.

The writer\_args is only used for the "smi", "can", and "usm" output formats. The only supported parameter is:

```
* delimiter - one of "tab", "space", "to-eol", the space or tab characters, \begin{cases} \begin{center} \beg
```

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and goes to the next record, and "ignore" goes to the next record.

The *location* parameter takes a *chemfp.io.Location* instance. If None then a default Location will be created.

### **Parameters**

- destination (a filename, file object, or None to write to stdout) the structure destination
- format (a format name string, or Format(-like) object, or None to auto-detect) the output structure format
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors

- location (a chemfp.io.Location object, or None) object used to track writer state information
- encoding (string (typically 'utf8' or 'latin1')) the byte encoding
- encoding\_errors (string (typically 'strict', 'ignore', or 'replace')) how to handle decoding failure
- level (None, a positive integer, or one of the strings 'min', 'default', or 'max') compression level to use for compressed formats

Returns a chemfp.base\_toolkit.MoleculeWriter expecting TextRecord instances

# 8.44.22 open\_molecule\_writer\_to\_string (text\_toolkit)

Return a MoleculeStringWriter which can write TextRecord instances to a string.

See chemfp.text\_toolkit.open\_molecule\_writer() for full parameter details.

Use the writer's <code>chemfp.base\_toolkit.MoleculeStringWriter.getvalue()</code> to get the output as a Unicode string.

#### **Parameters**

- format (a format name string, or Format(-like) object, or None to auto-detect) the output structure format
- writer\_args (a dictionary) writer arguments passed to the underlying toolkit
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track writer state information

# 8.44.23 open\_molecule\_writer\_to\_bytes (text\_toolkit)

```
\label{lem:chemfp:text_toolkit.open_molecule_writer_to_bytes} (format, writer\_args=None, errors="strict", location=None, level=None) \\ \\ level=None)
```

Return a MoleculeStringWriter which can write TextRecord instances to a string.

See chemfp.text\_toolkit.open\_molecule\_writer() for full parameter details.

Use the writer's chemfp.base\_toolkit.MoleculeStringWriter.getvalue() to get the output as a byte string.

### Parameters

• format (a format name string, or Format(-like) object, or None to auto-detect) - the output structure format

- writer\_args (a dictionary) writer arguments passed to the underlying toolkit.
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track writer state information
- level (None, a positive integer, or one of the strings 'min', 'default', or 'max') compression level to use for compressed formats

 $\begin{array}{lll} \textbf{Returns a} & \textit{chemfp.base\_toolkit.MoleculeStringWriter} & \text{expecting} \\ \textit{TextRecord instances} \end{array}$ 

# 8.44.24 copy\_molecule (text\_toolkit)

chemfp.text\_toolkit.copy\_molecule(mol)

Return a new TextRecord which is a copy of the given TextRecord

Parameters mol (a TextRecord) - the text record

Returns a new TextRecord

# 8.44.25 add\_tag (text\_toolkit)

chemfp.text\_toolkit.add\_tag(mol, tag, value)
Add an SD tag value to the TextRecord

If the mol is in "sdf" format then this will modify mol.record to append the new tag and value to the end of the tag block. The other tags will not be modified, including tags with the same tag name.

#### **Parameters**

- mol (a TextRecord) the text record
- tag (string) the SD tag name
- value (string) the text for the tag

Returns None

# 8.44.26 get\_tag (text\_toolkit)

chemfp.text\_toolkit.get\_tag(mol, tag)

Get the named SD tag value, or None if it doesn't exist

If the *mol* is in "sdf" format then this will return the corresponding tag value from mol. record, or None if the tag does not exist.

If the record is in any other format then it will return None.

### **Parameters**

- mol (a TextRecord) the molecule
- tag (string) the SD tag name

Returns a string, or None

# 8.44.27 get\_tag\_pairs (text\_toolkit)

```
chemfp.text_toolkit.get_tag_pairs(mol)
```

Get a list of all SD tag (name, value) pairs for the TextRecord

If the *mol* is in "sdf" format then this will return the list of (tag, value) pairs in mol.record, where the *tag* and *value* are strings.

If the record is in any other format then it will return an empty list.

```
Parameters mol (a TextRecord) - the molecule
```

Returns a list of (tag name, tag value) pairs

# 8.44.28 get\_id (text\_toolkit)

```
chemfp.text_toolkit.get_id(mol)
```

Get the molecule's id from the TextRecord's id field

This is toolkit-portable way to get mol.id.

Parameters mol (a TextRecord) - the molecule

Returns a string

# 8.44.29 set\_id (text\_toolkit)

```
chemfp.text_toolkit.set_id(mol, id)
```

Set the TextRecord's id to the new id

This is the toolkit-portable way to write mol.id = id.

Note: this does not modify mol.record. Use chemfp.text\_toolkit.create\_string() or similar text\_toolkit functions to get the record text with a new identifier.

#### **Parameters**

- mol (a TextRecord) the molecule
- id (string) the new id

Returns None

### 8.44.30 read\_sdf\_records (text\_toolkit)

```
chemfp.text_toolkit.read_sdf_records(source=None, reader_args=None, compres-
sion=None, errors="strict", location=None,
block size=327680)
```

Return an iterator that reads each record from an SD file as a string.

Iterate through the records in *source*, which must be in SD format. If *compression* is None or "auto" then auto-detect the compression type based on *source*, and default to uncompressed when it can't be determined. Use "gz" when the input is gzip compressed, and "none" or "" if uncompressed.

The reader\_args parameter is currently unused. It exists for future compatability.

The *errors* parameter specifies how to handle errors. "strict" raises an exception, "report" sends a message to stderr and goes to the next record, and "ignore" goes to the next record.

The location parameter takes a chemfp.io.Location instance. If None then a default Location will be created.

The *block\_size* parameter is the number of bytes to read from the SD file. The current implementation reads a block, iterates through the records in the block, then prepends any remaining text to the start of the next block. You shouldn't need to change this parameter, but if you do, please let me know.

Note: to prevent accidental memory consumption if the input is in the wrong format, a complete record must be found within the first 327680 bytes or 5\*block\_size bytes, whichever is larger.

The parser has only a basic understanding of the SD format. It knows how to handle the counts line, the SKP property, and even tag data with the value '\$\$\$. It is not a full validator and it does not know chemistry.

See <code>read\_sdf\_ids\_and\_records()</code> if you want (id, record) pairs, and <code>read\_sdf\_ids\_and\_values()</code> if you want (id, tag data) pairs. See <code>read\_sdf\_ids\_and\_records\_from\_string()</code> to read from a string instead of a file or file-like object.

#### **Parameters**

- source (a filename, file object, or None to read from stdin) the SDF source
- reader\_args (currently ignored) currently ignored
- compression (one of "auto", "none", "", or "gz") the data content compression method
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.RecordReader() iterating over the records as a string

# 8.44.31 read\_sdf\_ids\_and\_records (text\_toolkit)

```
chemfp.text\_toolkit.read\_sdf\_ids\_and\_records (source=None, id\_tag=None, reader\_args=None, compression=None, errors="strict", location=None, encoding="utf8", encoding\_errors="strict", block size=327680)\\ \\ id\_tag=None, compressione, compressione, compressione, location=None, encoding="utf8", encoding\_errors="strict", block size=327680)\\ \\
```

Return an iterator that reads the (id, record string) pairs from an SD file

See read\_sdf\_records() for most parameter details. That function iterates over the records, while this one iterates over the (id, record) pairs. By default the id comes from the title line. Use id\_tag to get the record id from the given SD tag instead.

See  $read\_sdf\_ids\_and\_values()$  if you want to read an identifier and tag value, or two tag values, instead of returning the full record.

#### **Parameters**

• source (a filename, file object, or None to read from stdin) - the SDF source

- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (currently ignored) currently ignored
- compression (one of "auto", "none", "", or "gz") the data content compression method
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.IdAndRecordReader iterating (id, record string) pairs

# 8.44.32 read\_sdf\_ids\_and\_values (text\_toolkit)

Return an iterator that reads the (id, tag value string) pairs from an SD file

See  $read\_sdf\_records()$  for most parameter details. That function iterates over the records, while this one iterates over the (id, tag value) pairs.

By default this uses the title line for both the id and tag value strings. Use  $id\_tag$  and  $value\_tag$ , respectively, to use a given tag value instead. If a tag doesn't exist then None will be used.

#### **Parameters**

- source (a filename, file object, or None to read from stdin) the SDF source
- id\_tag(string, or None to use the record title)  $\operatorname{SD}$  tag containing the record id
- $\bullet$  value\_tag (string, or None to use the record title) SD tag containing the value
- reader\_args (currently ignored) currently ignored
- compression (one of "auto", "none", "", or "gz") the data content compression method
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.IdAndRecordReader iterating (id, value string) pairs

# 8.44.33 read\_sdf\_records\_from\_string (text\_toolkit)

```
chemfp.text\_toolkit.read\_sdf\_records\_from\_string(content, reader\_args=None, compression=None, errors="strict", location=None, block size=327680)
```

Return an iterator that reads each record from a string containing SD records

See read\_sdf\_records\_from\_string() for the parameter details. The main difference is that this function reads from content, which is a string containing 0 or more SDF records.

If content is a (Unicode) string then it must only contain ASCII characters, the records will be returned as strings, and the compression option is not supported. If content is a byte string then the records will be returned as byte strings, and compression is supported.

See read\_sdf\_ids\_and\_records\_from\_string() to read (id, record) pairs and read\_sdf\_ids\_and\_values\_from\_string() to read (id, tag value) pairs.

#### **Parameters**

- content (string or bytes) a string containing zero or more SD records
- reader\_args (currently ignored) currently ignored
- compression (one of "auto", "none", "", or "gz") the data content compression method
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.RecordReader iterating over each record as a string

# 8.44.34 read\_sdf\_ids\_and\_records\_from\_string (text\_toolkit)

```
\label{lem:chemfp:text_toolkit.read_sdf_ids_and_records_from_string} (content=None, \\ id\_tag=None, \\ id\_tag=None, \\ reader\_args=None, \\ compression=None, \\ errors="strict", \\ location=None, \\ encoding="utf8", \\ encoding\_errors="strict", \\ block\_size=327680) \\ \end{cases}
```

Return an iterator that reads the (id, record) pairs from a string containing SD records

This function reads the records from *content*, which is a string containing 0 or more SDF records. It iterates over the (id, record) pairs. By default the id comes from the first line of the SD record. Use  $id\_tag$  to use a given tag value instead. See  $read\_sdf\_records()$  for details about the other parameters.

If content is a (Unicode) string then it must only contain ASCII characters, the records will be returned as strings, the compression option is not supported, and the encoding and encoding\_errors parameters are ignored.

If content is a byte string then the records will be returned as byte strings, compression is supported, and the encoding and encoding\_errors parameters are used to parse the id.

#### **Parameters**

- content (string or bytes) a string containing zero or more SD records
- id\_tag(string, or None to use the record title) SD tag containing the record id
- reader\_args (currently ignored) currently ignored
- compression (one of "auto", "none", "", or "gz") the data content compression method
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.IdAndRecordReader iterating over the (id, record string) pairs

# 8.44.35 read\_sdf\_ids\_and\_values\_from\_string (text\_toolkit)

```
\label{lem:chemfp.text_toolkit.read_sdf_ids_and_values_from_string} (content=None, \\ id\_tag=None, \\ value\_tag=None, \\ compression=None, \\ reader\_args=None, \\ errors="strict", lo-cation=None, encoding="utf8", encoding\_errors="strict", \\ block\_size=327680) \\ \end{aligned}
```

Return an iterator that reads the (id, value) pairs from a string containing SD records

This function reads the records from *content*, which is a string containing 0 or more SDF records. It iterates over the (id, value) pairs, which by default both contain the title line. Use  $id\_tag$  and  $value\_tag$ , respectively, to use a given tag value instead. If a tag doesn't exist then None will be used.

If content is a (Unicode) string then it must only contain ASCII characters, the compression option is not supported, and the encoding and encoding\_errors parameters are ignored.

If content is a byte string then the records will be returned as byte strings, compression is supported, and the encoding and encoding\_errors parameters are used to parse the id and value.

See read\_sdf\_records() for details about the other parameters.

#### **Parameters**

- content (string or bytes) a string containing zero or more SD records
- $id\_tag(string, or None to use the record title) SD tag containing the record id$
- $\bullet$  value\_tag (string, or None to use the record title) SD tag containing the value
- reader\_args (currently ignored) currently ignored

- compression (one of "auto", "none", "", or "gz") the data content compression method
- errors (one of "strict", "report", or "ignore") specify how to handle errors
- location (a *chemfp.io.Location* object, or None) object used to track parser state information

Returns a chemfp.base\_toolkit.IdAndRecordReader iterating over the (id, value) pairs

# 8.44.36 get\_sdf\_tag (text\_toolkit)

```
chemfp.text_toolkit.get_sdf_tag(sdf_record, tag)
```

Return the value for a named tag in an SDF record string

Get the value for the tag named tag from the string sdf\_record containing an SD record.

### **Parameters**

- sdf\_record (string) an SD record
- tag(string) a tag name

**Returns** the corresponding tag value as a string, or None

# 8.44.37 add\_sdf\_tag (text\_toolkit)

```
\verb|chemfp.text_toolkit.add_sdf_tag| (\textit{sdf\_record}, \textit{tag}, \textit{value})|
```

Add an SD tag value to an SD record string

This will append the new tag and value to the end of the tag data block in the  $sdf\_record$  string.

#### **Parameters**

- sdf\_record (string) an SD record
- tag (string) a tag name
- value (string) the new tag value

Returns a new SD record string with the new tag and value

### 8.44.38 get\_sdf\_tag\_pairs (text\_toolkit)

```
chemfp.text_toolkit.get_sdf_tag_pairs(sdf_record)
```

Return the (tag, value) entries in the SDF record string

Parse the *sdf\_record* and return the tag data as a list of (tag, value) pairs. The type of the returned strings will be the same as the type of the input sdf\_record string.

Parameters  $sdf_record(string)$  - an SDF record

Returns a list of (tag, value) pairs

# 8.44.39 get\_sdf\_id (text\_toolkit)

```
chemfp.text_toolkit.get_sdf_id(sdf_record)
```

Return the id for the SDF record string

The id is the first line of the  $sdf\_record$ . A future version of this function may support an  $id\_tag$  parameter. Let me know if that would be useful.

The returned id string will have the same type as the input sdf\_record.

```
Parameters sdf_record(string) – an SD record
```

Returns the first line of the SD record

# 8.44.40 set\_sdf\_id (text\_toolkit)

```
chemfp.text_toolkit.set_sdf_id(sdf_record, id)
```

Set the id of the SDF record string to a new value

Set the first line of sdf record to the new id, which must not contain a newline.

The sdf\_record and the id must have the same string type.

### **Parameters**

- sdf\_record (string) an SDF record
- id (string) the new id

# 8.45 chemfp.\_text\_toolkit module (private)

As you might have inferred from the leading "\_" in "\_text\_toolkit", this is not a public module. There is no reason for you to import it directly, the module name is subject to change, and even the location of the classes is also subject to change. The reason why I even bring it up is because the <code>chemfp.text\_toolkit</code> returns class instances from this module, so you might well wonder about them.

### 8.45.1 TextRecord

class chemfp.\_text\_toolkit.TextRecord

Base class for the text\_toolkit 'molecules', which work with the records as text.

The *chemfp.text\_toolkit* implements the toolkit API, but it doesn't know chemistry. Instead of returning real molecule objects, with atoms and bonds, it returns TextRecord subclass instances that hold the record as a text string.

As an implementation detail (which means its subject to change) there is a subclass for each of the support formats.

- SDFRecord holds "sdf" records
- SmiRecord holds "smi" records (the full line from a "smi" SMILES file)
- CanRecord holds "can" records (the full line from a "can" SMILES file)
- UsmRecord holds "usm" records (the full line from a "usm" SMILES file)
- SmiStringRecord holds "smistring" records (only the "smistring" SMILES string; no id)

- CanStringRecord holds "canstring" records (only the "canstring" SMILES string; no id)
- UsmStringRecord holds "usmstring" records (only the "usmstring" SMILES string; no id)

All of the classes have the following attributes: .. py:attribute:: id

The record identifier as a Unicode string, or None if there is no identifier

### id\_bytes

The record identifier as a byte string, or None if there is no identifier

#### record

The record, as a string. For the smistring, canstring, and usmstring formats, this is only the SMILES string.

### record\_format

One of "sdf", "smi", "can", "usm", "smistring", "canstring", or "usmstring".

The SMILES classes have an attribute:

#### smiles

The SMILES string component of the record.

### add\_tag(tag, value)

Add an SD tag value to the TextRecord

This methods does nothing if the record is not an "sdf" record.

#### **Parameters**

- tag (string) the SD tag name
- value (string) the text for the tag

Returns None

### get\_tag(tag)

Get the named SD tag value, or None if it doesn't exist or is not an "sdf" record.

Parameters tag (byte or Unicode string) - the SD tag name

Returns a Unicode string, or None

### get\_tag\_as\_bytes(tag)

Get the named SD tag value, or None if it doesn't exist or is not an "sdf" record.

Parameters tag (byte string) - the SD tag name

**Returns** a byte string, or None

#### get\_tag\_pairs()

Get a list of all SD tag (name, value) pairs for the TextRecord using Unicode strings

This function returns an empty list if the record is not an "sdf" record.

Returns a list of (Unicode string name, Unicode string value) pairs

#### get\_tag\_pairs\_as\_bytes()

Get a list of all SD tag (name, value) pairs for the TextRecord using byte strings

This function returns an empty list if the record is not an "sdf" record.

Returns a list of (byte string name, byte string value) pairs

```
copy()
```

Return a new record which is a copy of the given record

### 8.45.2 SDFRecord

```
class chemfp._text_toolkit.SDFRecord
    Holds an SDF record. See chemfp._text_toolkit.TextRecord for API details
```

### 8.45.3 SmiRecord

```
class chemfp._text_toolkit.SmiRecord
    Holds an "smi" record. See chemfp._text_toolkit.TextRecord for API details
```

### 8.45.4 CanRecord

```
class chemfp._text_toolkit.CanRecord
    Holds an "can" record. See chemfp._text_toolkit.TextRecord for API details
```

### 8.45.5 UsmRecord

```
class chemfp._text_toolkit.UsmRecord
    Holds an "usm" record. See chemfp._text_toolkit.TextRecord for API details
```

# 8.45.6 SmiStringRecord

```
class chemfp._text_toolkit.SmiStringRecord
    Holds an "smistring" record. See chemfp._text_toolkit.TextRecord for API details
```

# 8.45.7 CanStringRecord

```
class chemfp._text_toolkit.CanStringRecord
    Holds an "canstring" record. See chemfp._text_toolkit.TextRecord for API details
```

# 8.45.8 UsmStringRecord

# 8.46 chemfp.io module

This module implements a single public class, *Location*, which tracks parser state information, including the location of the current record in the file. The other functions and classes are undocumented, should not be used, and may change in future releases.

### 8.46.1 Location

### class chemfp.io.Location

Get location and other internal reader and writer state information

A Location instance gives a way to access information like the current record number, line number, and molecule object.:

```
>>> import chemfp
>>> with chemfp.read_molecule_fingerprints("RDKit-MACCS166",
                            "ChEBI lite.sdf.gz", id tag="ChEBI ID") as___
. . .
→reader:
     for id, fp in reader:
        if id == "CHEBI:3499":
            print("Record starts at line", reader.location.lineno)
            print("Record byte range:", reader.location.offsets)
. . .
            print("Number of atoms:", reader.location.mol.GetNumAtoms())
            break
. . .
[08:18:12] S group MUL ignored on line 103
Record starts at line 3599
Record byte range: (138171, 141791)
Number of atoms: 36
```

The supported properties are:

- filename a string describing the source or destination
- lineno the line number for the start of the file
- mol the toolkit molecule for the current record
- offsets the (start, end) byte positions for the current record
- output\_recno the number of records written successfully
- recno the current record number
- record the record as a text string
- record format the record format, like "sdf" or "can"

Most of the readers and writers do not support all of the properties. Unsupported properties return a None. The *filename* is a read/write attribute and the other attributes are read-only.

If you don't pass a location to the readers and writers then they will create a new one based on the source or destination, respectively. You can also pass in your own Location, created as Location(filename) if you have an actual filename, or Location.from\_source(source) or Location.from\_destination(destination) if you have a more generic source or destination.

```
__init__(filename=None)
```

Use filename as the location's filename

#### from source(cls, source)

Create a Location instance based on the source

If *source* is a string then it's used as the filename. If *source* is None then the location filename is "<stdin>". If *source* is a file object then its name attribute is used as the filename, or None if there is no attribute.

#### from destination(cls, destination)

Create a Location instance based on the destination

If destination is a string then it's used as the filename. If destination is None then the location filename is "<stdout>". If destination is a file object then its name attribute is used as the filename, or None if there is no attribute.

### \_\_repr\_\_()

Return a string like 'Location("<stdout>")'

### first\_line

Read-only attribute.

The first line of the current record

#### filename

Read/write attribute.

A string which describes the source or destination. This is usually the source or destination filename but can be a string like "<stdin>" or "<stdout>".

#### mol

Read-only attribute.

The molecule object for the current record

#### offsets

Read-only attribute.

The (start, end) byte offsets, starting from 0

start is the record start byte position and end is one byte past the last byte of the record.

### output\_recno

Read-only attribute.

The number of records actually written to the file or string.

The value recno - output\_recno is the number of records sent to the writer but which had an error and could not be written to the output.

#### recno

Read-only attribute.

The current record number

For writers this is the number of records sent to the writer, and output\_recno is the number of records successfully written to the file or string.

#### record

Read-only attribute.

The current record as an uncompressed text string

### record\_format

Read-only attribute.

The record format name

#### where()

Return a human readable description about the current reader or writer state.

The description will contain the filename, line number, record number, and up to the first 40 characters of the first line of the record, if those properties are available.

What's New / CHANGELOG

# 9.1 What's new in 3.5 (27 January 2021)

### 9.1.1 Access to SearchResult hit data

This release of chemfp adds significantly better integration of chemfp's search results with NumPy. The new method <code>SearchResult.as\_numpy\_array()</code> and the helper methods <code>SearchResult.get\_scores\_as\_numpy\_array()</code>, return a zero-copy NumPy array view of chemfp's own internal data structures. This has lower memory overhead and higher performance than <code>SearchResult.get\_scores()</code>, which returns a copy of the underlying data. The <code>to\_csr()</code> method is about 15% faster by using the new API.

The new methods  $as\_buffer()$  and  $as\_ctypes()$  provide alterate ways to access the search result data, as a Python buffer and as a ctypes array, respectively. These are mostly used internally to improve the performance of other parts of the chemfp API. Additionally,  $get\_ids\_and\_scores()$  was implemented in C for better performance.

Warning: Do not attempt to use the NumPy array, ctypes array, or buffer object after the search result has been dellocated or resized as it will likely cause chemfp to segfault.

### 9.1.2 Changes to SearchResult sorting

There are two new *SearchResult.reorder()* options: increasing-score-plus and decreasing-score-plus. The first sorts the hits by increasing score, and breaks ties by sorting by increasing index. The second sorts the hits by decreasing score, and breaks ties by sorting by increasing index.

The increasing-score and decreasing-score implementations are now about 9x faster. This was done by improving data locality, improving the sort algorithm, and by not doing a secondary sort on the index. For example, for 1024-bit fingerprints only 4 bytes of the 8-byte score need to be tested.

**Note:** The previous implementations of increasing-score and decreasing-score sorted on both the score and the index, even if the latter wasn't needed. This implementation detail was not documented. If you need the old behavior, switch to the new -plus options.

Warning: The contents of the NumPy array, ctypes array, and buffer are writeable but they should only be used to reorder existing hits. In particular, the search result keeps track of which search type was used, in order to pick a faster sort method appropriate for those values. It may fail to sort scores which are not possible for the given sort type.

# 9.1.3 CDK support

The biggest change in this release is support for the CDK toolkit, via the JPype adapter. [See the *installation details* for help installing.] The new command-line program cdk2fps processes structure files to produce fingerprints in FPS or FPB format. The new  $chemfp.cdk\_toolkit$  module implements the chemfp toolkit API so you can work with CDK using the same API as the other supported toolkits.

The following *fingerprint types* are supported:

```
CDK-Daylight, CDK-GraphOnly, CDK-MACCS, CDK-EState, CDK-Extended, CDK-Hybridization, CDK-Pubchem, CDK-Substructure, CDK-ShortestPath, CDK-ECFP0, CDK-ECFP2, CDK-ECFP4, CDK-ECFP6, CDK-FCFP0, CDK-FCFP2, CDK-FCFP6, CDK-FCFP4, CDK-FCFP6, CDK-FCFP6
```

(The Java implementation on macOS appears to have problem accessing CDK's Klekota-Roth fingerprint.)

The supported CDK formats are smi, can, usm, smistring, canstring, usmstring, inchi, inchistring, inchikey, inchikeystring, sdf, and molfile.

## 9.1.4 New "builtin" fingerprint family

This release adds the "builtin" fingerprint family which uses the C compiler intrinsic \_\_builtin\_popcountll() instead of chemfp's lovingly hand-crafted assembly code. The performance depends very much on how well the compiler is able to able to optimize the intersection popcount algorithm.

So far chemfp's hand-written POPCNT and AVX2 implementations are nearly always faster than the "builtin" family, though with the newest compilers, compiled with -march=native the builtin POPCNT can be about 5% faster than chemfp's.

The "builtin" fingerprint family is currently meant for experimental use, primarily by chemfp source licencees who want to try chemfp on non-Intel/non-AMD platforms like the Apple M1 chip or other ARM system, or cross-compiling to WASM, or for the very small number of people who have a chip implementing the AVX-512 POPCNT.

To try it out, set the CHEMFP\_FAMILIES environment variable to builtin. To test it out, see the report from python -m chemfp.bitops.

As an internal detail, the specialized search implementations for different popcount methods used to be generated by some hard-to-maintain C preprocessor macros. This has been replaced by a code generation tool in Python.

### 9.1.5 New features

Added allow\_mmap option to open() and load\_fingerprints(). The default value of True lets chemfp use mmap to read an uncompressed FPB file. Use False to have chemfp read the contents of the FPB file into memory. This may improve performance on network-based filesystems, at the cost of higher memory usage.

Added --no-mmap option to simsearch command-line options to prevent chemfp from using mmap to access uncompressed FPB files.

Added FingerprintArena.random\_choice() which returns a randomly selected (id, fingerprint) pair and FingerprintList.random\_choice() which returns a randomly selected fingerprint.

### 9.1.6 Deprecation notice

The SearchResult.clear() and SearchResults.clear\_all() methods will be removed in some future version of chemfp. They don't seem to be useful, and they don't interact well with the new methods to view the underlying search data as a NumPy array, ctypes array, or buffer.

### 9.1.7 Notable bug fixes

chemfp.gzio now correctly handles corrupted gzip files where the CRC checksum test fails.

simsearch's NxN search now respects the --target-format setting.

Various minor bug fixes related to error handling,

# 9.2 What's new in 3.4.1 (27 August 2020)

The main changes in this release were to improve support for "non-standard" fingerprint lengths. Previous releases had special support for the most common fingerprint lengths in cheminformatics; 166-bit (24-byte), 512-bit (64 byte), 881-bit (112 byte), 1024-bit (128 byte), and 2048-bit (256 byte) fingerprints. This release extends that special support to a wider set of lengths.

# 9.2.1 New POPCNT implementations

Added specialized POPCNT implementations for all 8-byte-multiple fingerprint lengths up to 1024 bytes, plus faster implementations for 8-byte and 32-byte multiple lengths beyond that.

The new specialized POPCNT algorithms are 10-30% faster than chemfp 3.4 for tiny fingerprints (<512 bits) and 0-10% faster for larger fingerprints. For tiny fingerprints the new algorithms are about 20% faster than chemfp 1.6.1. For larger fingerprints, 3.4.1 is about 5% faster than 1.6.1.

### 9.2.2 New AVX2 implementations

Added a specialized AVX2 implementation for 1024 bits. This is only about 0.5% faster than the version in 3.4, but meant to avoid the slight overhead from the bug fix described below.

Added specialized AVX2/POPCNT hybrid implementations for 160, 192, and 224 bytes (1280, 1536, and 1792 bits). These are about 33%, 25%, and 20% faster than the POPCNT equivalents. Note that the 2048-bit AVX2 search performance is about the same as the 1536-bit performance, so if all you care about is performance then you should never use a length between 160 and 256 bytes.

### 9.2.3 New FingerprintArena methods

Added two new FingerprintArena methods. FingerprintArena.sample() randomly selects a subset of the fingerprints and returns them in a new arena. FingerprintArena.train\_test\_split() returns two randomly selected and disjoint subsets of the area, typically used as a training set and a test set.

### 9.2.4 Bug fixes

There are also two bug fixes:

- Fixed bug in fpcat where using --reorder would write the FPS header twice.
- Fixed bug in AVX2 implementation when the storage size was a multiple of 1024 bits but the fingerprint size was smaller.

# 9.3 What's new in 3.4 (24 June 2020)

This is summary of the changes since chemfp 3.3. For more details, see the individual intermediate changelog entries below.

## 9.3.1 J. Cheminf. publication

There is a two year gap between the 3.3 and 3.4 releases. More than six months of that time went to writing the paper "The chemfp project" for the Journal of Cheminformatics, which covers all of the major aspects of chemfp.

Dalke, Andrew. The chemfp project. J. Cheminformatics 11, 76 (2019). https://doi.org/10.1186/s13321-019-0398-8 https://jcheminf.biomedcentral.com/articles/10.1186/s13321-019-0398-8

Towards the end of writing the paper I realized there was an improvement to the basic search algorithm. The naive Tanimoto calculation test against a threshold requires a floating-point division. I had replaced that with a faster comparison using integer multiplication. The newest version replaces that with a simple comparison of the popcount to an expected minimum value.

This increases the MACCS search performance by roughly 15%. For larger fingerprint lengths the improvement is only a few percent at best, which is expected as chemfp is mostly memory bandwidth bound, not CPU bound.

### 9.3.2 New licensing options

Pre-compiled chemfp distributions for Linux-based operating systems are now available at no cost under the "Chemfp Base License Agreement". Most of the chemfp features are available for internal use, except that:

- fingerprint arenas may not be larger than 50,000 fingerprints;
- in-memory arena searches may not have more than 50,000 queries or targets;
- FPS searches may not have more than 20 queries;
- Tversky search is disabled;
- writing FPB files is disabled.

These features can be enabled with a valid license key, set via the environment variable CHEMFP\_LICENSE. Email sales@dalkescientific.com to request a evaluation license or to purchase a license. Source distributions are also available.

To download the pre-compiled package for "manylinux" use:

```
python -m pip install chemfp -i https://chemfp.com/packages/
```

See LICENSE from the distribution or https://chemfp.com/BaseLicense.txt for full details.

## 9.3.3 Chemistry toolkit changes

RDKit: Added support for the "SECFP" SMILES-based circular fingerprints from the Reymond group. Added RDKit-Fingerprint branchedPaths and useBondOrder options. Added RDKit-Morgan includeRedundantEnvironments option. Added RDKit-AtomPair nBitsPerEntry, includeRedundantEnvironments, and use2D options. Added RDKit-Torsion nBitsPerEntry and includeChirality options.

RDKit (continued): New SMILES output option cxsmiles to include extra annotations. New SDF input option includeTags to disable importing SD tags. New SDF output option v3k to always use v3000 format. Added support for RDKit's Mol2, PDB, Maestro, XYZ, HELM, and FASTA parsers. Added a new "sequence" format to handle just the 1D sequence string.

Open Babel: Added support for 3.0. Added support for ECFP fingerprints, with family names: OpenBabel-ECFP0, OpenBabel-ECFP2, OpenBabel-ECFP4, OpenBabel-ECFP6, OpenBabel-ECFP8, OpenBabel-ECFP10. OpenBabel 3.0 includes new formats, which were automatically supported by chemfp.

OpenEye: Added support for OEChem's OEZ, CIF, mmCIF, PDB, FASTA, and CSV parsers. Added a new "sequence" format to handle just the 1D sequence string. Added experimental support for substructure screens, with the family names OpenEye-MoleculeScreen, OpenEye-MDLScreen, and OpenEye-SMARTSScreen.

### 9.3.4 Tool changes

Simsearch now accepts a structure input, either as a command-line argument or from a filename. It will use the fingerprint type from the target data set or a user-specified fingerprint type to convert the structures into fingerprints.

Added a --help-format option to rdkit2fps, ob2fps and oe2fps which shows all available input formats and their reader options.

# 9.3.5 I/O changes

Added support for Zstandard compression everywhere that gzip compression is supported. Use the filename or format extension ".zst" to indicate that compression type. Chemfp's RDKit toolkit adapater also supports Zstandard, but not the Open Babel and OpenEye adapters.

Note: Zstandard compression requires the third-party "zstandard" Python package be installed.

Improved the gzip reader performance by about 15%. Improved the FPS reader by about 20%. Overall, sdf2fps is about 10% faster extracting PubChem fingerprints from the PubChem sdf.gz files.

Improved FPB output performance by about 10% by using a C extension.

Chemfp now supports reading compressed FPB files, and reading FPB files from stdin. These are read entirely into memory before use as they cannot be memory-mapped. This was a feature request from a

customer who stored large fingerprint files on a network-based filesystem. It was faster to read a compressed file and decompress into memory than it was to memory-map and use the contents of an uncompressed file.

# 9.4 What's new in 3.4b3 (18 June 2020)

- Changed --list-formats to --help-formats.
- Updated oe2fps --help-formats.
- Fixed a bug in several OEChem create\_string() and create\_bytes() implementations where a non-None 'id' changed the molecule title.
- Finished updating the documentation.

# 9.5 What's new in 3.4b2 (12 June 2020)

- Changed the licensing model to let people use chemfp without a valid license key, with restrictions:
  - fingerprint arenas may not be larger than 50,000 fingerprints,
  - arena searches may not have more than 50,000 queries or targets,
  - FPS searches may not have more than 20 queries
  - Tversky searches are disabled, and writing FPB files is disabled.
- Added "includeTags" option for the RDKit toolkit SDF reader. The default of True parses the SD tag data. This isn't needed if you just want to generate fingerprints. rdkit2fps sets includeTags=False by default, for a ~5% speedup in parsing a PubChem file.
- Added Zstandard input and output options to sdf2fps.
- Fixed a couple of bugs in the new gzio module. Better code to handle finding libz, and support for different response codes for older versions of libz.
- Added compression --level option to fpcat
- Support OEChem 2.3 from 2019.Oct.
- Added support for OEChem formats OEZ, CIF, mmCIF, PDB, FASTA, and CSV. Also implemented a "sequence" format based on the FASTA reader.
- Added experimental support for OpenEye's fingerprint-like screens. The new fingerprint family names are OpenEye-MoleculeScreen, OpenEye-MDLScreen, and OpenEye-SMARTSScreen. The functions are type-based: QMols produce query screens and "regular" molecules produce target screens.
- get\_fingerprint\_families() now supports an optional "toolkit\_name" parameter which loads and returns only the fingerprints families for the specified toolkit.
- BUG FIX: some OpenEye toolkit writers, when passed a new identifier, SetTitle(new\_id) on the molecule before writing, but did not SetTitle(old\_id) to restore original id.
- BUG FIX: the code did not check for fingerprint generation failures when using OEChem/OEGraphSim. Fixed the code so it doesn't an empty molecule returns an empty fingerprint, instead of reusing whatever the previous fingerprint was.
- Fixed a number of issues identified by PyFlakes, including some bugs, mostly related to error conditions which weren't tested.

# 9.6 What's new in 3.4b1 (24 April 2020)

- Support Open Babel 3.0.
- Support Open Babel ECFP fingerprints. Requires Open Babel 3.0 or later. Use --nBits to specify a size other than the default of 4096 bits. (Must be a power of 2, and at least 32.)
- Support RDKit parsers for FASTA, sequence, HELM, Mol2, PDB, Maestro and XYZ formats.
- RDKit SMILES writers now support the "cxsmiles" boolean flag to generate CXSMILES strings. RDKit SDF and Molfile writers support "v3k" boolean flag to always generate V3000 records.
- Added support for RDKit SECFP fingerprints, developed by the Reymond group. These are circular
  fingerprints similar to ECFP fingerprints except they use canonical fragment SMILES for the circular
  substructures to generate hash values.
- Added support for additional RDKit fingerprint parameters:
  - RDKit-Fingerprint: branchedPaths and useBondOrder
  - RDKit-Morgan: includeRedundantEnvironments
  - RDKit-AtomPair: nBitsPerEntry, includeChirality, and use2D
  - RDKit-Torsion: nBitsPerEntry, includeChirality
- Added support for Zstandard compression everywhere gzip is supported, except for the Open Babel and OpenEye toolkits, where the native toolkits do not support Zstandard and do not accept a Python file object.
- Sped up FPB generation for ChEMBL by about 9% by rewriting several parts of the FPID block writer code in C.
- Faster gzip read performance when reading from stdin or a named file. The new module calls zlib functions directly, which gives 15-25% improved performance. If you have problems with the new gzip reader, you can disable it be setting the environment variable CHEMFP USE SYSTEM GZIP to 1.
- For even faster gzip read performance, chemfp can use an external program to decompress stdin or a named file. If the environment variable CHEMFP\_GZCAT is set then chemfp will interpret it as command-line arguments to use in a subprocess. This may be zcat, gzcat or gzip -dc, or pigz -dc. (NOTE: this variable was named CHEMFP\_GZCAT\_BINARY in the a4 release.)

In one test of simsearch, using 1.7M 2048-bit RDKit Morgan fingerprints from ChEMBL 23, measuring wall-clock time:

- a search of the uncompressed file took 1.45 seconds
- CHEMFP\_GZCAT=gzcat took 2.16 seconds (3.07 of total user time)
- the new gzip reader took 3.65 seconds
- CHEMFP\_USE\_SYSTEM\_GZIP=1 took 4.36 seconds

Note that part of the speedup is because gzcat runs in another process so take better advantage of multicore hardware. (That is, I measured wall-clock time on a multicore machine, not overall CPU time.)

- Improved the error handling when chemfp uses an external program to decompress an gzip'ed file. NOTE: IT IS NOT FOOLPROOF! Chemfp waits 0.01 seconds to see if gzcat has exited unexpectedly, which might happen if the file does not exist or cannot be read. However, there is a chance that gzcat may take longer to report an error. In addition, chemfp does not detect if gzip exited early because the file was corrupt or incomplete.
- Added a --list-formats options to oe2fps, rdkit2fps, and ob2fps, which gives more detailed information about the supported input structure file formats and their options.

• No longer including or using a copy of unittest2, which was needed for Python 2.6 support.

# 9.7 What's new in 3.4a4 (18 March 2020)

• simsearch accepts a structure file as query input. Use --in or --query-format to specify the format type, or let chemfp try to figure out from the filename extension.

If the fingerprint type is not specified with --query-type then the target file metadata must specify the type.

The --id-tags, --delimiter, --has-header, -R and --errors options from the \*2fps programs are also supported.

- The OEChem SMILES and InChI readers now support the has\_header reader\_arg to skip the first line of the file. Use --has-header to enable that feature in oe2fps.
- FPB files may now be read from stdin, and fpb.gz files are supported. Unlike regular FPB files, which are memory-mapped, the contents of these files are read into memory before use. The main use case for fpb.gz files is to reduce network I/O if the files are on a remote disk.
- Changed the FPS reader block size from around 11K to 100K, giving a 20% boost in read performance and 10% boost in fpcat performance. The smaller block size was chosen 10 years ago, on much less powerful hardware.
- Experimental support for zstd compression, based on the filename ending with either .fps.zst or .fpb.zst. This depends on the third-party "zstandard" package. My experience is that piping gzip output to chemfp is faster than letting chemp use Python's built-in gzip reader or using zstandard.
- Experimental support to use an external binary to decompress a gzip file. Set "CHEMFP\_GZCAT\_BINARY" to "gzcat" or "zcat" or whatever program you use to read a gzip-compressed file (passed on the command-line) and write the uncompressed contents to stdout. My timings show using an external program is 25% faster than using Python's built-in gzip module.

### 9.8 What's new in version 3.4a2

Released 7 June 2019

Performance improvements for Tanimoto search. Older versions used a fast rejection test based on a rational approximation to the threshold. It required two multiplications for each test. The new implementation uses an exact test based on the minimum required intersection count, with only one comparison per test.

The chemfp benchmark suggests timing improvements like:

- 10-20% faster for 166 bits (POPCNT)
- 1-10% faster for 881 bits (POPCNT)
- 2-7% faster for 1024 bits (POPCNT)
- 0-9% faster for 1024 bits (AVX2)
- 0-2% faster for 2048 bits (POPCNT)
- 0-10% faster for 2048 bits (AVX2)

These numbers will be firmed up for the 3.4 release.

Improved error handling for oe2fps, ob2fps, and rdkit2fps when the underlying toolkit is not installed.

BUG FIX: Fixed several errors related to storing 4GB or more of record identifier strings. This can occur if your id contains both the id and the SMILES or other large data, or if you have many fingerprints each with a large id (eg, an IUPAC name). The FPB format has a design limit of about 250M records, corresponding to 17.2 characters per id before the old code would break.

BUG FIX: the Avalon fingerprint type is now registered. Previously it worked only if one of the other RDKit fingerprint types was used first.

BUG FIX: the simseach metadata now uses #query\_source and #target\_source instead of #query\_sources and #target\_sources.

BUG FIX: Fixed bug which prevented reading FPS files using the Windows newline convention.

BUG FIX: Fixed segfault when hex\_to\_bitlist or hex\_contains were called with the wrong number of arguments.

BUG FIX: simsearch --query incorrectly included a #query\_sources in the output, as a duplicate of #target\_sources. Now it correctly omits #query\_sources.

# 9.9 What's new in version 3.4a1

Released 6 November 2018

Added the arena methods to\_numpy\_array() and to\_numpy\_bitarray(). The first returns a NumPy array view of the underlying fingerprint data, as uint8 values, including pad bytes. This array makes it easier for other programs to work directly with the chemfp fingerprint data. The second creates a new NumPy array with one uint8 byte per fingerprint bit. The default returns all bits, or you can specific which bit columns to use. This function makes it easy to use fingerprint bits as descriptors for clustering or other predictive algorithms.

Added the *fingerprints* attribute to the FingerprintArena class. It gives list-like access the fingerprints. For example, it can be used to iterate over the fingerprints.

BUG FIX: count\_all() now uses a 64-bit integer. Previously it used as signed 32-bit integer, which could overflow for large results.

BUG FIX: removed a memory leak in symmetric threshold searches.

BUG FIX: Calling the Tversky threshold arena search with the Tanimoto values alpha=beta=1.0 now calls the (more optimized) Tanimoto arena search. Previous it called the Tanimoto arena search and then did the general Tversky search, taking over twice as long to give the same results.

BUG FIX: The knearest Tversky symmetric arena search did not release Python references if there was an allocation failure during the search. Now fixed.

BUG FIX: The FPS fingerprint writer didn't verify that the fingerprint length matched the number of bytes in the metadata. Fixed, and normalized the length change error message across the writers.

BUG FIX: The 3.3 broke support for compiling with --no-openmp. Fixed.

### 9.10 What's new in version 3.3

Released 16 August 2018

BUG FIX: the k-nearest symmetric Tanimoto and Tversky search code contained a flaw when there was more than one fingerprint with no bits set and the threshold was 0.0. Since all of the scores will be 0.0, the code uses the first k fingerprints as the matches. However, they put all of the hits into the first search result

(item 0), rather than the corresponding result for each given query. This also opened up a race condition for the OpenMP implementation, which could cause chemfp to crash.

Performance improvements for the POPCNT and AVX2-based searches. This was done by developing specialized versions of the Tanimoto and Tversky search functions for each of the POPCNT and AVX2 implementations, by initializing some of the AVX2 registers only once per search rather than once per popcount, by improving the rejection test for obvious mismatches, and by improving the alignment for AVX2 loads.

Releative to chemfp 1.5 (the latest free version of chemfp), version 3.3 is about 20-35% faster for 166-bit searches, 20-25% faster for 881-bit searches, and around 50% faster for 1024- and 2048-bit searches.

Relative to chemfp 3.2.1 (the previous version of chemfp), version 3.3 is 60% faster for 166-bit fingerprints, 15% faster for 881-bit fingerprints, 25% faster for 1024-bit fingerprints, and 15% faster for 2048-bit fingerprints.

Unindexed search (which occurs when the fingerprints are not in popcount order) now uses the fast popcount implementations rather than the generic byte-based one. The result is about 6x faster.

Changed the simsearch --times option for more fine-grained reporting. The output (sent to stderr) now looks like:

```
open 0.01 read 0.08 search 0.10 output 0.27 total 0.46
```

where 'open' is the time to open the file and read the metadata, 'read' is the time spent reading the file, 'search' is the time for the actual search, 'output' is the time to write the search results, and 'total' is the total time from when the file is opened to when the last output is written.

Added SearchResult.format\_ids\_and\_scores\_as\_bytes() to improve the simsearch output performance when there are many hits. Turns out the limiting factor in that case is not the search time but output formatting. The old code uses Python calls to convert each score to a double. The new code pushes that code into C. My benchmark used a k=all NxN search of  $\sim 2,000$  PubChem fingerprints to generate about 4M scores. The output time went from 15.60s to 5.62s. (The search time was only 0.11s on my laptop.)

There is a new option, "report-algorithm" with the corresponding environment variable CHEMFP\_REPORT\_ALGORITHM. The default does nothing. Set it to "1" to have chemfp print a description of the search algorithm used, including any specialization, and the number of threads. For examples:

```
chemfp search using threshold Tanimoto arena, index, single threaded (generic) chemfp search using threshold Tversky arena, index, single threaded (popcnt_128_128) chemfp search using knearest Tanimoto arena symmetric, OpenMP (popcnt_112), 8 threads
```

For the 'generic' searches, use CHEMFP\_REPORT\_INTERSECT=1 to see which specific popcount function is used.

There is a new option, "use-specialized-algorithms" with the corresponding environment variable CHEMFP\_USE\_SPECIALIZED\_ALGORITHMS. The default, "1", uses the new specialized algorithms mentioned above. Set it to "0" to have chemfp fall back to the generic algorithm. This option is primarily used for timing comparisons and may be removed in future versions of chemfp.

There is experimental multi-threaded support for single-query searches. By default it is disabled because on newer hardware it is slower than single-threaded search, and it will take time to figure out why.

The new option "num-column-threads" controls this feature. (In chemfp nomenclature, each query is a row, and the targets are columns.) By default it is 1, meaning that single-query searches are single-threaded. Change it to 2 or higher to enable the "OpenMP columns" algorithm. The number of threads used is the smaller of the number of column threads and the value of chemfp.get num threads().

For one benchmark, based on a threshold Tanimoto search of RDKit's 2048-bit fingerprint, the search time on my MacBook Pro laptop using POPCNT from 2011 goes from 19.7 to 16.1 seconds when I use 2 threads instead of 1. On the other hand, on a Skylake machine using AVX2 the time goes from 5.3 to 9.3 seconds.

Better error handling in simsearch so that I/O error prints an error message and exit rather than give a full stack trace. Testing this feature also identified bugs in the error handling code, which have been fixed.

# 9.11 What's new in version 3.2.1

Released 12 April 2018

The biggest change is in the chemfp license. The commercial version is now distributed under a propritary license instead of the MIT open source license.

There are two other minor changes. The build process now includes support for AVX2 by default, and the fingerprint writer classes have a new 'format' attribute which is either "fps" or "fpb", or is None if not defined.

### 9.11.1 License key

This marks the first release of chemfp with a proprietary license.

Or rather, licenses. There is an academic license and commercial licenses in various flavors. In addition, chemfp is still available under the open source MIT license, though that option is the most expensive. The chemfp 1.x series (currently chemfp 1.5) is still available for no cost under the MIT license, and receives updates, but it only supports Python 2.7 and it does not have as many features.

Chemfp 3.2.1 is available in source code and as a pre-compiled Python package which should run under most x86 64-bit Linux-based OSes. The pre-compiled packages requires a license key.

The license key is date locked. If a valid key is not found then "import chemfp" will print diagnostic messages to stderr and fingerprint search and arena generation functionality will be disabled. If you call one of the disabled functions then it will raise a NotImplementedError exception. Simsearch will not work, and neither will FPB generation.

Chemfp will look for the license key in the CHEMFP\_LICENSE environment variable. For example, in bash:

# export CHEMFP\_LICENSE=20101225-demo@HPDHKMHBIAENBEFLMCNKFGFAABNDGDOB

The first 8 digits are the year, month, and date that the license expires, in GMT. In this demo example the license expired at the end of Christmas Day of 2010.

After the date comes optional configuration data including a user identifier, followed by the '@', and ending with a validation key.

There is no centralized license manger, and you may run chemfp on as many computers at your site as you wish, within the limits of your license agreement.

There are two new API functions:

- chemfp.is\_licensed() return True if the license key is valid or no license key is needed, otherwise return False.
- chemfp.get\_license\_date() return the license key expiration date as a 3-element tuple in the form (year, month, day). If the license key is not found or does not pass the security check then the function returns None. If this version of chemfp does not need a license key then it returns (9999, 12, 25).

### 9.11.2 Why the change in license policy?

In 2009 or so I decided to see if I could make a living selling free software. Most people who develop open source software for chemistry get their funding from other sources. Academics might be funded from grants, a company might use an open source project for business reasons, as a way to lower overall costs. Some companies sell a proprietary product or access to a service which uses an open source component, where the income from the non-free sources funds the free software development. But I can only think of a one or two cases in where people tried to make a living off of the source code itself, and they were not that successful.

I had some ideas of how it might be successful, and tried them out. While I had some sales, I never made anywhere near what I would have made for the same effort as a consultant or contractor.

I also ran into some difficulties. Most software companies provide their software either free or with steep discounts to academic organizations. If I do that with the most recent version of chemfp, I take a rather large risk that some grad student will post the source on GitHub. (Pharmaceutical company employees are much less likely to do that.)

I charge a lot of money for chemfp, because the few people who need high performance similarity search are willing to pay for it. Potential customers want to try it out. Since I either control the copyright or use components which allow proprietary use, I was able to make a non-disclosure agreement for the evaluation period. Had I been using GPL-based components, and thus restricted to a free software license, that would have been impossible.

I could continue to work at it trying to make a living selling free software, but after 9 years of trying I decided it's time to switch to a more standard proprietary licensing scheme.

The chemfp 1.x line will still be available at no cost under the MIT license.

# 9.11.3 AVX2 popcount enabled by default

AVX2 compilation is now enabled by default. It was disabled in earlier releases because the AVX2 command-line flag was used to compile every file and I was worried that it might result in a binary which couldn't be used by older hardware. For this release I figured out how to use the -mssse3 and -mavx2 flags only for the relevant popcount calculations.

At run-time chemfp will detect which CPU-specific features are available and only use the SSSE3 or AVX2 implementations when appropriate.

## 9.12 What's new in version 3.2

Released 19 March 2018

This version mostly contains bug fixes and internal improvements. The biggest additions are support for Dave Cosgrove's 'flush' fingerprint file format, and support for 'fromAtoms' in some of the RDKit fingerprints.

The configuration has changed to use setuptools.

Previously the command-line programs were installed as small scripts. Now they are created and installed using the "console\_scripts" entry\_point as part of the install process. This is more in line with the modern way of installing command-line tools for Python.

If these scripts are no longer installed correctly, please let me know.

If you have installed the chemfp\_converters package then chemfp will use it to read and write fingerprint files in flush format. It can be used as output from the \*2fps programs, as input and output to fpcat, and as query input to simsearch.

Added "from Atoms" support for the RDKit hash, torsion, Morgan, and pair fingerprints. This is primarily useful if you want to generate the circular environment around specific atoms of a single molecule, and you know the atom indices. If you pass in multiple molecules then the same indices will be used for all of them. Out-of-range values are ignored.

The command-line option is **--from-atoms**, which takes a comma-separated list of non-negative integer atom indices. For examples:

```
--from-atoms 0
--from-atoms 29,30
```

The corresponding fingerprint type strings have also been updated. If from Atoms is specified then the string from Atoms = i, j, k, ... is added to the string. If it is not specified then the from Atoms term is not present, in order to maintain compability with older types strings. (The philosophy is that two fingerprint types are equivalent if and only if their type strings are equivalent.)

The --from-atoms option is only useful when there's a single query and when you have some other mechanism to determine which subset of the atoms to use. For example, you might parse a SMILES, use a SMARTS pattern to find the subset, get the indices of the SMARTS match, and pass the SMILES and indices to rdk2fps to generate the fingerprint for that substructure.

Be aware that the union of the fingerprint for --from-atoms X and the fingerprint for --from-atoms Y might not be equal to the fingerprint for --from-atoms X,Y. However, if a bit is present in the union of the X and Y fingerprints then it will be present in the X,Y fingerprint.

Why? The fingerprint implementation first generates a sparse count fingerprint, then converts that to a bitstring fingerprint. The conversion is affected by the feature count. If a feature is present in both X and Y then X,Y fingerprint may have additional bits sets over the individual fingerprints.

# **9.12.1** Bug fixes

Fixed a bug in FPB identifier index lookup. When the id's hash didn't exist, it got stuck in an infinite loop. There is a special token to identify the end of the hash chain. Unfortunately, that token wasn't marked as a b"byte string" during the Python 2to3 conversion, so that token was never found, causing the code to loop over the chain forever. It is now a byte string, and a check was added to prevent infinite loops.

Fixed a bug where a k=0 similarity search using an FPS file as the targets caused a segfault. The code assumed that k would be at least 1. If you do a k=0 search, it will currently read the entire file, checking for format errors, and return no hits.

Chemfp no longer generates Python warnings. That is, the regression tests all pass under "python -W error unit2 discover". The biggest problem was the ResourceWarning from all of the files which were never explicitly closed. They used to depend on the garbage collector to close the file but now use either through a context manager or with close(). In addition, several strings contains invalid escape characters and some regression tests used deprecated APIs.

The context manager and close() method for the FPBFingerprintAreana now close the underlying file object/mmap rather than depend on the garbage collector.

The readers and writers which are wrappers to an iterator which may hold a file object, and where the file object was created by chemfp, now know to close() the wrapped iterator when processing is over.

Added a check that the threshold and count symmetric arena searches have a popcount. Unordered arenas caused the code to segfault.

# 9.13 What's new in version 3.1

Released 17 September 2017

The new specialized POPCNT implementation for PubChem/CACTVS keys increases search performance for that case by about 15%.

The SearchResults object gained the *to\_csr()* method and the *shape* attribute. The new method returns a SciPy compressed sparse row matrix containing the similarity scores, which can be passed into scikit-learn for clustering.

The fall 2017 release of OEChem will accept InChI strings as structure input. The chemfp wrapper now knows about this, as well as the two new InChI output flavors "RelativeStereo" and "RacemicStereo".

The fall 2017 release of RDKit will fix a bug in the pattern fingerprint definitions. The new chemfp fingerprint type is RDKit-Pattern/4.

Changed how oe2fps, rdkit2fps, and ob2fps report missing or empty identifiers. Previously the default --errors setting of "ignore" simply skipped those records, without any warning messages. This caused problems processing the ChEBI SD file. Most of the records have an empty title line, so only a few fingerprint records were generated. It wasn't obvious that the resulting data set was useless. The new code always reports a warning for empty or missing identifiers, even with "ignore". If the --errors is "strict" then the warning becomes an error and processing stops.

Updated the #software line to include "chemfp/3.1" in addition to the toolkit information. This helps distinguish between, say, two different programs which generate RDKit Morgan fingerprints. It's also possible that a chemfp bug can affect the fingerprint output, so the extra term makes it easier to identify a bad dataset.

There are several small fixes related to memory leaks, the bytes/Unicode distinction in Python 3, error messages, and error handling.

Removed chemfp.progressbar and chemfp.futures. These were included in chemfp 1.1 because I used them in a project for one customer and thought they might be useful in future chemfp projects. They were not. Also removed chemfp.argparse because chemfp 3.0 dropped support for Python 2.6.

### 9.14 What's new in version 3.0.1

Released 28 August 2017

This is a bug-fix release. This fixes a critical bug in the general-purpose POPCNT popcount implementation and a bug in the code to detect the RDKit Pattern fingerprint change in 2017.3.

See the CHANGELOG for details.

# 9.15 What's new in version 3.0

Released 2 May 2017

Chemfp now supports both Python 2.7 and Python 3.5 or later. It no longer supports versions before Python 2.7. Chemfp will support Python 2.7 at least until 2020, which is the end-of-life for Python 2.7.

This required extensive changes to distinguish between text/Unicode strings and byte strings. The biggest user-facing change is that identifiers are now treated as Unicode strings. Fingerprints are still treated as byte strings.

This change is not backwards compatible. The APIs function parameters are polymorphic, so in most cases you can pass in either a Unicode string or a UTF-8 encoded byte string. However, the return type for an identifier is Unicode, which will likely cause problems with existing code which expects bytes.

All of the chemistry toolkits have decided to treat files as UTF-8 encoded. Chemfp's "text toolkit" offers limited support for reading Latin-1 encoded files. This is a tricky topic so contact me if you have questions or problems.

I have removed the "make\_string\_creator()" function because it was hard to explain, hard to maintain, and had little performance improvement over passing in the arguments to chemfp.create\_string(). This will break compatibility, but then again, I don't think anyone used it. If it is a problem, I suggest creating a function, as in the following:

```
>>> from chemfp import rdkit_toolkit as T
>>> mol = T.parse_molecule("c1cccc10", "smistring")
>>> T.create_string(mol, "smistring", writer_args = {"allBondsExplicit": True})
u'0-c1:c:c:c:c:c:1'
>>> def make_string(mol):
... return T.create_string(mol, "smistring", writer_args = {"allBondsExplicit": True})
...
>>> make_string(mol)
u'0-c1:c:c:c:c:c:1'
```

If you look carefully at the previous example, you'll see the other major backwards incompatibility. The function chemfp.create\_string() now return a Unicode string instead of a byte string. This also means its *format* parameter no longer accepts the ".zlib" or ".gzip" extensions.

Instead, to get the old behavior use the new API function chemfp.create\_bytes():

```
>>> T.create_bytes(mol, "smistring", writer_args = {"allBondsExplicit": True})
'0-c1:c:c:c:c:1'
>>> T.create_bytes(mol, "smistring.zlib", writer_args = {"allBondsExplicit": True})
'x\x9c\xf3\xd7M6\xb4J\x86CC\x00&\xc8\x04\x8d'
```

There's a similar change between chemfp.open\_molecule\_writer\_to\_string() and the new function chemfp.open\_molecule\_writer\_to\_bytes().

There are also some new features in version 3.0 which don't break compatibility.

Similarity search is faster because there are now specialized popcount implementations based on the fingerprint length. On one benchmark, 166-bit searches are 35% faster, 1024-bit searches are 25% faster, and 2048-bit searches are 5% faster.

There is a new popcount implementation for processors with the AVX2 instruction set. It is about 15% faster than the POPCNT version for 2048 bit fingerprints. To test it out you will have to compile chemfp with -with-avx2 enabled.

Added support for the Avalon fingerprints in RDKit, if RDKit has been compiled with Avalon support.

# 9.16 What's new in version 2.1

Released 2 July 2015

Version 2.1 adds Tversky support for every place there was Tanimoto search (except the handful of deprecated APIs). There are new search routines for FPS and arena searches, including OpenMP support, and new bitops functions to compute a Tversky index between two fingerprints.

The k-nearest arena searches now support OpenMP. Previously they were single threaded even though the other search functions supported multiple threads.

The built-in SDF parser saw a couple improvements, including support for both "\n" and "\r\n" newlines, instead of only "\n" newlines.

There were a number of bug fixes that concern edge cases. For example, some 64-bit double calculations could be off-by-one in the last digit, and fingerprints with 0 bits set could cause a few problems.

### 9.17 What's new in version 2.0

#### Released 8 April 2015

Version 2.0 includes many new features designed for web service development. The new "FPB" binary fingerprint file format is very fast to load, which is great for web server reloading during development and on the command-line. The speed comes from using a memory-mapped file, which also means that multiple chemfp instances can use the same file on the same machine without extra memory overhead.

The most extensive improvement is the new portable API for working with structure files and fingerprint types. The moment you start working with multiple chemistry toolkits, you realize that they all have different ways to read and write molecules, and to generate fingerprints from a molecule. Chemfp tries hard to have a consistent API for these common tasks, without sacrificing performance, so you can get get your work done. For example, with the new API it's easy to take an SD record as an input string, compute the MACCS fingerprints for each available toolkit, add the results as new SD tags, and return the updated record.

This sounds so easy, doesn't it? It took about a year to develop. The API is quite extensive, and includes the ability to pass toolkit-specific options to the underlying parsers, a low-level SDF parser that can be used to index a file, a way to get a list of available formats and fingerprint types, and methods to parse fingerprint arguments from strings.

New with version 2.0 is the ability to handle PubChem-sized data. Previous versions used 32 bit indexing and had a limit of 4GB, which is enough for 33M 1024-bit fingerprints, but PubChem has about twice that many structures.

There are also a lot of improvements, bug fixes, and performance tweaks. For example, the FPS reader is now almost twice as fast! For details, see the CHANGELOG file of the release.

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- perform Tversky searches
- perform Tanimoto searches of FPS files with more than 20 queries at a time.

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- Kim Walisch, <kim.walisch@gmail.com> (several popcount implementations, under the MIT license)
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**Future** 

The chemfp code base is solid and in use at many companies, some of whom have paid for the commercial version. It has great support for fingerprint generation, fast similarity search, and toolkit portability, but there's plenty left to do in future. Here's a mixture of things that are likely and things which are possibilties. Of course funding and feedback would help prioritize things. Let me know if you need something like one of these.

The current FPB format is limited to about 200M fingerprints, while the largest current databases are nearing 1B fingerprints. One workaround is to split the data set into multiple FPB files. Better would be to have a format which handles everything in a single file.

Right now you're limited to the built-in toolkit fingerprint types, plus chemfp's own SMARTS-based fingerprints. There should be a registration system so you can tell chemfp about user-defined fingerprint types.

The search implementations are optimized assuming the number of results is far fewer than the number of targets. As a result, threshold=0.0 searches are slower than they could be. I have some ideas for improving this, especially for the case where you want distribution of all-to-all scores.

I'm also interested in implementing a diversity selection method.

I would like some way to select fingerprint subsets. My original thought was something like an awk for the FPS format, with the ability to select N fingerprints at random, or those matching a given set of identifiers, etc. My current thought is to implement it as a sqlite virtual table.

Chemfp supports Tanimoto and Tversky similarity. I could also add support for other measures; cosine and Hamming seem like the most useful other alternatives.

Chemfp does not currently support Microsoft Windows computer because the code assumes the LP64 model, where "int" is 32 bits and "long" is 64 bits. It will require a lot of low-level work to tweak everything correctly for the Windows LLP64 model, where "int" and "long" are 32 bits and "long long" is 64 bits. Once that's done, I'll have to figure out how to make an installer. I've decided to put it off until a someone (or someones) fund it.

The threshold and k-nearest arena search results store hits using compressed sparse rows. These work well for sparse results, but when you want the entire similarity matrix (ie, with a minimum threshold of 0.0) of a large arena, then time and space to maintain the sparse data structure becomes noticable. It's likely in that case that you want to store the scores in a 2D NumPy matrix.

I'm really interested in using chemfp to handle different sorts of clustering. Let me know if there are things I can add to the API which would help you do that.

If you are not a Python programmer then you might prefer that the core search routines be made accessible through a C API. That's possible, in that the software was designed with that in mind, but it needs more development and testing.

Chemfp ever since version 1.1 supports OpenMP. That's great for shared-memory machines. Are you interested in supporting a distributed computing version?

There are any number of higher-level tools which can be built on the chemfp components. For example, what about a wsgi component which implements a web-based search API for your local network? Wouldn't it be nice to say:

### fpserver filename1.fpb

and have a simple search service?

What about a Jupyter visualization tool?

Several people have asked about GPU implementations. My feeling is that the CPU is fast enough, and much easier to deploy. That's not saying I wouldn't be interested in a GPU implementation, only describing why it's not at the top of the list.

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## CHAPTER 12

**Thanks** 

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