

ChEMBL & RDKit

Marrying Open Data with Open Tools



Rodrigo Ochoa

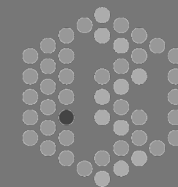
Mark Davies

Francis Atkinson

George Papadatos

John Overington

EMBL-EBI



Outline

- Introduction to EBI and ChEMBL
- Loading ChEMBL (PostgreSQL + RDKit)
- Comparative studies between RDKit and Symyx
- Web interface



INTRODUCTION

EBI structure

Genomes
Ensembl
Ensembl Genomes
EGA

Nucleotide sequence
ENA

Protein activity
IntAct , PRIDE

Functional genomics
ArrayExpress
Expression Atlas

Protein Sequences
UniProt

- ChEMBL database
 - Curation
 - Interface
 - Research group

Chemogenomics
ChEMBL

Chemical entities
ChEBI

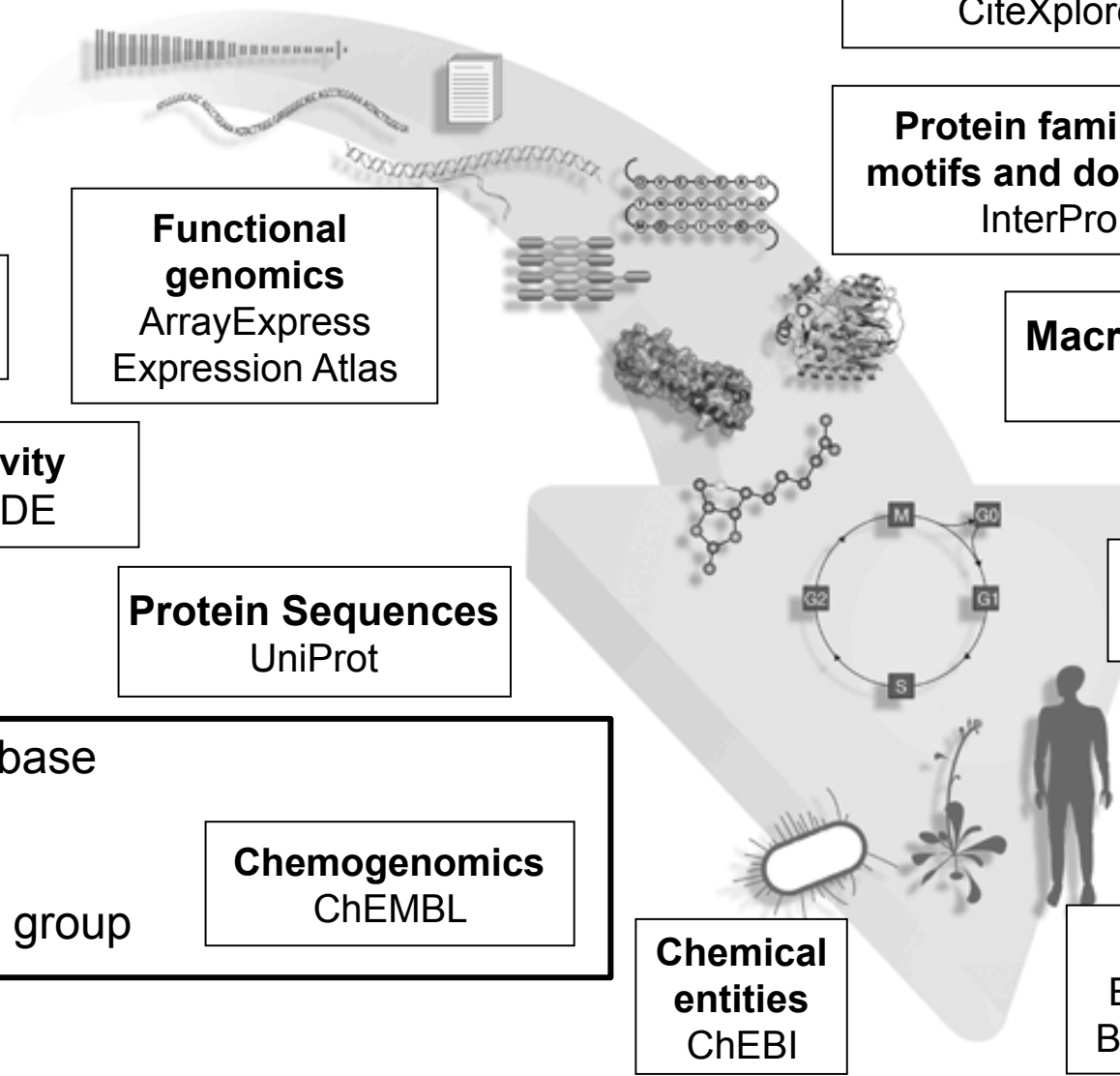
Literature and ontologies
CiteXplore, GO

Protein families, motifs and domains
InterPro

Macromolecular
PDBe

Pathways
Reactome

Systems
BioModels
BioSamples



What is the ChEMBL database?

- A freely-available, curated source of small molecules, targets, assays and bioactivity data
- Core data is from the primary Med Chem literature
 - J. Med. Chem., Bioorg. Med. Chem. Lett., J. Nat. Prod.
- Information extracted
 - Compounds tested
 - Assays performed
 - Biological targets of assays
 - Activities of compounds in assays
- Structures and data curated in-house to ensure quality

ChEMBL 14 (latest version)

ChEMBL14

Compounds: **1,213,239**

Assays: **644,734**

Targets: **9,003**

Publications: **46,133**

Activities: **10,129,256**

Data sources: **10**

Increase of >200,000 compounds
from literature since ChEMBL01

ChEMBL interface

The screenshot displays the ChEMBL interface. At the top, there is a navigation bar with the EMBL-EBI logo, a search input field with a 'Find' button, and links for 'Terms of Use', 'Privacy', and 'Cookies'. Below this is a secondary navigation bar with categories: 'Databases', 'Tools', 'Research', 'Training', 'Industry', 'About Us', and 'Help', along with 'Site Index' and social media icons.

The main content area is titled 'ChEMBL' and includes a search bar 'Search ChEMBLdb...' with filters for 'Compounds', 'Targets', 'Assays', and 'Activity Source Filter'. Below the search bar are buttons for 'ChEMBLdb', 'Compound Search', 'Protein Target Search', 'Browse Targets', 'Browse Drugs', and 'Drug Approvals'.

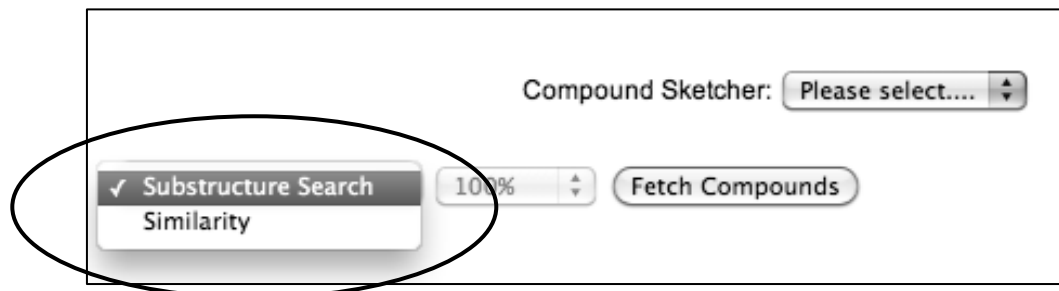
A sidebar on the left contains a list of links: 'ChEMBLdb', 'Malaria Data', 'ChEMBL-NTD', 'Kinase SARfari', 'GPCR SARfari', 'DrugEBllity', 'ChEMBL Group', 'Downloads', 'Web Services', and 'FAQ'. Below these is a 'ChEMBLdb Statistics' section with the following data:

- DB: ChEMBL_14
- Targets: 9,003
- Compound records: 1,376,469
- Distinct compounds: 1,213,239
- Activities: 10,129,256
- Publications: 46,133

The main content area also includes a description of ChEMBL as a database of bioactive drug-like small molecules, a 'Getting Started' section with three bullet points, a 'Support and Feedback' section, a 'Staying in Touch' section, and a 'Training' section.

Chemical search in ChEMBL

- A variety of sketchers (Marvin, JDraw, JME)



List Search

SMILES Search ChEMBL ID Search Keyword Search

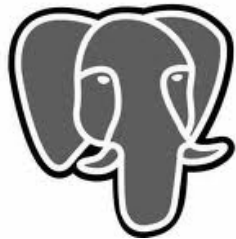
Please enter a list of Compound IDs, keywords, or SMILES separated by newlines

Fetch Compounds

- ChEMBL chemical cartridge:



PostgreSQL



LOADING CHEMBL

RDKit overview

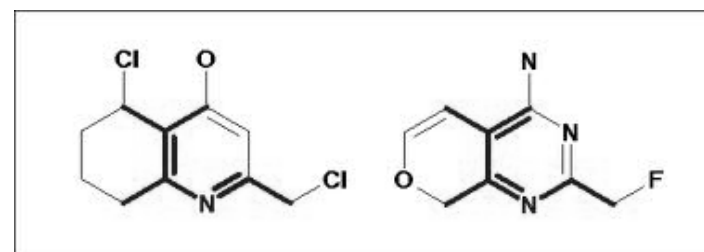
- An open source collection of chemoinformatics and machine-learning software written in C++ and Python
- There is available a PostgreSQL cartridge

(<http://code.google.com/p/rdkit/wiki/DatabaseCartridgeReferenceDocumentation>)



RDKit PostgreSQL cartridge

- Molecular conversion (SMILES, SMARTS, CTAB)
- Substructure search
- Similarity Search
 - Fingerprints: Morgan (ECFP-like), Atom-Pair, Torsion ...
 - Similarity Coefficients: Tanimoto, Dice
- Molecular properties calculation



Bingo chemical cartridge

- Open Source chemical cartridge provided by Indigo
- Support PostgreSQL and Oracle schemas

Unfortunately it could not be compared with the others chemical cartridges (bug reported in the Google group forum)



PostgreSQL ChEMBL version

- ChEMBL originally is available in Oracle (Based on this version a MySQL dump file is available)

Task: Migrate the Oracle Schema to a PostgreSQL schema

Tool:

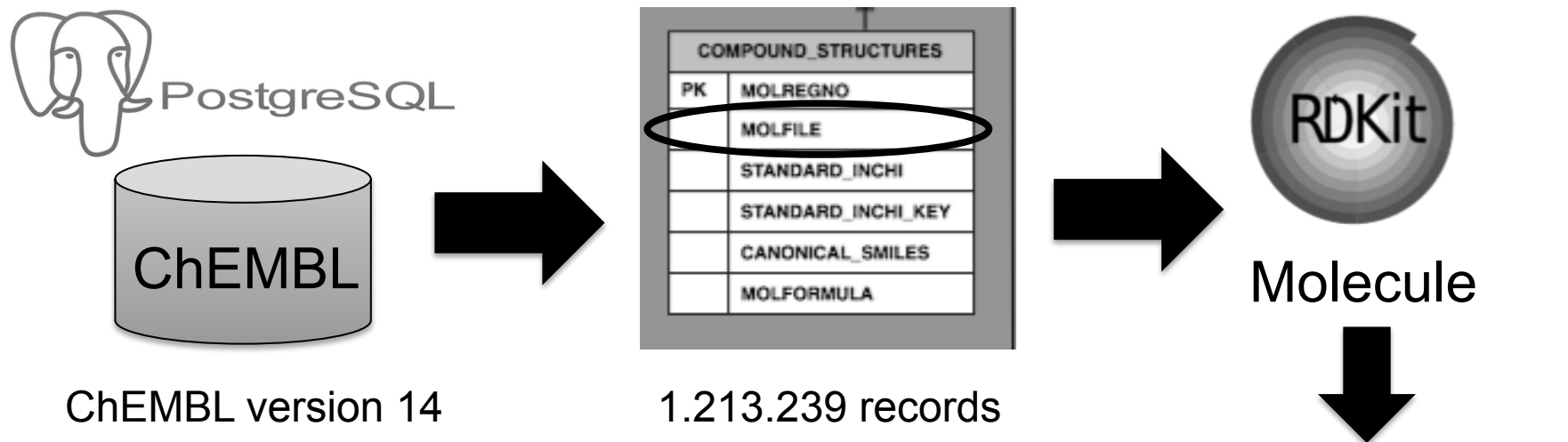


Open Source Kit of Perl libraries

Highly configurable

<http://chembl.blogspot.co.uk/2012/08/chembl-postgresql.html>

ChEMBL + cartridges



Chemical Cartridge	# Molecules correctly built
RDKit	1.146.045
Symyx	1.147.790
Bingo	1.138.682

is_valid_ctab() RDKit function

	mols_rdkit Table
	fps_rdkit Table

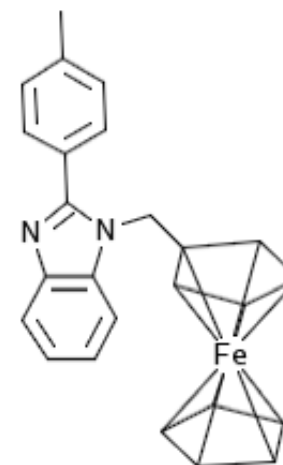
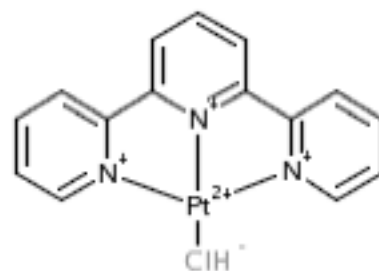
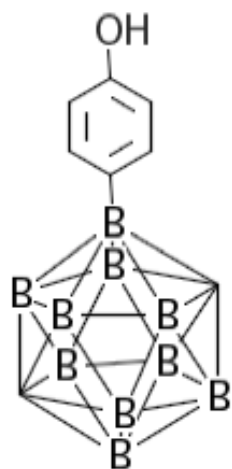


Building differences

Not built by RDKit (1565)

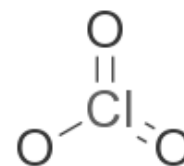
Non pure organics (1506)

Mainly boron clusters & organometallics

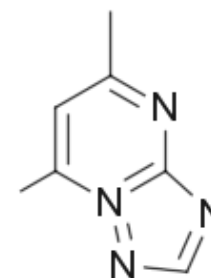
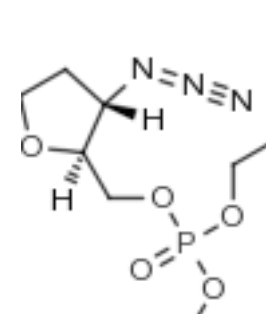


High valency (164; overlap with inorganics)

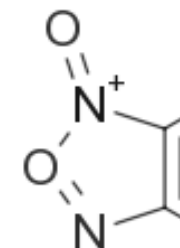
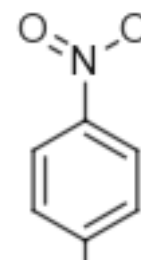
Some are legitimate structures and probably should be handled:



Some need standardizing in ChEMBL to *e.g.* charge-separated form:

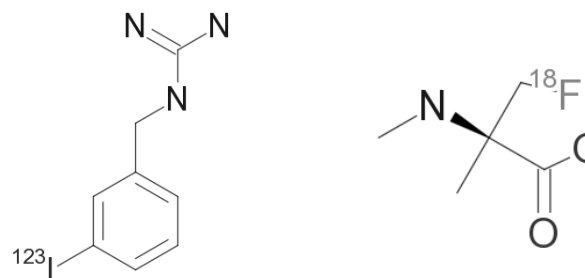


A few need fixing in ChEMBL:

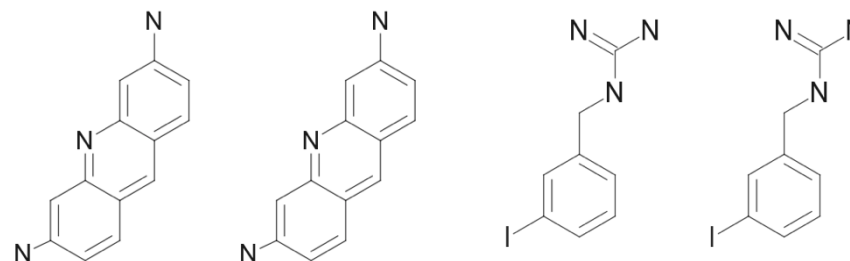


Not built by Symyx (50)

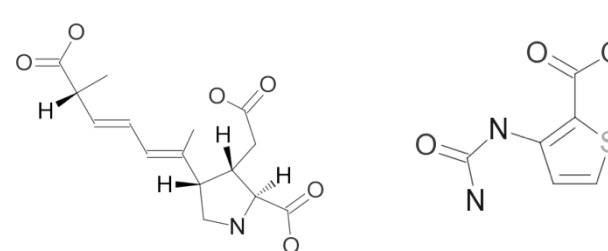
Unusual isotopes (10); used in PET, as tracers *etc*:



Duplicated structures (35):



No obvious reason for failure (5):



1,145,994 parent structures built by both systems
i.e. problems with only a very small minority of structures!



COMPARISON

Cartridge comparison

- Chemical cartridges: RDKit and Symyx
- Type of queries: SMILES
- Objective: Detect discrepancies and the reasons behind them.

- RDKit configuration:

Version: 2012_06

OS: Linux Ubuntu 12.04 64 bits (Virtual Machine)

PostgreSQL version: 9.1.4

- Symyx configuration:

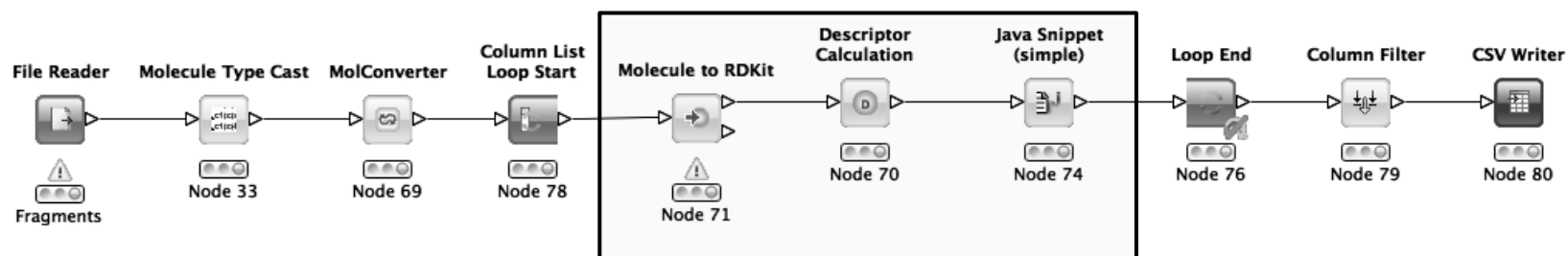
Version: 6.2

OS: Red Hat 5.8 64 bits (Server)

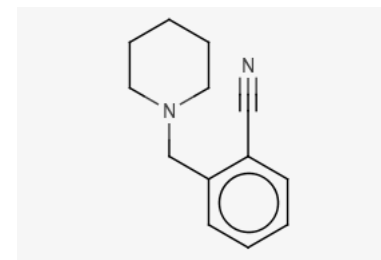
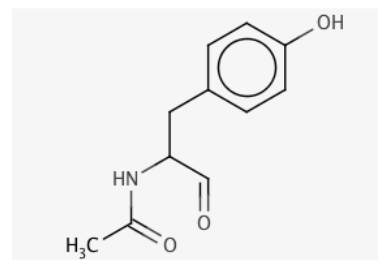
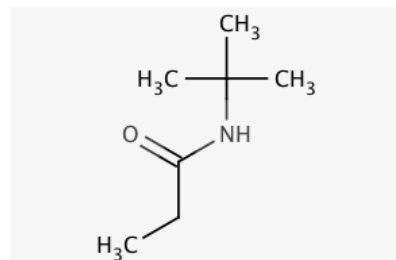
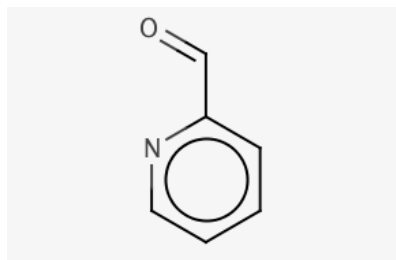
Oracle version: 11.1.0.7.0

Fragment library

- From a set of ChEMBL molecules, RECAP* algorithm was applied.
- A filter based on the number of heavy atoms and molecular weight was done using the RDKit nodes in KNIME

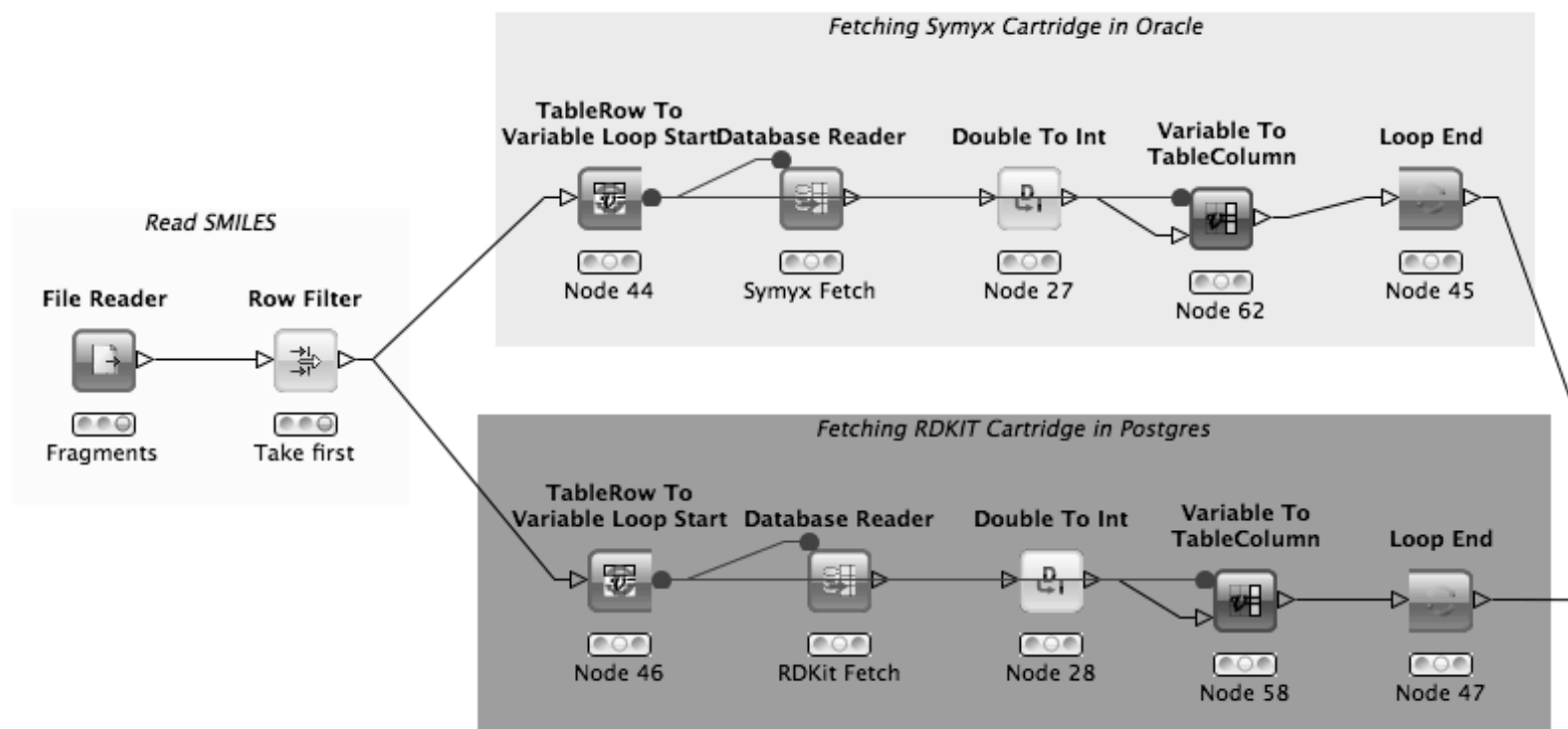


- 40 fragments were chosen

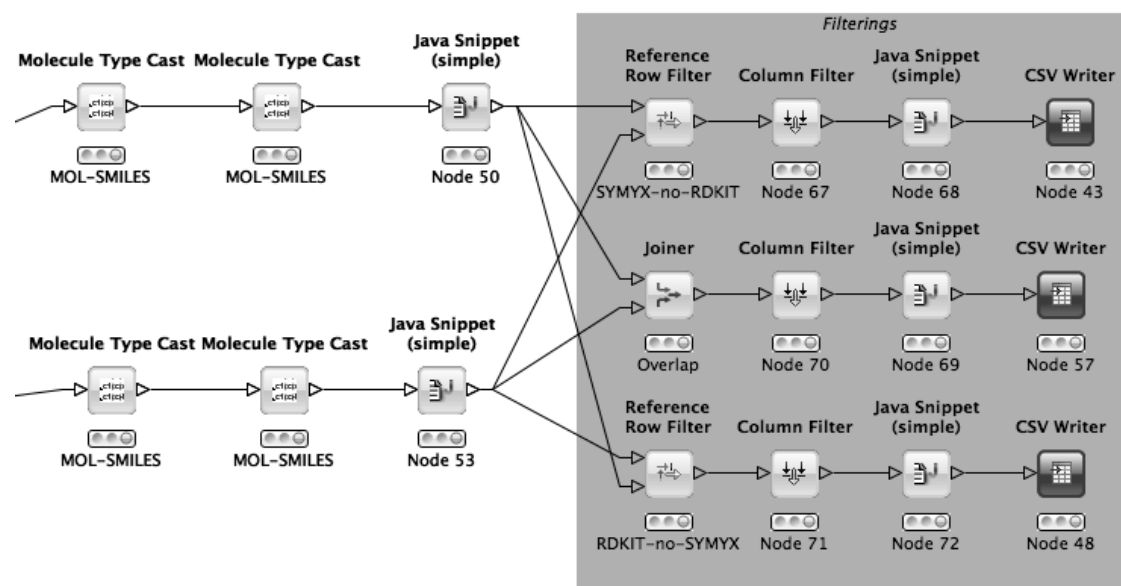
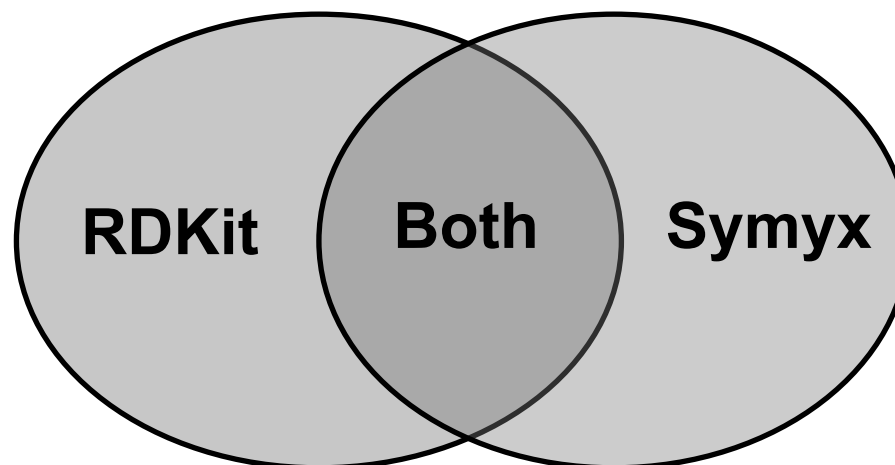


* Lewell XQ, Judd DB, Watson SP, Hann MM. RECAP - Retrosynthetic Combinatorial Analysis Procedure: A powerful new technique for identifying privileged molecular fragments with useful applications in combinatorial chemistry. *Journal of Chemical Information and Computer Sciences* 1998, 38:511-522.

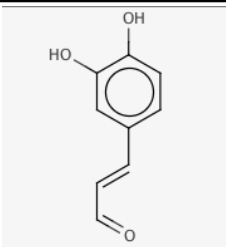
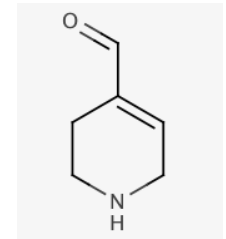
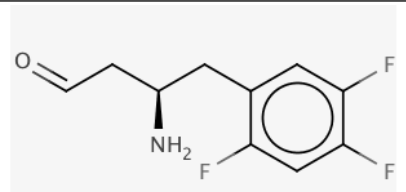
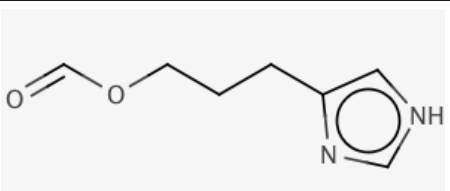
KNIME protocol



KNIME results



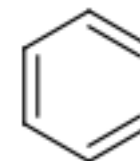
Some results ...

Fragment	Molecule	RDKit no Symyx	Symyx no RDKit	Join Symyx RDKit	Total RDKit	Total Symyx
1		1595	5565	25404	26999	30969
5		52	268	18247	18299	18515
9		263	6	199	462	205
14		62546	2455	73510	136056	75965

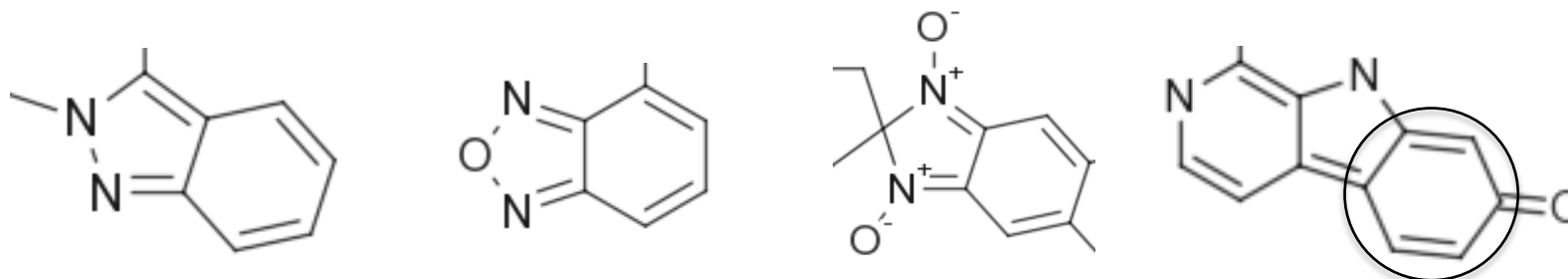
Aromaticity perception: benzene

RDKit SMARTS: c1ccccc1

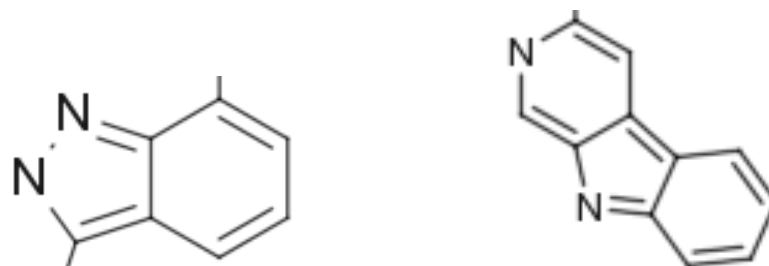
Symyx molfile:



- 1445 structures found by RDKit but not by Symyx
- Due to differing aromaticity models



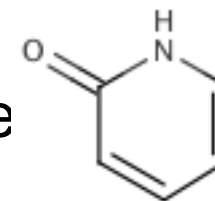
- Sometimes highlights unusual choice of tautomer



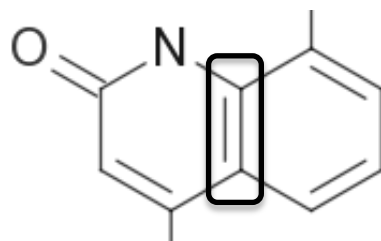
Aromaticity perception: pyridone

RDKit SMARTS: c1cccn1=O

Symyx molfile

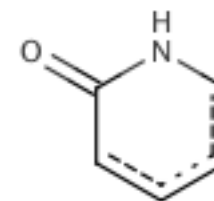


- 6760 structures hit by RDKit but not by Symyx

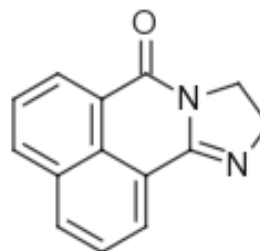


Bond is now aromatic and doesn't match double bond in query

- Can adjust Symyx query to catch these:



- Reduces discrepancy to 179..



Aromaticity models

- Differing aromaticity models mean it can be difficult to code queries that give same hits in both systems

Not a new problem!

e.g. Symyx/MDL vs. Daylight

- MarvinSketch can be used to generate SMARTS queries appropriate for RDKit

User would need to be aware of issues if using advanced query features

- Unlikely to be a real problem once transitioning users become accustomed to new conventions

Stereochemistry

Chiral matching not currently handled by RDKit

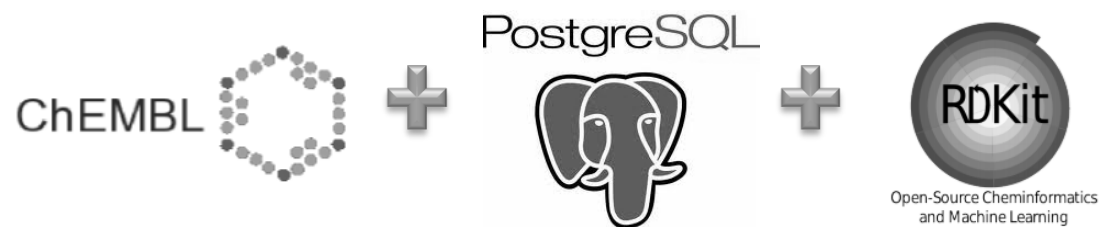
Symyx *can* handle chiral queries

However, there are issues with chiral searching in ChEMBL

- Some inconsistencies in setting of chiral flag
- Issue is being investigated

Best avoided for now !!!

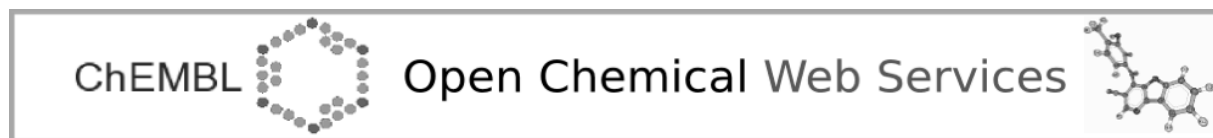




INTERFACE

Interface

- Substructure, Similarity search against ChEMBL database
- Additionally, calculation of molecular properties



OVERVIEW

The main goal of the ChEMBL Open Chemical Web Services, is to provide an open portal to configure and execute **Cheminformatics** search protocols, using in background the [RDKit Chemical Cartridge](#) and the free available PostgreSQL version of the [ChEMBL Database](#). To start please select one of the MENU options

MENU

Home
Tutorial
Substructure and Exact Search >
Similarity Search >
Molecular Properties

DETAILS:

ChEMBL Version: 14

RDKit Version: 2012_09

Number of compounds:
1.114.045

Last update: 20/09/12

RDKit Chemical Cartridge

Input

SMILES

MOL

SMARTS

Search Methodologies

Substructure Searching

Similarity Searching

Features

Different fingerprints and similarity coefficients
Select between substructure and exact search
Prediction of molecular properties

Data

ChEMBL



PostgreSQL

Modalities

Web Applications

Web Services

- Substructure search using SMARTS, SMILES or MolFiles

SUBSTRUCTURE AND EXACT SEARCH

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Similarity Search	>
Molecular Properties	

EXPLANATION

In this section the user can choose between substructure and exact search, using as input format SMILES strings, SMARTS queries and MOL files stored in your computer
NOTE: The exact search only works for SMILES and MOL formats

Select one option:

- Draw your structure
- Input an string or a molfile stored in your computer

Please select one of the following formats for the input: SMARTS

-- Enter the string of characters (for **SMARTS** queries):

Run SMARTS

SUBSTRUCTURE AND EXACT SEARCH

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EXPLANATION

In this section the user can choose between substructure and exact search, using as input format SMILES strings, SMARTS queries and MOL files stored in your computer
NOTE: The exact search only works for SMILES and MOL formats

Select one option:

- Draw your structure
- Input an string or a molfile stored in your computer

File Edit View Insert Atom Bond Structure Calculations Tools Help

-- Select one kind of search: SUBSTRUCTURE EXACT

Search

- Query results using substructure search

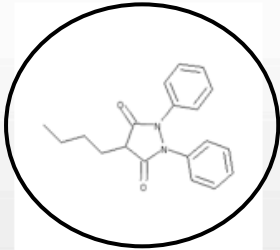
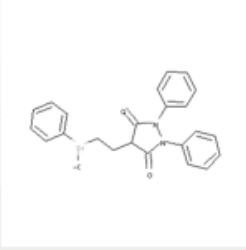
SUBSTRUCTURE AND EXACT SEARCH

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QUERY DETAILS

Query	[#6;X4]-1-[#6](=[#8])-[#7]-[#7]-[#6]-1=[#8]
Search Type	SUBSTRUCTURE

SUMMARY RESULTS (max 10 results per page)

ChEMBL ID	Molecule
CHEMBL101	
CHEMBL832	

Generated with RDKit

- Similarity search using different Fingerprints and Similarity Coefficients

SIMILARITY SEARCH

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Similarity Search	>
Molecular Properties	>

EXPLANATION

In this section the user can run similarity searches, selecting different class of Fingerprints, and select between the Tanimoto and Dice coefficients. The input formats can be in SMILES strings, SMARTS queries and MOL files stored in your computer

NOTE: The Atom-Pair fingerprint is disabled at the moment

Select one option:

- Draw your structure
- Input a string or a molfile stored in your computer

Please select one of the following formats for the input:

-- Select one kind of fingerprints (Morgan (ECFP-like) by default):

-- Select one Similarity Coefficient (Tanimoto by default):

-- Select a **MOL** file from your computer: no file selected

- Query results using Similarity search

SIMILARITY SEARCH

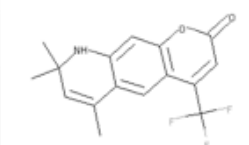
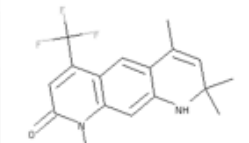
MENU

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Similarity Search >
Molecular Properties >

QUERY DETAILS

Query	CC1=CC(C)(C)Nc2cc3oc(=O)cc(C(F)(F)F)c3cc21
Fingerprint	Morgan-ECFP-Like
Similarity Coefficient	Tanimoto

SUMMARY RESULTS (max 5 results per page)

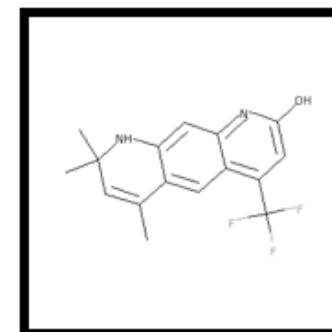
ChEMBL ID	Molecule	Similarity
CHEMBL6441		1
CHEMBL160386		0.64

- Compound report (with links to the ChEMBL website)

CHEMBL160451

ChEMBL Link: [CHEMBL160451](https://www.ebi.ac.uk/chembl/compound/summary/CHEMBL160451)

Canonical SMILES	<chem>CC1=CC(C)(C)Nc2cc3nc(O)cc(c3cc12)C(F)(F)F</chem>
Standard InChI	InChI=1S/C16H15F3N2O/c1-8-7-15(2,3)21-13-6-12-10(4-9(8)13)11(16(17,18)19)5-14(22)20-12/h4-7,21H,1-3H3,(H,20,22)
Standard InChI-Key	REOPBPDUXSVMY-UHFFFAOYSA-N



Bioactivity Data

Assay ID	Assay Type	Assay Relation	Value	Units	Target
36279	Ki	=	115	nM	CHEMBL1871
159377	IC50	=	49	nM	CHEMBL208
36107	IC50	=	28	nM	CHEMBL1871

[Back](#)

- Molecular properties calculation

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MOLECULAR PROPERTIES

QUERY DETAILS

Query	<chem>CC1=CC(C)(C)Nc2cc3oc(=O)cc(C(F)(F)F)c3cc21</chem>
--------------	---

SUMMARY RESULTS

Molecular Weight	309.287
LogP	4.2019
Lipinski H-Bond Acceptors	3
Lipinski H-Bond Donors	1
Number of atoms	36
Number of heavy atoms	22
Number of rotatable bonds	1
Number of Heteroatoms	6
Number of Rings	3
Topological Polar Surface Area	42.24

- Similarity search RESTful web service (also for substructure)

SIMILARITY SEARCH WEB SERVICE

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Molecular Properties	›

EXPLANATION

In this section you can find the documentation to run a simple URI query to retrieve similarity searches, selecting different class of Fingerprints, and select between the Tanimoto and Dice coefficients. The input formats can be in SMILES strings or SMARTS queries

NOTE: All the categories are case-sensitive

CATEGORIES

Mandatory:

- smiles : You can paste here an SMILES string
- smarts : You can paste here an SMARTS string

(Warning: The user must be aware about the special URI characters)

Optional:

- fingerprint : You can select between 'Morgan (ECFP-Like)', 'Morgan (FCFP-Like)', 'Torsion', or 'Atom-Pair' fingerprints
- method : You can select between 'Tanimoto' or 'Dice' similarity coefficients

Example 1 (SMILES):

```
http://localhost/rest/api_chembl.php?
action=similarity&smiles=C(=O)C1=CCnCC1&fingerprint=FCFP&method=Dice
```

Example 2 (SMARTS):

NOTE: The character "#" was replaced by the string "%23"

```
http://localhost/rest/api_chembl.php?action=similarity&smarts=[%236;X4]-1-[%236](=
[%238])-[%237]-[%237]-[%236]-1=[%238]&fingerprint=ECFP&method=Tanimoto
```

Check the PYTHON Client

Check the PYTHON Client

```
#!/usr/bin/env python

import urllib2
import urllib
import json

#####
"""Functions"""
#####
def translateURI(query):
    quoted_url = urllib.quote(query) # change the characters with trouble
    return quoted_url

#####
"""Main"""
#####

# Options for the query
smiles='C(=O)C1=CCnCC1'
smarts='[#6;X4]-1-[#6](=[#8])-[#7]-[#7]-[#6]-1-[#8]'
fingerprint = 'ECFP'
method = 'Tanimoto'

# Changing the query to an URI format
smiles=translateURI(smiles)
smarts=translateURI(smarts)

#####
"""1. Example using SMILES"""
#####
print "Results from SMILES ..."

# Storing the json file with the results
similarity_data = json.loads(urllib2.urlopen("http://10.7.248.227/rest/api_chembl.php?\
action=similarity&smiles=%s&fingerprint=%s&method=%s" % (smiles,fingerprint,method)).read())

# Printing the records
for record in similarity_data:
    print "ChEMBLID: %s" % record['ChEMBL_ID']
    print "Molregno: %s" % record['Molregno']
    print "Similarity: %s" % record['Similarity']
    print
```



Summary and future plans

- Provide a complete PostgreSQL version of ChEMBL per new release, available in the FTP site

<https://www.ebi.ac.uk/chembl/db/index.php/downloads>

- Integrate the Open Chemical Cartridge (RDKit) with open chemogenomics data (ChEMBL) in a Virtual Machine available for users, who can personalize the configuration and update the data.
- Provide a personal interface, with web applications and RESTful web services.

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