A DE FACTO STANDARD
OR
A FREE-FOR-ALL?

A BENCHMARK FOR READING SMILES

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NextMove Software

https://github.com/nextmovesoftware/smilesreading

INTRODUCTION

SMILES

- **S**implified **M**olecular **I**dentification and **L**ine **E**ntry **S**ystem

- 30 years since Dave Weininger published:
  - *SMILES, a chemical language and information system. 1. Introduction to methodology and encoding rules,* JCICS, 1988, 28, 31
    - Cited 2389 times, 179 times in 2017 (Google Scholar)

- 31 years since an EPA report on SMILES
  - *SMILES: A line notation and computerized interpreter for chemical structures*, EPA/600/M-87/021, Aug 1987 (available online)

A *DE FACTO* STANDARD...

- Since 1987, Daylight Chemical Information Systems have been responsible for developing SMILES
  - The documentation is freely available online

- Some aspects of the language were clarified by the OpenSMILES specification (drafted 2007)

- One of the most widely-used file formats in cheminformatics
  - Compact, convenient, combineable, can be canonicalized

…OR "FREE-FOR-ALL" ?

- Toolkits can generally read their own SMILES strings
  - But can they read SMILES strings from other programs?

- Typical problems
  - Hydrogens appear and/or disappear when moving from X to Y
  - SMILES written by X are rejected by Y
  - One toolkit says a ring system is aromatic while another says it's not

- Why? Is it a problem? If so, can anything be done?
  - Something fundamentally broken with SMILES?

MY GOAL

- **Improve** the interoperability of SMILES strings among all tools that support SMILES

1. **Identify** the most common issues affecting interoperability
   - Differences in interpretation of spec? Errors? Unusual aromaticity models? Counting hydrogens?
2. Work with developers to highlight and **resolve issues**
3. Provide a **resource** for future implementations to use to avoid the pitfalls of the past

SCOPE OF BENCHMARK

- The benchmark is *not* a SMILES validation suite
  - Does not replace a toolkit's own testing
- Focuses on aspects of SMILES syntax that tend to be incorrectly implemented
  - Stereochemistry
  - Implicit valence
  - (Reading) Aromatic SMILES
- Focuses on SMILES reading
  - Can toolkits agree on the meaning of a SMILES string?
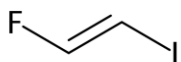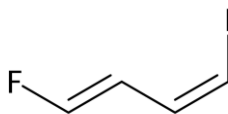
STEREOCHEMISTRY

TESTING CISTRANS STEREO
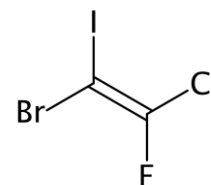
- *cistrans.smi*: 126 SMILES strings

`F/C=C/I`

22 variants

`F/C=C/C=C\I`

24 variants

`I/C(/Br)=C(/F)\Cl`

80 variants

- Toolkits must read each SMILES string and write it out again in a canonical form

  - Exception: ChemDraw writes out an IUPAC name which I run through OPSIN to create a SMILES

- Compare the answers with a toolkit of your choice

STEREO RESULTS

- Currently, the benchmark focuses on:
  - Tetrahedral and cis-trans
- To come:
  - Octahedral, extended tetrahedral, square-planar, trigonal bipyramidal

- The main problem observed is handling of stereo at bond closure digits:
  - `F/C=C/1.Br1` should be the same as `F/C=C1.Br\1`
  - `[C@@](O)(Cl)(F)Br` should be the same as `[C@@](O)(Cl)(F)1.Br1` (if supported)
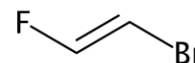
IMPLICIT VALENCE

THE SMILES IMPLICIT VALENCE MODEL

- A SMILES string completely describes the molecular formula of a molecule, including hydrogens

THE SMILES IMPLICIT VALENCE MODEL

- A SMILES string completely describes the molecular formula of a molecule, including hydrogens
- The valence model tells you how to read/write SMILES that leave out the explicit hydrogen count on certain atoms (B, C, N, O, P, S, halogens)
  - co should be read as CH_3OH, i.e. methanol
  - Similarity, methanol, CH_3OH may be written as co
- Same rules must be used for reading as for writing
  - This has consequences for interoperability
- The rules are in the docs...

THE SMILES IMPLICIT VALENCE MODEL

Element	Valence
B	3
C	4
N	3 or 5
O	2
P	3 or 5
S	2, 4 or 6
halogens	1

- Not the same as the MDL valence model
- Not the same as "how many hydrogens is an atom with this valence likely to have?"

APPLY THE VALENCE MODEL

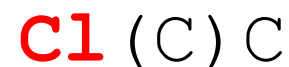| Element	Valence
B	3
C	4
N	3 or 5
O	2
P	3 or 5
S	2, 4 or 6
halogens	1

CCl

- The carbon has explicit valence of 1
  - Round up to **4** with hydrogens
- The molecule is CH_3Cl

- 15 programs tested (with default options):
  - 15 say CH_3Cl

APPLY THE VALENCE MODEL

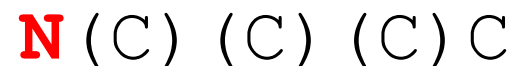| Element	Valence
B	3
C	4
N	3 or 5
O	2
P	3 or 5
S	2, 4 or 6
halogens	1

Cl (C) C

- The chlorine has explicit valence of 2
  - Round up to 1 with hydrogens
- The molecule is $Cl(CH_3)_2$

- 15 programs tested (with default options):
  - 2 reject the molecule (bad valence)
  - 9 say $Cl(CH_3)_2$
  - 3 say $HCl(CH_3)_2$
  - 1 says $H_5Cl(CH_3)_2$

APPLY THE VALENCE MODEL

Element	Valence
B	3
C	4
N	3 or 5
O	2
P	3 or 5
S	2, 4 or 6
halogens	1

$\mathbf{N}$ (C) (C) (C) C

- The nitrogen has explicit valence of 4
  – Round up to **5** with hydrogens
- The molecule is $HN(CH_3)_4$

- 15 programs tested (with default options):
  – 2 reject the molecule (bad valence)
  – 10 say $HN(CH_3)_4$
  – 3 say $N(CH_3)_4$

BENCHMARK DATASET

- 61 SMILES strings covering the organic subset
  - Here are the testcases for nitrogen

Atom Type	SMILES	SMILES valence	H Count
N0	N	3	3
N1	NC	3	2
N2	N(C)C	3	1
N3	N(C)(C)C	3	0
N4	N(C)(C)(C)C	5	1
N5	N(C)(C)(C)(C)C	5	0
N6	N(C)(C)(C)(C)(C)C	5	0

Element	Valence
N	3 or 5

DISAGREEMENTS WITH SMILES VALENCE MODEL

Avalon	Cl2 Cl4 Br2 Br4 I2 I4
BIOVIA Draw	Cl2 Cl4 Br2 Br4 I2 I4
Cactvs	N4 P4 S3 S5 (or none*)
CDK	
CEX (Weininger)	
ChemDoodle	
ChemDraw	
Indigo†	
iwtoolkit	N4 Cl2 Cl3 Cl4 Cl5 Br2 Br3 Br4 I2 I4 (or P4 S3 S5*)
JChem	
KnowItAll	
OEChem	
Open Babel	
OpenChemLib	N4 Cl2 Cl4 Br2 Br4 I2 I4
RDKit†	P6 I3 I4

"Happy valence models are all alike; every unhappy valence model is unhappy in its own way."

...with apologies to Tolstoy

'9.5'/15 correct now.
When I started, it was 6/15.

If the default options are modified
† Results exclude 17 atom types rejected by Indigo, and 19 rejected by RDKit
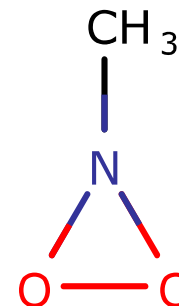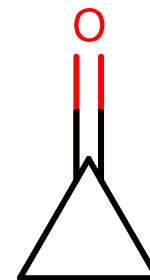
READING AROMATIC SMILES

47464 ring systems

ChEMBL23
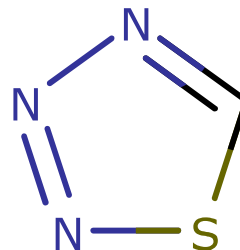
O1ON1C
C1C(=O)C1
C1=NN=NS1

12 benchmark datasets

CDK
o1on1C
C1C(=O)C1
c1nnns1

OpenChemLib
CN1OO1
O=C1CC1
c1nnns1

RDKit
o1on1C
C1C(=O)C1
c1nnns1

+9 others

TEST ABILITY TO READ AROMATIC SMILES

- How to read an aromatic SMILES? Here's my way
  - https://baoilleach.blogspot.com/2017/08/my-acs-talk-on-kekulization-and.html

- How to test whether two programs have interpreted an aromatic SMILES the same way?
  1. Do they agree on whether it is kekulizable?
     - Either it is, or it isn't
  2. If kekulizable, do they agree on the hydrogen count on each atom?
     - The hydrogen count is independent of the specific Kekulé form

KEKULIZATION

c1ccccc1

or
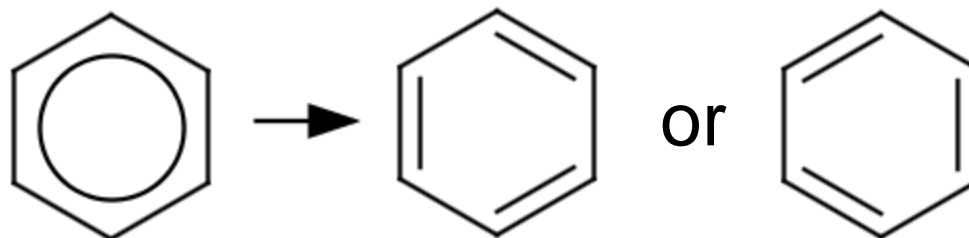
c1cncc1
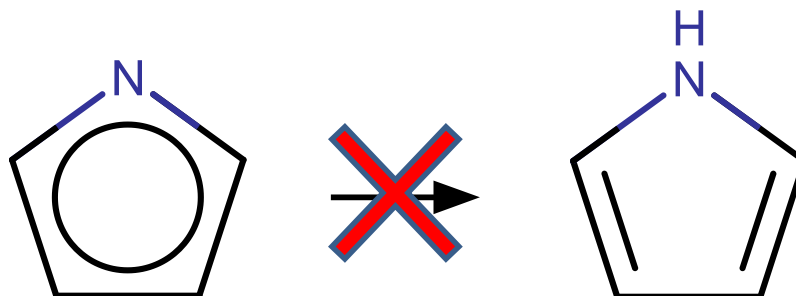
- Given a molecule where some atoms and bonds have been marked as aromatic
  - Assign bond orders of either one or two to the aromatic bonds such that the valencies of all of the aromatic atoms are satisfied (i.e. are consistent with sp^2)

13 toolkits tested reading aromatic SMILES

12 benchmark datasets as input

		1	2	3	4	6	7	8	9	10	11	12	13
Avalon	1												
BIOVIA Draw	2												
CDK	3												
ChemDoodle	4												
ChemDraw	5												
Indigo	6												
iwtoolkit	7												
JChem	8												
KnowItAll	9												
OEChem	10												
Open Babel	11												
OpenChemLib	12												
RDKit	13												

13 x 12 x 47464 results

13 toolkits tested reading aromatic SMILES

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		1	2	3	4	6	7	8	9	10	11	12	13
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KnowItAll	9												
OEChem	10												
Open Babel	11												
OpenChemLib	12												
RDKit	13												

	Different H Count	Kekulization Failure
Avalon	0	1
BIOVIA Draw	0	0
CDK	**Reference**	0
ChemDoodle	13*	
ChemDraw	37	26
Indigo†	456	23
iwtoolkit	91	69
JChem	0	4
KnowItAll	0	N/A
OEChem	0	0
Open Babel	0	0
OpenChemLib	9	136
RDKit†	7	1

* It is not possible to distinguish between kekulization failures and differences in hydrogen count
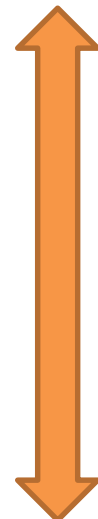
† Results exclude 8 structures rejected by Indigo, and 15 by RDKit

13 toolkits tested reading aromatic SMILES

12 benchmark datasets as input

		1	2	3	4	6	7	8	9	10	11	12	13
Avalon	1												
BIOVIA Draw	2												
CDK	3												
ChemDoodle	4												
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OEChem	10												
Open Babel	11												
OpenChemLib	12												
RDKit	13												

FINAL THOUGHTS

WORK IN PROGRESS

- These results represent a snapshot in time
  - Much better than six months ago
  - Expect more improvements within another six

- Software that has been changed in response to this benchmark

CACTVS	iwtoolkit	Open Babel
CDK	JChem	OpenChemLib
ChemDoodle	KnowItAll	RDKit

- Encourage your favourite tools/toolkits to take part!

CONCLUSIONS

- While stereochemistry is well-handled, adherence to the SMILES valence model and ability to read aromatic SMILES tend to be problem areas
  - Checking for agreement in hydrogen count is a surprisingly powerful way of identifying errors
- While disagreement exists, all is not lost
  - On inspection, it has always been clear what the correct answer is
- Developers are (mostly) open to addressing issues
  - The only area of push-back from developers is implementing the SMILES valence model
- Overall, much more successful than expected!

ACKNOWLEDGEMENTS

- The developers of many toolkits who have taken the time to engage with this benchmark

- Matt Swain for providing JChem results

- Roger Sayle for indulging my interest in SMILES reading

- John Mayfield for many discussions on the topic of kekulization and SMILES aromaticity

How many hydrogens are on the nitrogen in the molecule represented by this SMILES string?

N(C)(C)(C)C

1. None
2. One
3. It depends
4. Cannot say as no such molecule

3.2.1 Atoms

Atoms are represented by their atomic symbols: this is the only required use of letters in SMILES. Each non-hydrogen atom is specified independently by its atomic symbol enclosed in square brackets, **[ ]**. The second letter of two-character symbols must be entered in lower case. Elements in the "organic subset" **B, C, N, O, P, S, F, Cl, Br,** and **I** may be written without brackets if the *number of attached hydrogens conforms to the lowest normal valence consistent with explicit bonds*. "Lowest normal valences" are B (3), C (4), N (3,5), O (2), P (3,5), S (2,4,6), and 1 for the halogens. Atoms in aromatic rings are specified by lower case letters, e.g., aliphatic carbon is represented by the capital letter **c**, aromatic carbon by lower case **c**. Since attached hydrogens are implied in the absence of brackets, the following atomic symbols are valid SMILES notations.

C	methane	(CH4)
P	phosphine	(PH3)
N	ammonia	(NH3)
S	hydrogen sulfide	(H2S)
O	water	(H2O)
Cl	hydrochloric acid	(HCl)

Atoms with valences other than "normal" and elements not in the "organic subset" must be described in brackets.

[S]	elemental sulfur
[Au]	elemental gold

Within brackets, any attached hydrogens and formal charges must always be specified. The number of attached hydrogens is shown by the symbol **H** followed by an optional digit. Similarly, a formal charge is shown by one of the symbols **+** or **-**, followed by an optional digit. If unspecified, the number of attached hydrogens and charge are assumed to be zero for an atom inside brackets. Constructions of the form