

# Materials Semantic Web

*An Open Community of people and machines  
sharing knowledge*

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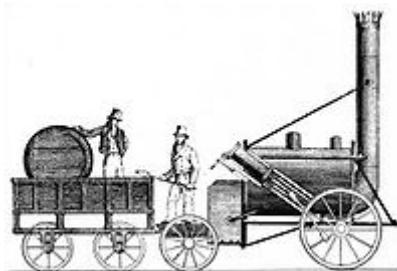
Louisiana State University, US, 2013-06-07





# Overview

- Semantics will give us MUCH better, faster, more usable, scientific knowledge
  - The revolution is comparable to railways, telephones.
  - We scientists must work together to create the tools...and network
  - PLANNING  INVESTMENT



# INVESTMENT



# Themes

- WE can will change the world
- Formalization of knowledge is a community activity
- Let's consider some communal problems in the next 2 hours
- Open Science means better science
- We want OUR suggestions

# Hackathons



# PMR Timeline for Semantic Materials

- 1994 1<sup>st</sup> WWW Conference, Chemical MIME
- 1994 Chemical Markup Language (HenryRzepa, PMR)
- 2001 UK eScience programme, eMinerals
- 2005 Materials Grid (Martin Dove group)
- 2006 Blue Obelisk (Open Source chemistry)
- 2006 Polymer Informatics (Unilever, Nico Adams)
- 2009 Chem4Word, OREChem (Microsoft Research)
- 2011 PNNL meetings and visit
- 2012 Semantic Physical Science (Cambridge)
- 2013 CSIRO meetings and visit
- 2013 LSU LA-Sigma

# The Semantic Web

"The Semantic Web is an extension of the current web in which information is given well-defined meaning, better enabling computers and people to work in cooperation."

*Tim Berners-Lee, James Hendler, Ora Lassila, The Semantic Web, Scientific American, May 2001*

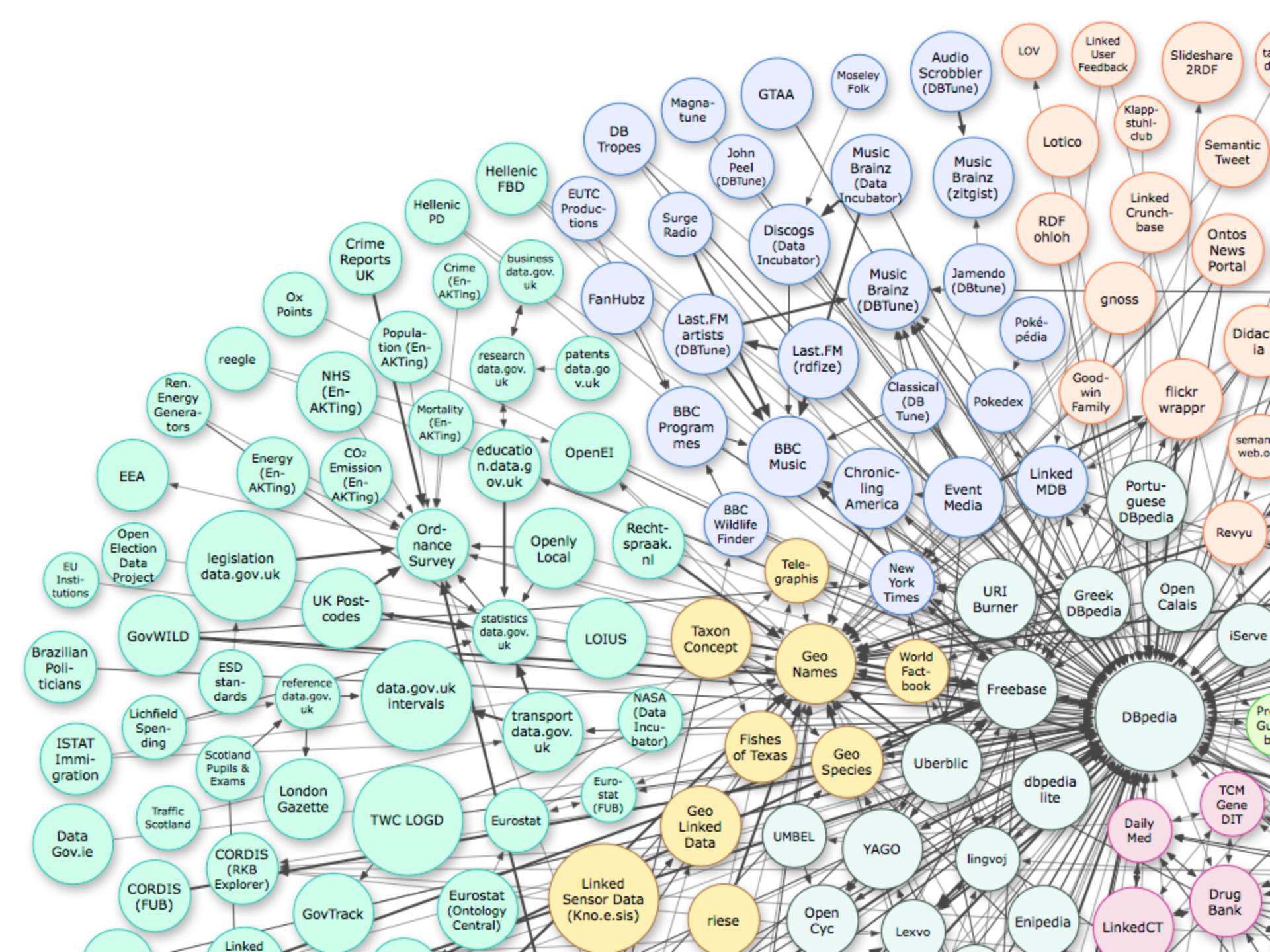
# Semantic web (2006)

- I think maybe when you've got an overlay of **scalable vector graphics** [...] on Web 2.0 and access to a semantic Web integrated across a huge space of data, you'll have access to an **unbelievable data resource**.

*Tim Berners-Lee, A 'more revolutionary' Web (2006)*

# Linked Open Data – the world's knowledge

- [http://upload.wikimedia.org/wikipedia/  
commons/3/34/  
LOD Cloud Diagram as of September 2011.  
png](http://upload.wikimedia.org/wikipedia/commons/3/34/LOD_Cloud_Diagram_as_of_September_2011.png)



# The scientist's amanuensis

- "*The bane of my life is doing things I know computers could do for me*" (Dan Connolly, W3C)

Example: A semantic amanuensis could

- Give me a daily digest of zeolite papers
- Extract all the structures from them
- Submit those structures to GULP and NWChem
- Compare the results statistically
- Preserve and distribute the complete operation
- Prepare the results for publication



*The semantic web is having a personal amanuensis*

*I'm AMI. I can't think, but I am very good at doing what I'm told*

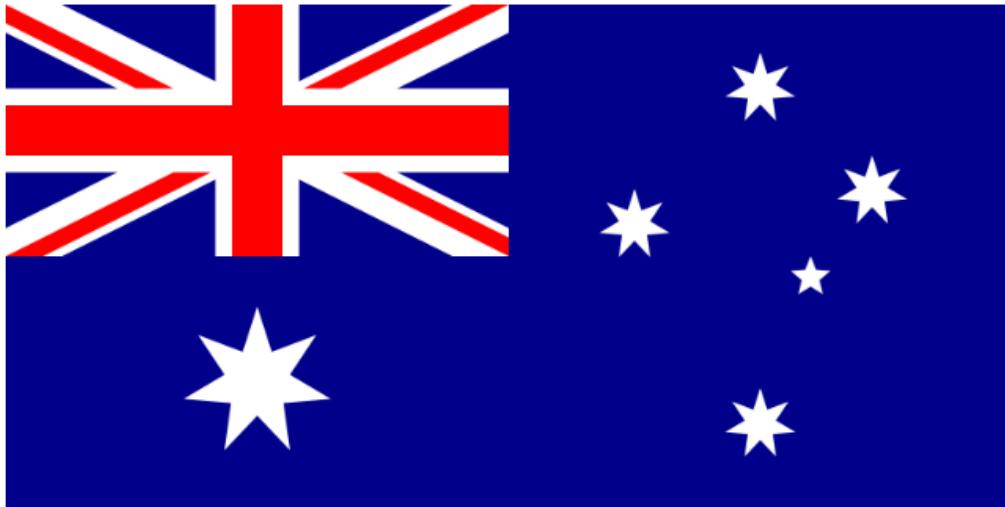
# Connolly Challenge

- *The bane of my life is doing things I know computers could do for me" (Dan Connolly, W3C)*

**NOW! Identify a single task where you think computers could save you significant time.**

(This is NOT related to raw cpu power, but new software and information).

# Scalable Vector Graphics (SVG)



Human-friendly

Automatic!

```
<?xml version="1.0" encoding="UTF-8"?>
<svg xmlns="http://www.w3.org/2000/svg" xmlns:xlink="http://www.w3.org/1999/xlink" width="1280" height="640" viewBox="0 0
30240 15120">
<defs id="defs6">
<polygon points="0,-9 1.735535,-3.6038755 7.0364833,-5.6114082 3.8997116,-0.89008374 8.7743512,2.0026884 3.1273259,2.4939592
3.9049537,8.1087198 0,4 -3.9049537,8.1087198 -3.1273259,2.4939592 -8.7743512,2.0026884 -3.8997116,-0.89008374
-7.0364833,-5.6114082 -1.735535,-3.6038755 0,-9 " id="Star7"/>
</defs>
<path d="M 0,0 L 30240,0 L 30240,15120 L 0,15120 L 0,0 z" style="fill:#00008b"/>
<use transform="matrix(252,0,0,252,7560,11340)" id="Commonwealth_Star" style="fill:#fff" xlink:href="#Star7"/>
<use transform="matrix(120,0,0,120,22680,12600)" id="Star_Alpha_Crucis" style="fill:#fff" xlink:href="#Star7"/>
<!-- snipped →
217,2520 L 10080,2520 L 15120,0 z" id="Red_Diagonals" style="fill:red"/>
<use transform="matrix(-1,0,0,-1,15120,7560)" id="Red_Diagonals_Rotated" style="fill:red" xlink:href="#Red_Diagonals"/>
</svg>
```

Machine-friendly

# Mathematics Markup Language

Energy of c.c.p lattice of argon

$$\sum_{i=1}^n \left( \mathbf{b}_i \times (\mathbf{a}_i)^{-\frac{s}{2}} \right) + \frac{pi \times \sqrt{32}}{(s-3) \times \left( \frac{3}{\sqrt{32 \times pi}} \left( 1 + \sum_{i=1}^n \mathbf{b}_i \right) \right)^{\frac{s-3}{3}}}$$

Automatic!

Human-friendly

Many editors and tools exist

We used MathWeaver

Machine-friendly

```

<math display = 'block'>
  <apply>
    <plus/>
    <apply>
      <sum/>
      <bvar>
        <ci>i</ci>
      </bvar>
      <lowlimit>
        <cn>1</cn>
      </lowlimit>
      <uplimit>
        <ci>n</ci>
      </uplimit>
      <apply>
        <times/>
        <apply>
          <divide/>
          <apply>
            <minus/>
            <ci>s</ci>
            <cn>3</cn>
          </apply>
          <cn>3</cn>
        </divide/>
        <apply>
          <divide/>
          <apply>
            <minus/>
            <ci>s</ci>
            <cn>3</cn>
          </apply>
          <cn>3</cn>
        </divide/>
      </apply>
    </sum/>
  </apply>
</math>
```

4 pages clipped

# CML (Chemical Markup Language)

Preparation of (*2E,4R\*,5R\**)-ethyl-4,5-epoxy-hex-2-enoate (172)

Trifluoroacetic anhydride (14.8 ml, 104 mmol) was added slowly to a suspension of (*2E,4E*) ethyl hexa-2,4-dienoate 171 (2.44 g, 17.4 mmol), ... provided the epoxide 172 (1.09 g, 7 mmol, 41%) as a colourless oil;  $\nu_{\text{max}}$  (film)/cm<sup>-1</sup>: 2981, 1716 (C=O), 1655 (C=C), 1446, 1378, 1367, 1340, 1302, 1258, 1185, 1140, 1096, 1031, 1005, 975;  $\delta_{\text{H}}$  ... Found: [MNa]<sup>+</sup>, 179.060. [C<sub>8</sub>H<sub>12</sub>O<sub>3</sub>Na]<sup>+</sup> requires 179.0684. Data was consistent with those reported in the literature.<sup>16</sup>

Human-friendly

<?xml version="1.0" ?>  
<cml xmlns="http://www.xml-cml.org/schema">  
  <molecule id="m1">  
    <name dictRef="nameDict:iupac">  
      acetic acid  
    </name>  
    <name dictRef="nameDict:trivial">  
      acetyl hydroxide  
    </name>  
    <formula inline="AcOH" concise="C 2 H 4 O 2"/>  
    <atomArray>  
      <atom id="a1" elementType="C" x2="-2.914" y2="0.769" />  
      <atom id="a8" elementType="H" x2="1.086" y2="1.539" />  
    </atomArray>  
    <bondArray>  
      <bond id="b1" atomRefs2="a1 a2" order="1" />  
      ...  
      <bond id="b7" atomRefs2="a3 a8" order="1" />  
    </bondArray>  
  </molecule>  
</cml>

Machine-friendly

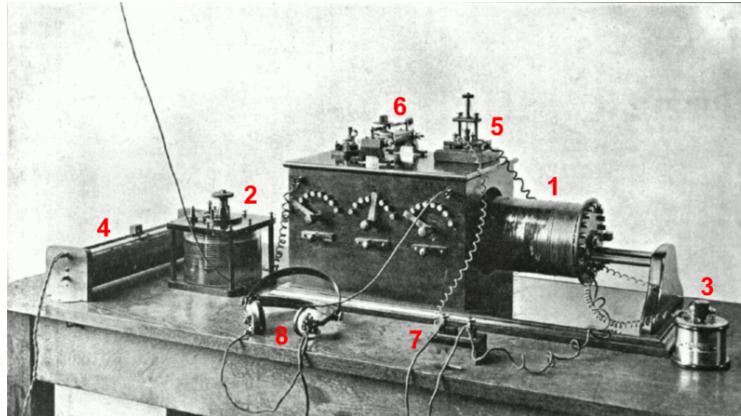
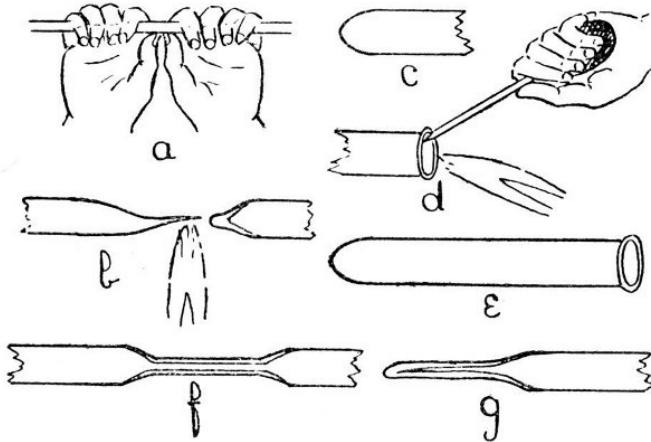
# Chemical semantic web (2007)

- maybe when you've got an overlay of scalable vector graphics [**CML**, **InChI** and **chemical ontologies** - **everything well-defined and marked up**] on Web 2.0 and access to a semantic Web integrated across a huge space of data, ... *Peter Murray-Rust (2007)*

# Benefits of semantics

- *"The bane of my life is doing things I know computers could do for me"* (Dan Connolly, W3C)
- Automation
- Reliability
- Interoperability
- Validation
- Transparency
- The semantic web is having a personal amanuensis

# Componentised approach liberates



Individual, manual,  
unreusable, flaky

Commodity, standard,  
reliable, re-usable

# Current scientific information flow

... is broken for data-rich science

Non-semantic  
data

PDF

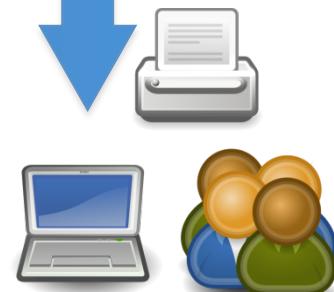
Human input



Lineprinter output

Text files

Data extraction  
difficult and  
incomplete



Human  
readers

# Semantic network closes the loop

Measurement

Computation

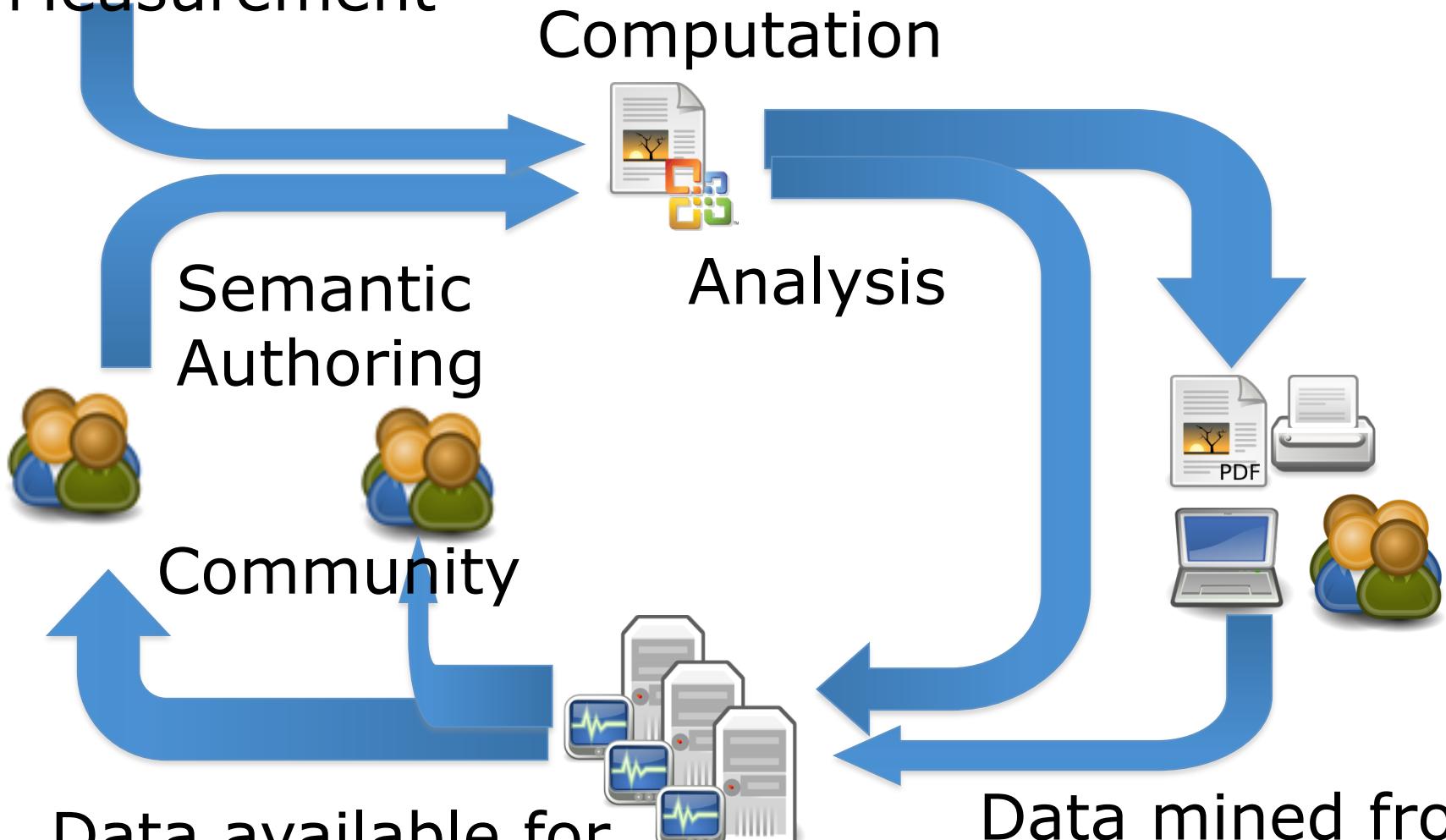
Semantic  
Authoring

Analysis

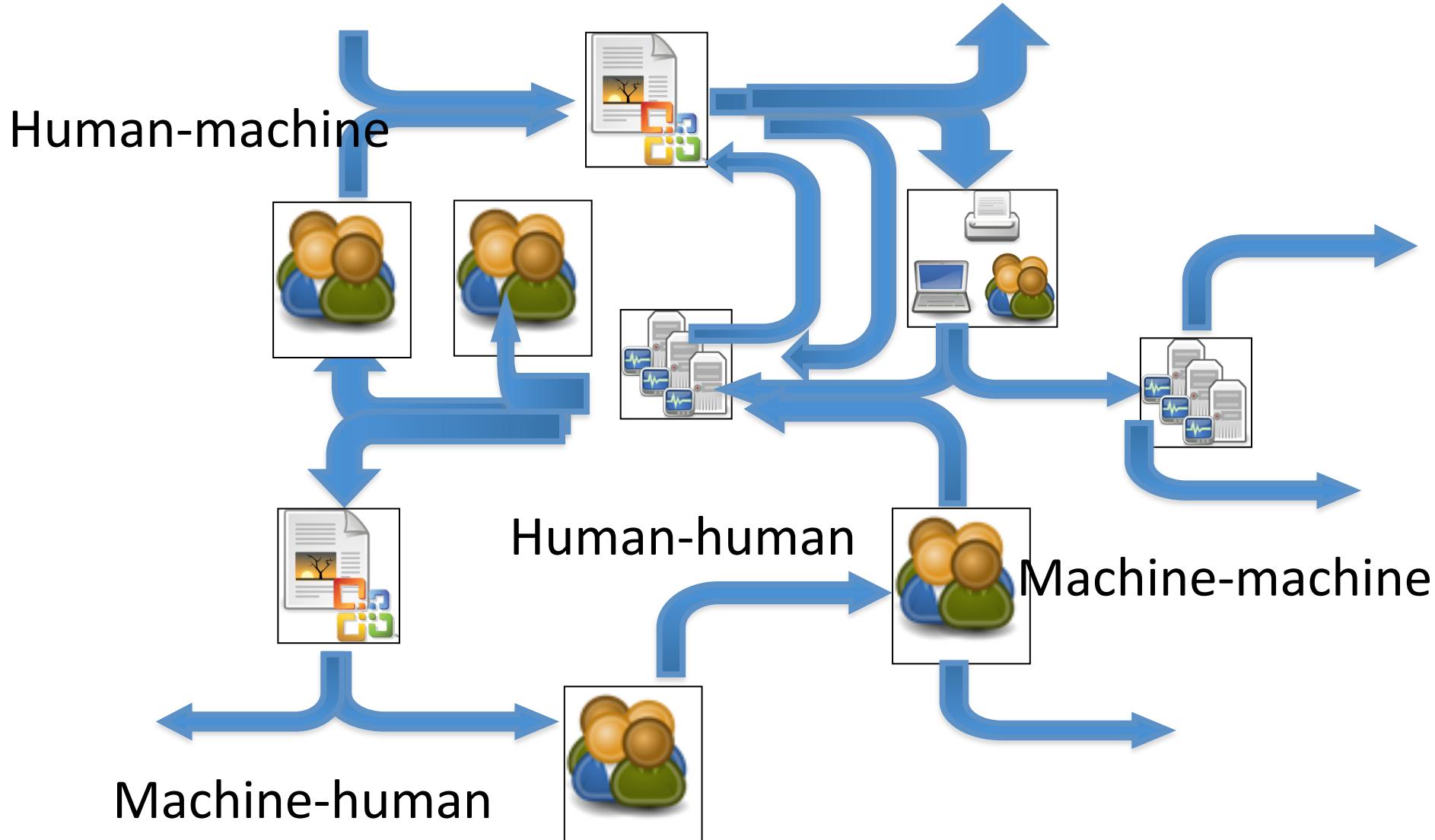
Community

Data available for  
e-science and re-  
use

Data mined from  
document



# The network grows autonomously



# Overview

- Semantics: Telling machines PRECISELY what we mean
- Translating machine output into human language
- Extracting/translating our current chemistry into semantic form:
  1. Program output
  2. Chemical databases
  3. Natural Language Processing (written) (NLP)

# Representing Semantics

Complementary approaches:

**Markup Languages** (“hardcoded objects”) MathML,  
G(eo)ML, CellML, S(ys)B(io)ML,

- CML (Chemistry and numeric science):
  1. Molecules (atoms, bonds, coordinates,
  2. Reactions,
  3. Spectra,
  4. Solid state,
  5. Computation

RDF (relationships, annotations, linking).

# Problem: Explaining chemistry to a machine

**“The calculated dipole moment of ethanol was 1.6 D”**

The machine “understands” basic chemical structure (atoms, bonds and coordinates) and numeric properties (“1.6”). It does not understand

- “calculated”,
- “dipole moment”,
- “ethanol”,
- “D”.

**NOW: Communal discussion of how to tackle this**

# Humans and machines use different languages

- *Implicit semantics*

“Compound 2a melted at 119°C”

*humans are good at interpreting this; machines see just a string.*

- *Explicit semantics*

```
<cml:molecule ref="2a">
  <cml:property>
    <cml:scalar dictRef="prop:mpt"
      units="units:celsius"
      dataType="xsd:float"
      >119</cml:scalar>
  </cml:property>
</cml:molecule>
```

The diagram illustrates the mapping of CML Schema elements to external resources:

- A red arrow points from the `cml:molecule` element to the text "CML Schema".
- A purple arrow points from the `cml:property` element to the text "Molecules in CML/InChI".
- A green arrow points from the `cml:scalar` element to the text "propertyDictionary".
- A brown arrow points from the `units` attribute to the text "unitsDictionary".
- A blue arrow points from the `dataType` attribute to the text "W3CSchema".

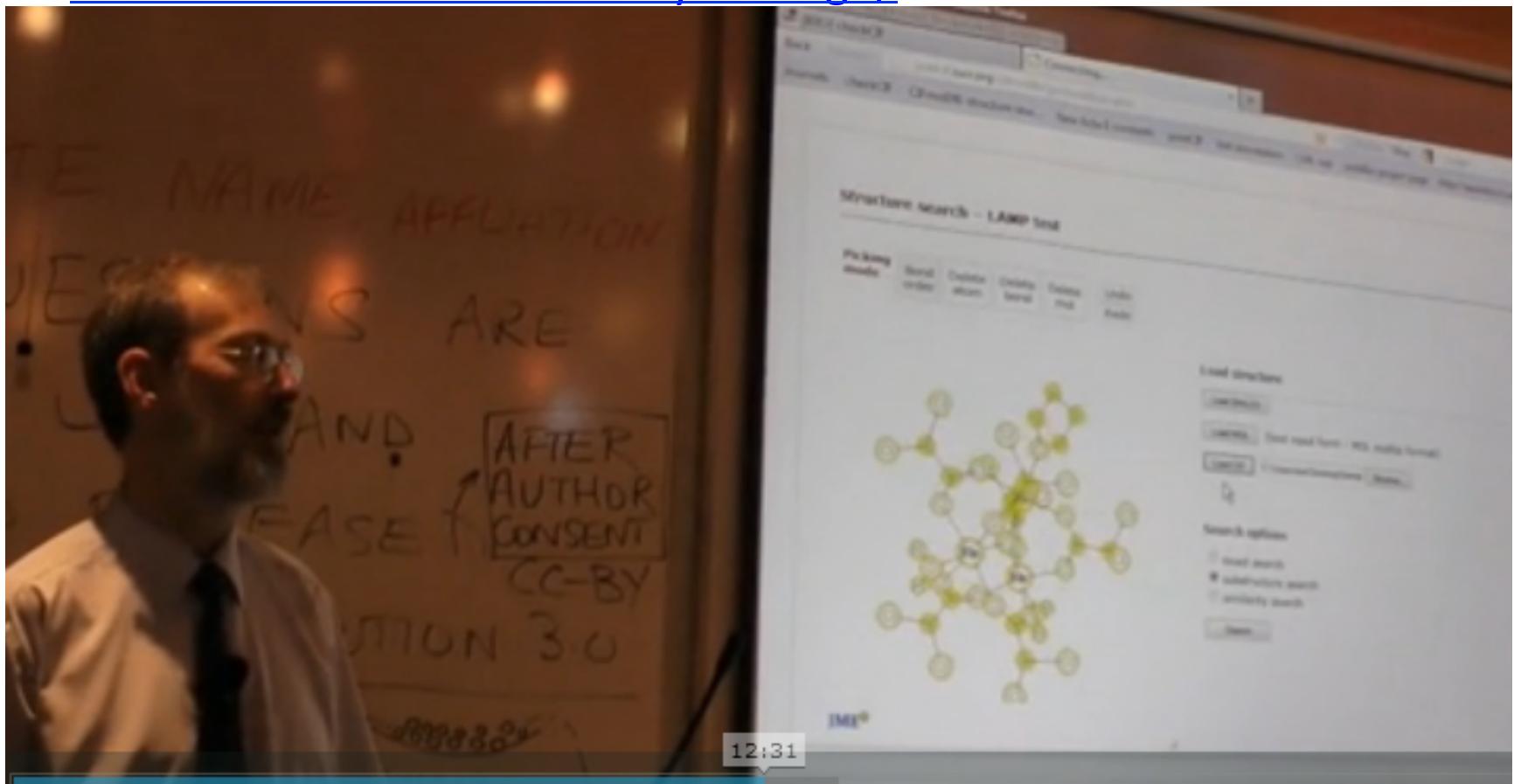
4 namespaces, 3 dictionaries

# DIPOLE MOMENT OF ETHANOL

```
<cml:molecule xmlns:cml="http://www.xml-cml.org/schema" " title="ethanol">
  <cml:atomArray>
    <cml:atom id="a1" elementType="O" x3="0.0", y3="0.0, z3="0.0"/>
    <cml:atom id="a2" elementType="C" x3="0.0", y3="0.0, z3="1.54"/>
    <cml:atom id="a3" elementType="C" x3="0.0", y3="1.2", z3="2.2"/>
      <!-- atoms omitted --
    <cml:atom id="a1h" elementType="H" x3="0.0", y3="-0.8", z3="-0.4"/>
  </cml:atomArray>
  <cml:bondArray>
    <cml:bond id="a1_a2" atomRefs2="a1 a2" order="S"/>
    <cml:bond id="a2_a3" atomRefs2="a2 a3" order="S"/>
      <!-- bonds omitted --
  </cml:bondArray>
  <cml:property dictRef="compchem:scalarDipole" role="compchem:calculated">
    <cml:scalar dataType="xsd:double"
      units="compchem:debye">1.60</cml:scalar>
  </cml:property>
  <cml:property dictRef="compchem:vectorDipole" role="compchem:calculated">
    <cml:vector3
      units="compchem:debye">1.1 1.3 0.2</cml:vector3>
  </cml:property>
</cml:molecule>
```

# Semantic authoring IUCr

- <http://blogs.ch.cam.ac.uk/pmr/2012/01/23/brian-mcmahon-publishing-semantic-crystallography-every-science-data-publisher-should-watch-this-all-the-way-through/>



# Sociopolitical aspects

- Little communal interest in formalising chemistry (exceptions: InChI, IUPAC books)
- Most initiatives are bottom-up (CML, Computational Materials, PubChem, Wikipedia)
- Broken publication system (no semantics and widespread legal prohibition of machine extraction from literature)

# Challenge

Extracting semantic information from a typical materials paper.

<http://www.mdpi.com/1996-1944/5/1/27>

Could you reproduce this work?

Could you use the data?

- Example: *Materials* 2012, 5, 27-46; doi:

*Materials* 2012, 5, 27-46; doi:10.3390/ma5010027

OPEN ACCESS

*materials*

ISSN 1996-1944  
[www.mdpi.com/journal/materials](http://www.mdpi.com/journal/materials)

Article

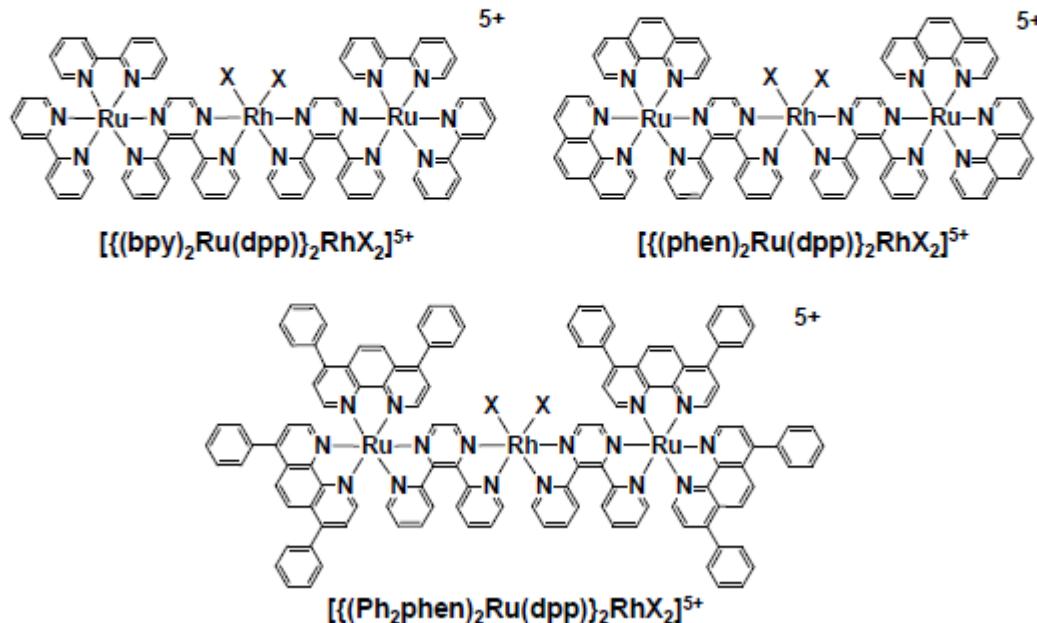
## A Series of Supramolecular Complexes for Solar Energy Conversion via Water Reduction to Produce Hydrogen: An Excited State Kinetic Analysis of Ru(II),Rh(III),Ru(II) Photoinitiated Electron Collectors

Travis A. White, Jessica D. Knoll, Shamindri M. Arachchige and Karen J. Brewer \*

Department of Chemistry, Virginia Tech, Blacksburg, VA 24061-0212, USA;  
E-Mails: whiteta@vt.edu (T.A.W.); jdknoll@vt.edu (J.D.K.); arachsm@vt.edu (S.M.A.)

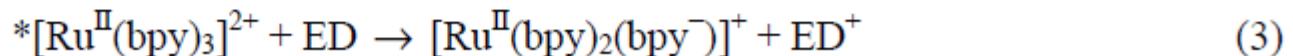
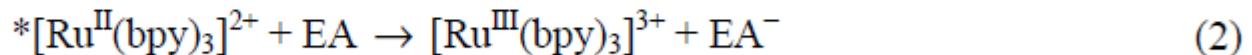
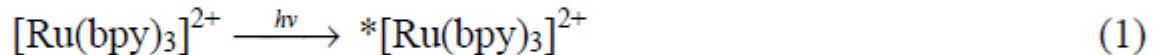
# CHEMICAL STRUCTURES

**Figure 2.** Ru(II),Rh(III),Ru(II) photoinitiated electron collectors of the supramolecular architecture  $\{(\text{TL})_2\text{Ru}(\text{dpp})\}_2\text{RhX}_2]^{5+}$  ( $\text{TL} = \text{bpy} = 2,2'\text{-bipyridine}$ ,  $\text{phen} = 1,10\text{-phenanthroline}$ ,  $\text{Ph}_2\text{phen} = 4,7\text{-diphenyl-1,10-phenanthroline}$ ;  $\text{dpp} = 2,3\text{-bis}(2\text{-pyridyl})\text{pyrazine}$ ;  $\text{X} = \text{Cl or Br}$ ).



# REACTIONS

that is both a more powerful oxidizing and reducing agent than the ground state species. Upon photoexcitation, this class of Ru(II)-polyazine LAs are known to undergo excited state oxidative and reductive quenching, Equations (1–3).

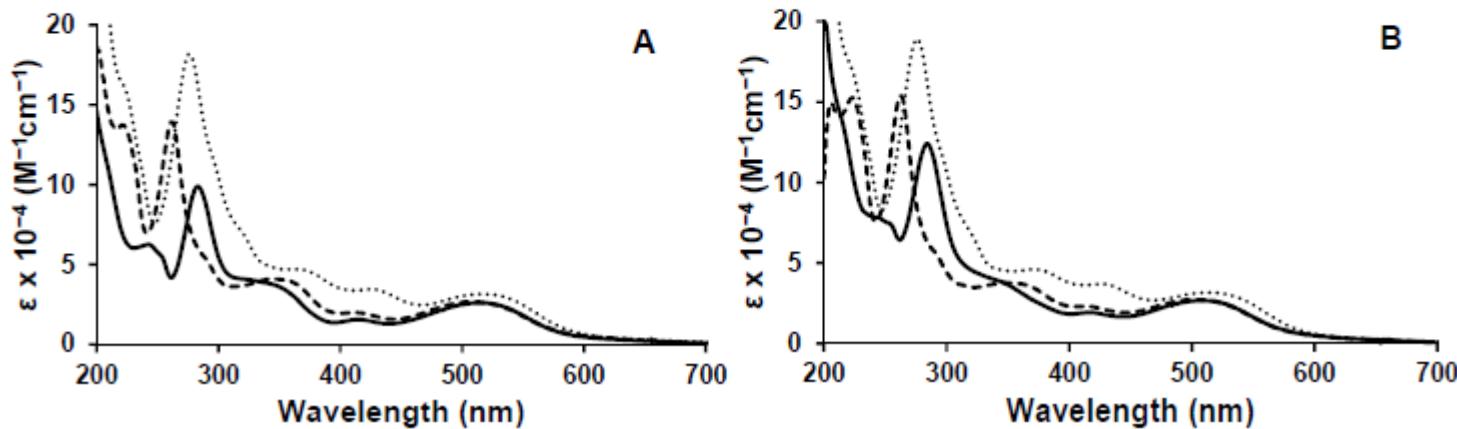


# ABBREVIATIONS

“... electron donor (ED), such as an electron rich, metal-based light absorber (LA), and electron acceptor (EA) sites.”

# SPECTRA

**Figure 3.** Electronic absorption spectra for the complexes (A)  $[(\text{TL})_2\text{Ru}(\text{dpp})]_2\text{RhCl}_2]^{5+}$ , where TL = bpy (—), phen (- - -), Ph<sub>2</sub>phen (· · ·) and (B)  $[(\text{TL})_2\text{Ru}(\text{dpp})]_2\text{RhBr}_2]^{5+}$ , where TL = bpy (—), phen (- - -), Ph<sub>2</sub>phen (···).



# TABLES

**Table 2.** Excited state reduction potentials and thermodynamic driving force for excited state reductive quenching of  $\{(\text{TL})_2\text{Ru}(\text{dpp})\}_2\text{RhX}_2]^{5+}$  supramolecular complexes.

Complex	$E(^*\text{CAT}^{\text{n}+}/\text{CAT}^{(\text{n}-1)^+})$ ${}^3\text{MLCT}$ (V) <sup>a</sup>	$E(^*\text{CAT}^{\text{n}+}/\text{CAT}^{(\text{n}-1)^+})$ ${}^3\text{MMCT}$ (V) <sup>a</sup>	$E_{\text{redox}}$ ${}^3\text{MLCT}$ (V) <sup>b</sup>	$E_{\text{redox}}$ ${}^3\text{MMCT}$ (V) <sup>b</sup>	$k_{\text{q}} + k_2$ (M <sup>-1</sup> s <sup>-1</sup> ) <sup>c</sup>
$[\text{Ru}(\text{bpy})_3]^{2+}$ <sup>e</sup>	+0.82	--	-0.04	--	$7.1 \times 10^7$ <sup>d</sup>
$[\text{Ru}(\text{bpz})_3]^{2+}$ <sup>f</sup>	+1.50	--	+0.64	--	$8.4 \times 10^9$ <sup>d</sup>
$[\{(\text{bpy})_2\text{Ru}(\text{dpp})\}_2\text{RhCl}_2]^{5+}$	+1.35	+0.94	+0.49	+0.08	$2.5 \times 10^9$
$[\{(\text{bpy})_2\text{Ru}(\text{dpp})\}_2\text{RhBr}_2]^{5+}$	+1.38	+0.99	+0.52	+0.13	$3.2 \times 10^9$
$[\{(\text{phen})_2\text{Ru}(\text{dpp})\}_2\text{RhCl}_2]^{5+}$	+1.41	+1.01	+0.55	+0.15	$3.9 \times 10^9$
$[\{(\text{phen})_2\text{Ru}(\text{dpp})\}_2\text{RhBr}_2]^{5+}$	+1.44	+1.05	+0.58	+0.19	$5.9 \times 10^9$
$[\{(\text{Ph}_2\text{phen})_2\text{Ru}(\text{dpp})\}_2\text{RhCl}_2]^{5+}$	+1.43	+1.04	+0.57	+0.18	$1.5 \times 10^9$
$[\{(\text{Ph}_2\text{phen})_2\text{Ru}(\text{dpp})\}_2\text{RhBr}_2]^{5+}$	+1.46	+1.09	+0.60	+0.23	$2.9 \times 10^9$

<sup>a</sup> Potential in V vs. Ag/AgCl,  $E(^*\text{CAT}^{\text{n}+}/\text{CAT}^{(\text{n}-1)^+})$  is the excited state reduction potential;

<sup>b</sup> Thermodynamic driving force calculated by measuring the difference between the excited state reduction potential of the complex and the ground state oxidation potential of the electron donor DMA (DMA<sup>0/+</sup> = 0.86 V vs. Ag/AgCl); <sup>c</sup> Rate constant for quenching of  ${}^3\text{MLCT}$  excited state through bimolecular interactions with the electron donor DMA; <sup>d</sup> Values are reported  $k_{\text{q}}$  rate constants; <sup>e</sup> From reference [33]; <sup>f</sup> From reference [34].

# PROPERTIES (NAME-VALUE-UNITS)

a rate constant of  $7.1 \times 10^7 \text{ M}^{-1}\text{s}^{-1}$

Name	Value	Units
------	-------	-------

V U N

V U N

N

V V

<sup>a</sup> Results correspond to 5 h photolysis time using 470 nm LED light source (light flux =  $2.36 \pm 0.05 \times 10^{19}$  photons/min; solution volume = 4.5 mL; head space volume = 15.5 mL); <sup>b</sup> TON = turnover

U

$E(*\text{CAT}^{n+}/\text{CAT}^{(n-1)+})$  ranging from 1.35–1.46 V vs. Ag/AgCl

N

V V U

Note CML supports value ranges and errors

# Mathematics

$$\frac{1}{\Phi_{\text{product}}} = \left( \frac{1}{\Phi_{3\text{MMCT}}} \right) \left( \frac{k_4}{k_{q2}[\text{DMA}]} \right) + \frac{k_{q2} + k_3}{k_{q2}}$$

CML is being integrated with  
computable (content) MathML

# Materials Search Challenge

- What would you like a “Google for materials” to find for you in the scientific literature?

# Creating CML

- ~~Hand editing (tedious and errorprone)~~
- Tools (Avogadro, JChempaint, Chem4Word)
- Direct output from programs (FoX, JUMBO)
- Conversion from structured files (Openbabel)
- Online knowledgebase (Wikipedia, PubChem)
- Conversion from semistructured (log)files (JUMBOConverters)
- Extraction from text (ChemicalTagger, OSCAR, OPSIN, AMI2-SVG2CML)

# Demos

- OPSIN <http://opsin.ch.cam.ac.uk>
- ChemicalTagger  
<http://chemicaltagger.ch.cam.ac.uk>

# Crystaleye

- A database of 200,000 crystal structures scraped from supplemental information
- CML molecules and name-value pairs
- Re-usable as fragment base

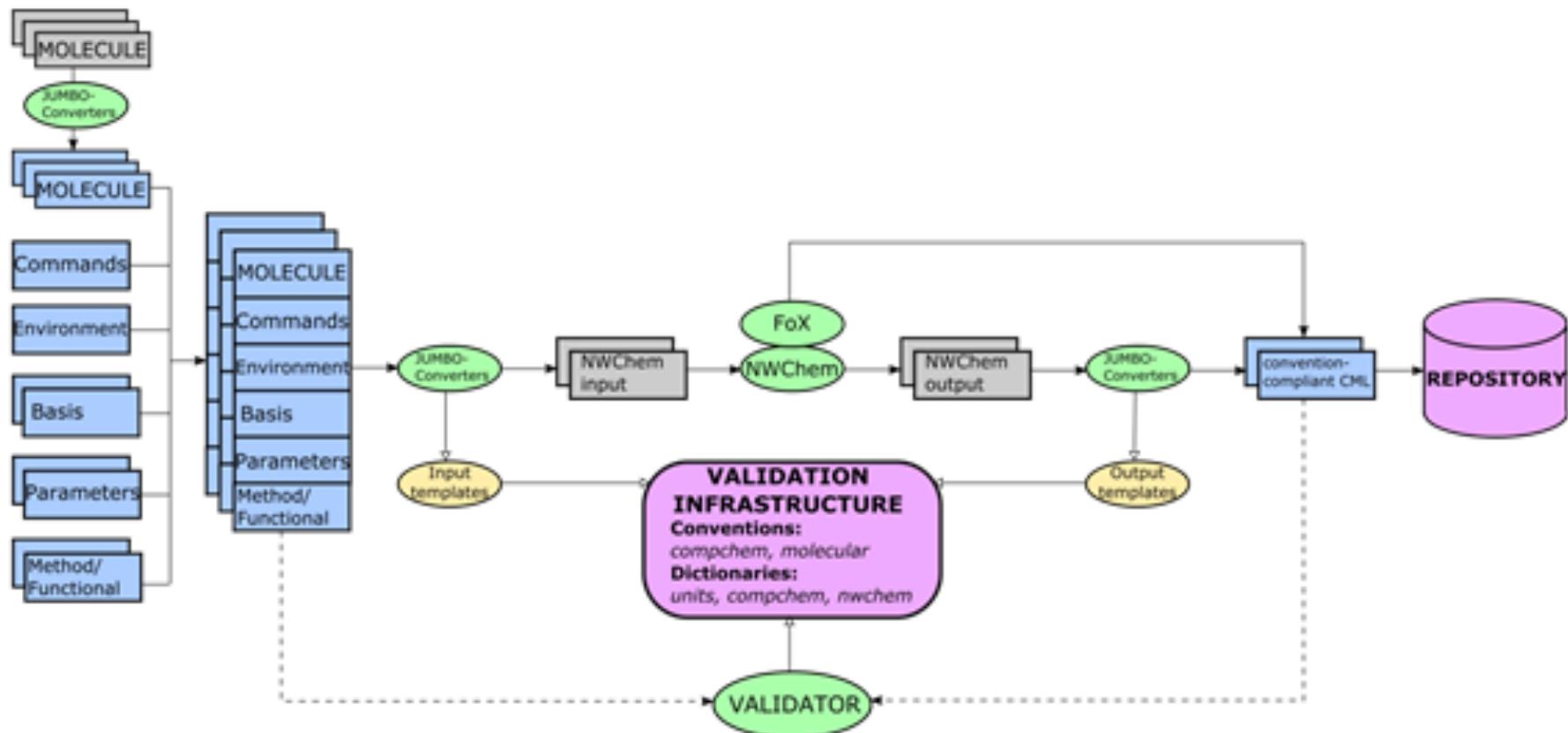
<http://wwmm.ch.cam.ac.uk/crystaleye>

# Knowledgebases

- Quixote. Logfiles from compchem output parsed into CML
- Integrated into an XML/RDF knowledgebase
- Searchable on chemistry and properties
- <http://quixote.ch.cam.ac.uk>
- Sam Adams, Cambridge

# Ontologies in physical science

- #animalgarden production



**FIGURE 2.** Schematic model of a semantic framework for computational chemistry (using NWChem<sup>11</sup>)

# Jumbo Converters

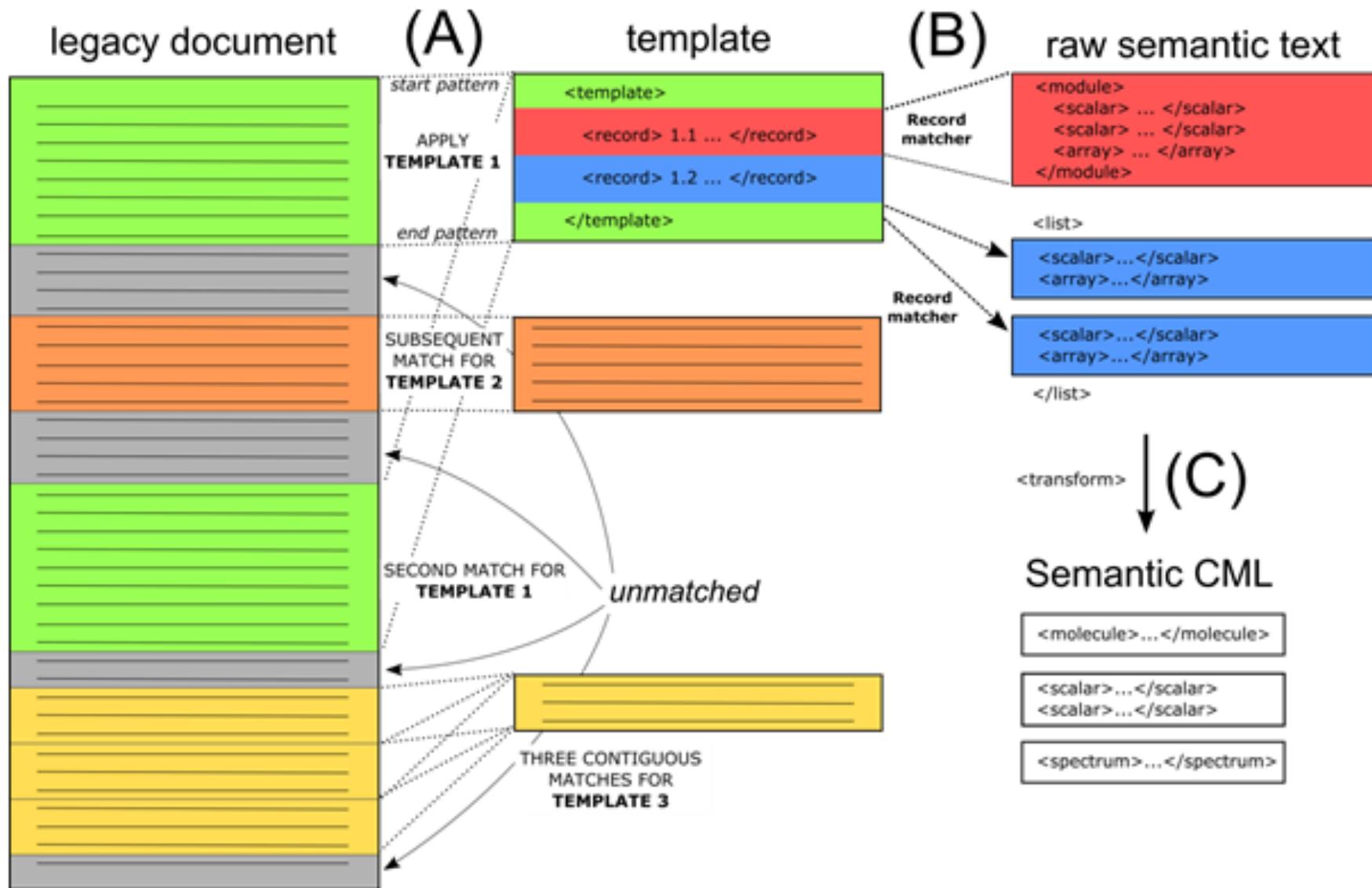


FIGURE 3: Processing a legacy document with templates. (A) A template matches chunks of the

# JumboConverters - templates

```
<template id="xyz" name="XYZ format geometry"
repeat=""
newline="$"
pattern="\s*XYZ format geometry\s*\$\s+\-+.*"
offset="0"
endPattern="\s*\$\s*"
endPattern2="\s*\$\s*NWChem SCF Module\s*"
endOffset="0"

<comment class="example.input" id="xyz">
    XYZ format geometry
    -----
    11
    geometry
    fe      0.00000000  0.00000000  0.00000000
    c       0.00000000  0.00000000  1.80680057
    o       0.77109980 -2.87778364  0.00000000
</comment>

<record repeat="2"/>
<record id="atoms">\s*{1,compchem:natoms}\s*</record>
<record id="geo">\s*{A,n;geomtype}\s*</record>
<record makeArray="true" repeat="">
<record id="mol">\s*{A,compchem:elementType}\s*{F,compchem:x3}\s*
    {F,compchem:y3}\s*{F,compchem:z3}\s*</record>
<transform process="createMolecule"
    xpath=".//cml:list[@cmlx:templateRef='mol']/cml:array" id="xyz"/>
```

LOGFILE

# Dictionaries

- <http://www.xml-cml.org/convention/unit-dictionary>
- <http://www.xml-cml.org/convention/compchem>

# JumboConverters Structure

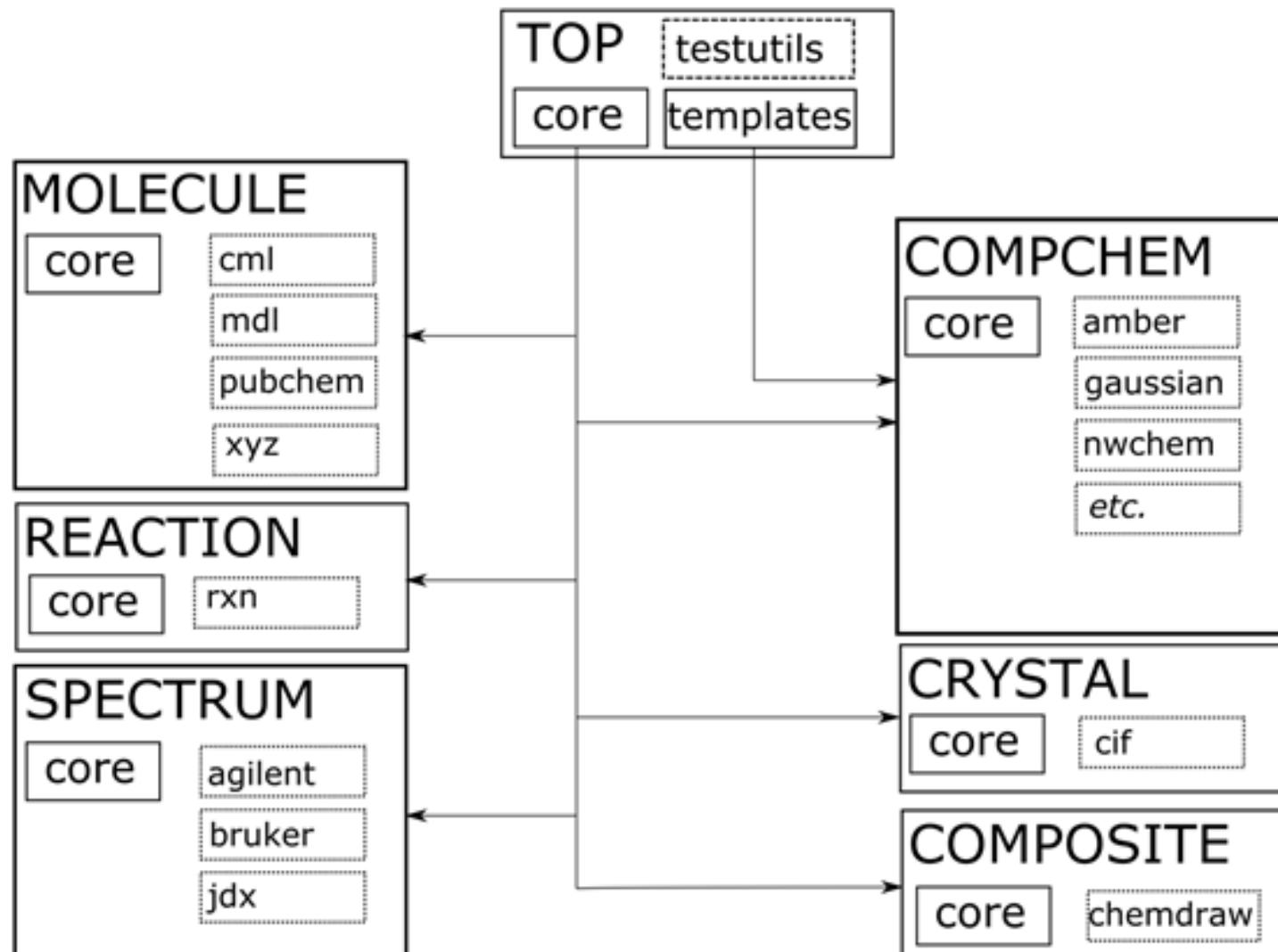


Figure 6: The modular structure of JUMBO-Converters. The five subdomains of chemistry are

- <http://pantonprinciples.org/> Open data



# Research data: managing and training

- <http://blogs.ch.cam.ac.uk/pmr/2013/02/13/rds2013-principles-for-managing-research-data/>
- <http://sophiekershaw.wordpress.com/author/sophiekershaw/>
- <http://www.opensciencetraining.com/content.php>

# TimBL's Open data

<http://5stardata.info>

- ★ make your stuff available on the Web (whatever format) under an open license
- ★★ make it available as structured data (e.g., Excel instead of image scan of a table)
- ★★★ use non-proprietary formats (e.g., CSV instead of Excel)
- ★★★ use URIs to denote things, so that people can point at your stuff
- ★★★ link your data to other data to provide context

# Jailbreaking the PDF Hackathon

- <http://scholrev.org/hackathon/> a group of enthusiasts committed to liberating data.

## Cermine

- A JAVA Library and web service for extracting metadata and content from PDFs
- <https://github.com/CeON/CERMINE>

## Data

- 1,943 open access PDFs and corresponding XML from many different journals
- 561 Open Access PDF files courtesy of iDigInfo/MSRC
- Cochrane Review Paper - contains 785 pages and over 600 forest plot figures
- Cochrane Review Paper - relatively smaller (139 pages) and additional data

## Biointerchange

- A webservice and library that transforms data sets into linked data
- <http://www.biointerchange.org/>

## Hacking Ideas

- Improve automatic identification of citation references in a PDF and extract them into structured markup
- Identify the main narrative in a PDF and extract it into structured markup

## Partridge

- An open-source data extraction tool for PDFs
- <https://github.com/ravenscroftj/partridge>

## xpdf

- Open-source PDF viewer
- <http://www.foolabs.com/xpdf/>

# Conclusions