Semantic annotations and querying **SBML** simulations





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Objective

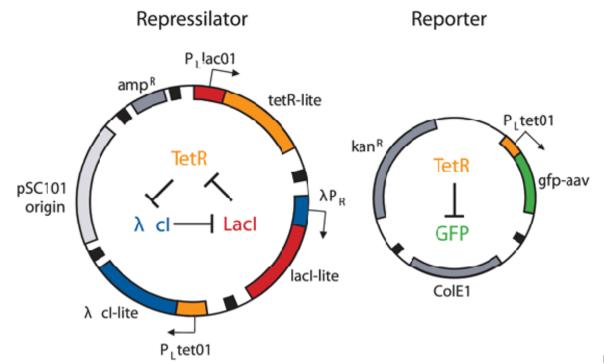
To answer questions about SBML models and the results of simulations

Approach

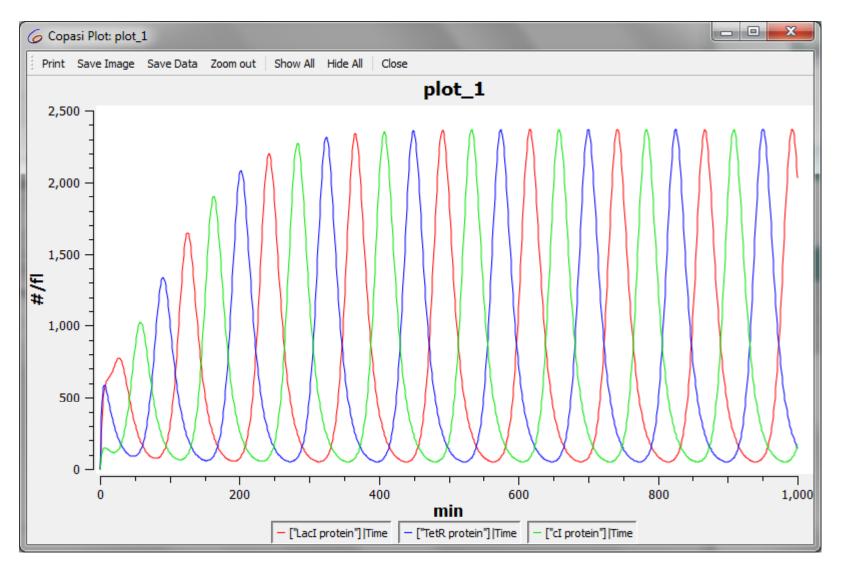
- We formally represent semantically annotated biomodels using the Web Ontology Language (OWL), such that it becomes possible to:
 - reason about the knowledge and check it's consistency
 - simultaneously query the results of simulations with what is known about the model components (species, compartments, reactions, mathematical expressions, parameters, etc).

Example

- Repressilator: A self-regulating system
- A synthetic oscillatory network of transcriptional regulators. Elowitz MB, Leibler S. (2000). Nature 403: 335-338.







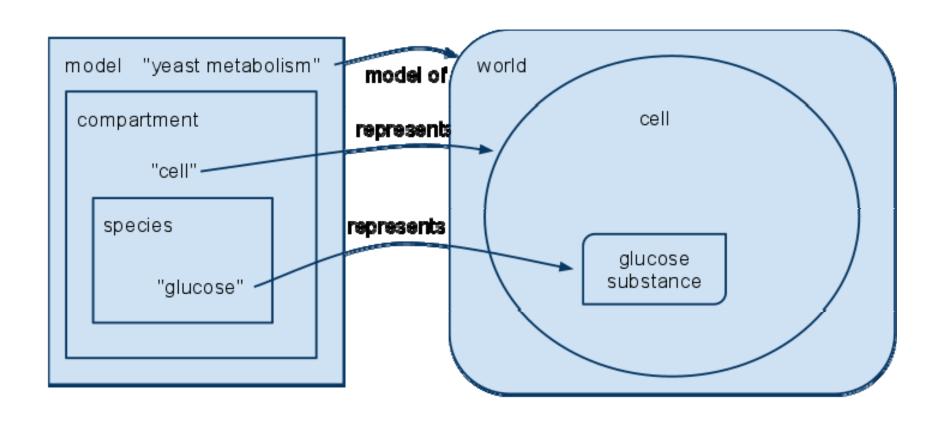
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Annotated SBML Biomodel

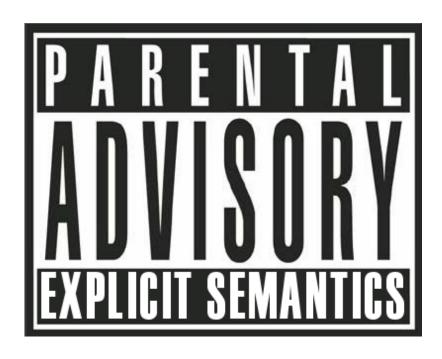
```
<sbml xmlns="http://www.sbml.org/sbml/level2/version3" metaid=" 153818" level="2" version="3">
  <model metaid=" 000001" id="repressilator" name="Elowitz2000 Repressilator">
    <annotation>
  <rdf:RDF xmlns:rdf="http://www.w3.org/1999/02/22-rdf-syntax-ns#" xmlns:dc="http://purl.org/dc/elements/1.1/" xmlns:dcterms=
  "http://purl.org/dc/terms/" xmlns:vCard="http://www.w3.org/2001/vcard-rdf/3.0#" xmlns:bgbiol=
  "http://biomodels.net/biology-qualifiers/" xmlns:bgmodel="http://biomodels.net/model-qualifiers/">
    <rdf:Description rdf:about="# 000001">
      <dc:creator rdf:parseType="Resource">
      <dcterms:created rdf:parseType="Resource">
      <dcterms:modified rdf:parseType="Resource">
      <box><br/>bomodel:is></br/>
        <rdf:Bag>
          <rdf:li rdf:resource="urn:miriam:biomodels.db:BIOMD0000000012"/>
        </rdf:Bag>
      </bomodel:is>
      <box>del:is></box
      <bg rowspan="2"><bgmodel:isDescribedBy>
      <br/>dpiol:isVersionOf>
        <rdf:Bag>
          <rdf:li rdf:resource="urn:miriam:obo.go:G0%3A0040029"/>
        </rdf:Bag>
      </bddiol:isVersionOf>
      <bgbiol:is>
        <rdf:Bag>
          <rdf:li rdf:resource="urn:miriam:taxonomy:562"/>
        </rdf:Bag>
      </bddiol:is>
    </rdf:Description>
  </rdf:RDF>
    </annotation>
<listOfUnitDefinitions>
<listOfCompartments>
Species>
<listOfParameters>
tOfRules>
stOfReactions>
</model>
</sbml>
```

Conceptualization:

Model entities (models and model components) are distinguished from the entities they represent

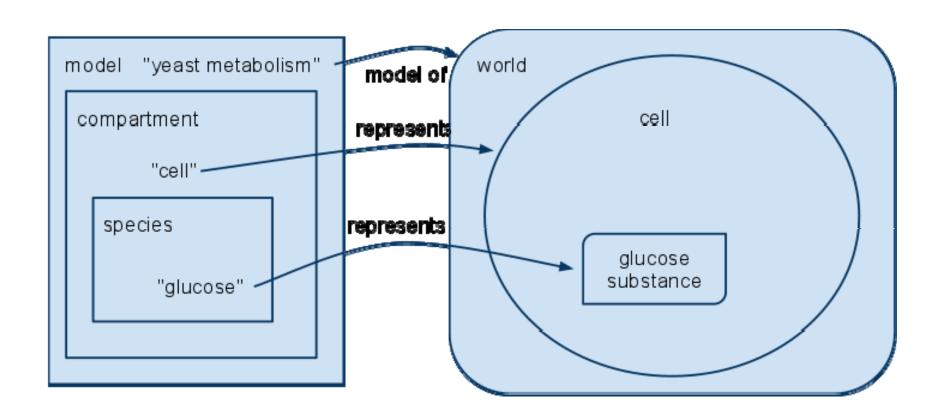


The Web Ontology Language (OWL) Has Explicit Semantics

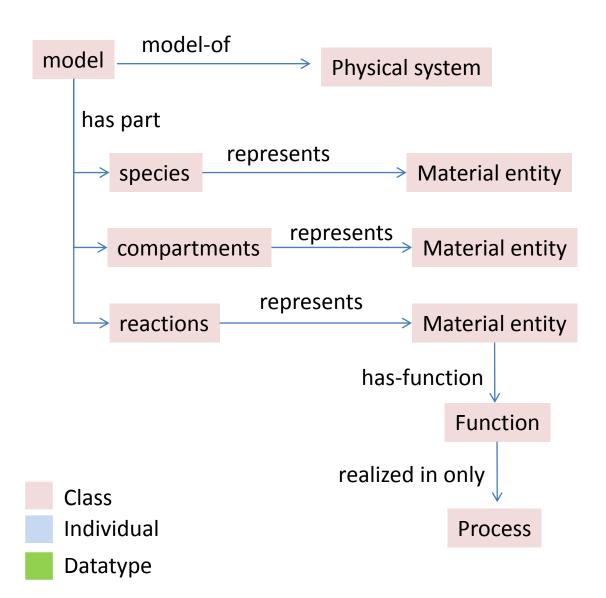


Can therefore be used to capture knowledge in a machine understandable way

Formalization: every element E of the SBML language represents a class Rep(E) and we assert that E subClassOf: represents some Rep(E)



Models and their components represent physical entities (material entities, processes)



SBMLHarvester

Robert Hoehndorf, Michel
Dumontier, John H Gennari, Sarala
Wimalaratne, Bernard de Bono,
Daniel L Cook and Georgios V
Gkoutos. Integrating systems
biology models and biomedical
ontologies. BMC Systems Biology
2011, 5:124.

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Species are further described with 'modifiers' in the context of a reaction

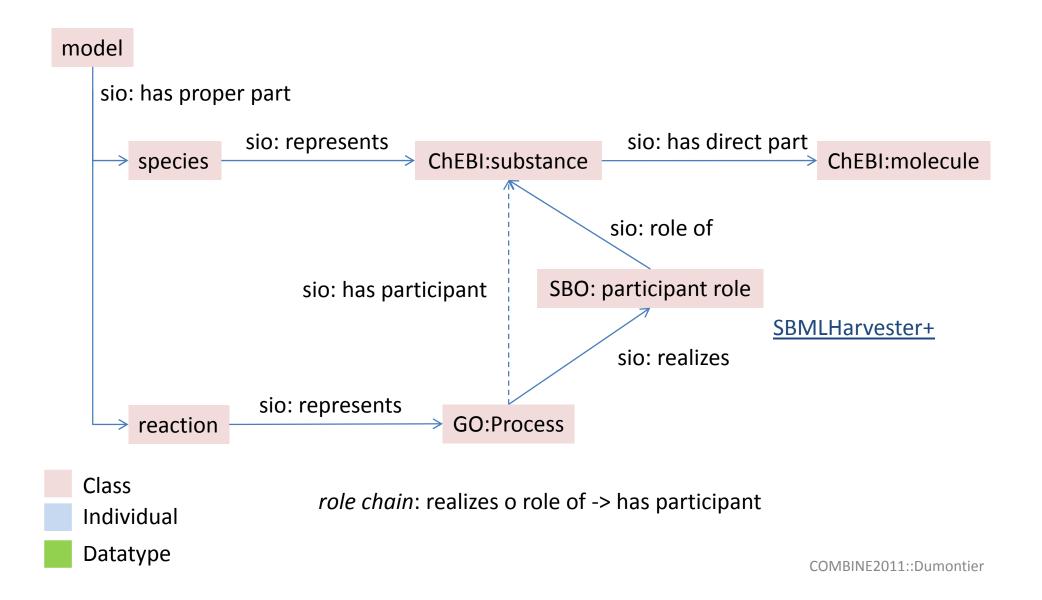
essential activator

```
tOfModifiers>
  <modifierSpeciesReference sboTerm="SBO:0000461" species="X"/>
</listOfModifiers>
```

partial inhibitor

```
<listOfModifiers>
<modifierSpeciesReference sboTerm="SBO:0000536" species="PX"/>
</listOfModifiers>
```

Roles are realized in the context of processes by material entities



Semanticscience Integrated Ontology (SIO)

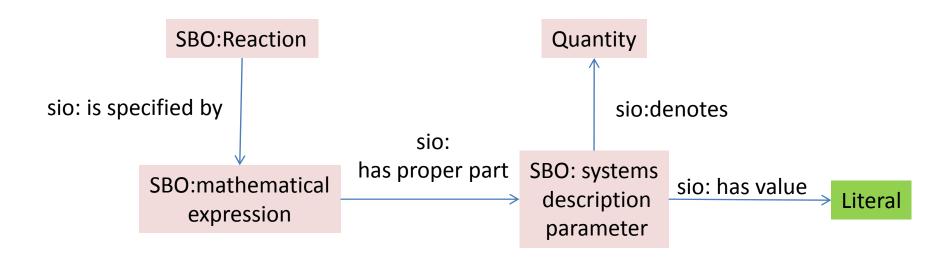
- OWL2 ontology
- 100+ classes covering basic types (physical, processual, abstract, informational) with an emphasis on biological entities
- 183 basic relations (mereological, participatory, attribute/quality, spatial, temporal and representational)
- axioms can be used by reasoners to compute inferences for consistency checking, classification and answering questions about life science knowledge
- embodies emerging ontology design patterns
 - specifies a data model
- dereferenceable URIs
- searchable in the NCBO bioportal
- Available at http://semanticscience.org/ontology/sio.owl

Examining Mathematical Expressions

<assignmentRule metaid="metaid 0400235"

```
<kineticLaw sboTerm="SBO:0000049">
                                      variable="k tl">
 <math>
                                       <math>
  <apply>
                                       <apply>
   <times/>
                                        <divide/>
    <ci> k tl </ci>
                                        <ci> eff </ci>
    <ci> X </ci>
                                        <ci>t ave </ci>
  </apply>
                                        </apply>
 </kineticLaw>
                                      </assignmentRule>
<parameter metaid="metaid_0000233" id="k_tl" name="k_tl" constant="false"</pre>
sboTerm="SBO:0000016"> (unimolecular rate constant)
 <notes> Translation rate constant </notes>
</parameter>
<parameter metaid="metaid_0000025" id="eff" name="translation efficiency" value="20">
 <notes> Average number of proteins per
transcript </notes>
≼/parameter>
                                                               COMBINE2011::Dumontier
```

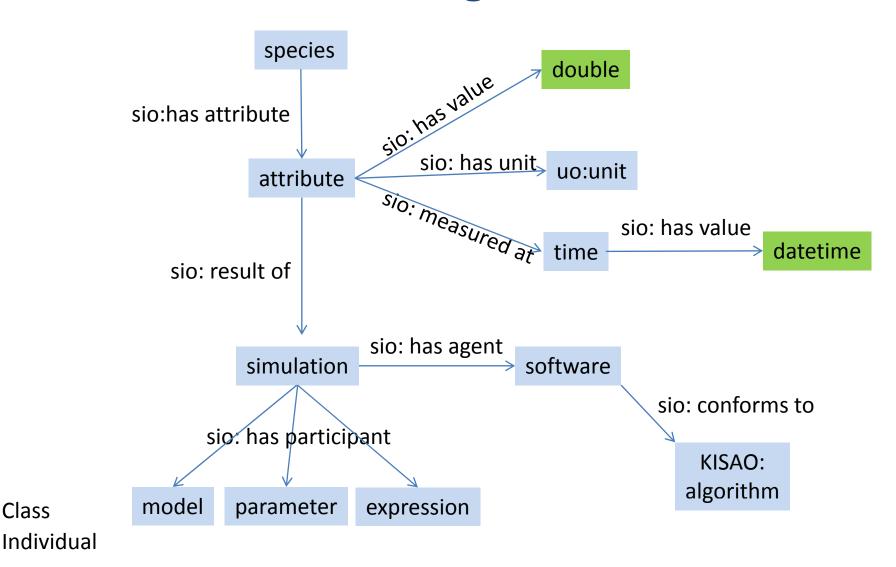
SBML Reactions may be *specified by* mathematical expressions, which contain quantiative variables that *denote* quantities





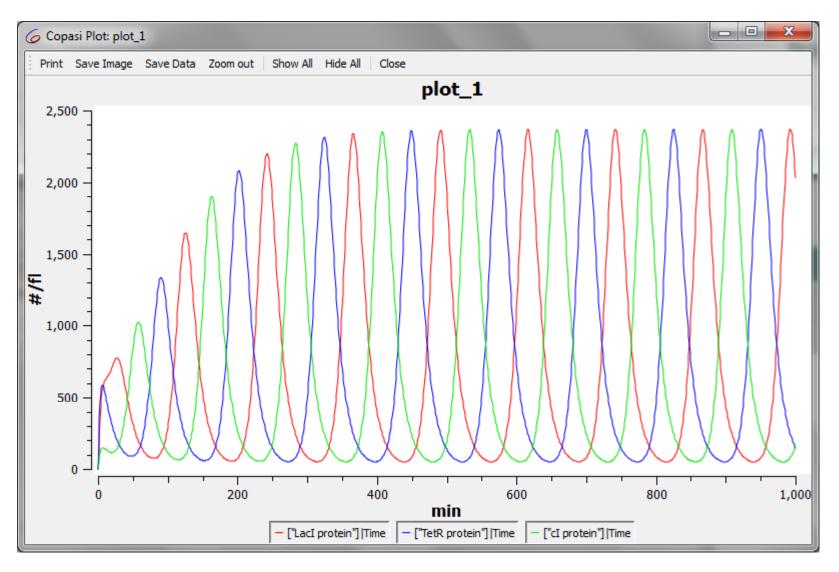
SBMLFarmer

When running a simulation, some attributes change with time



Class



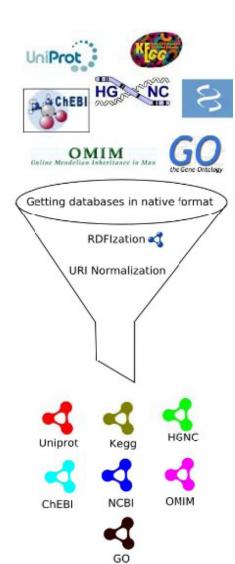


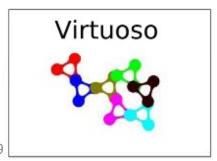
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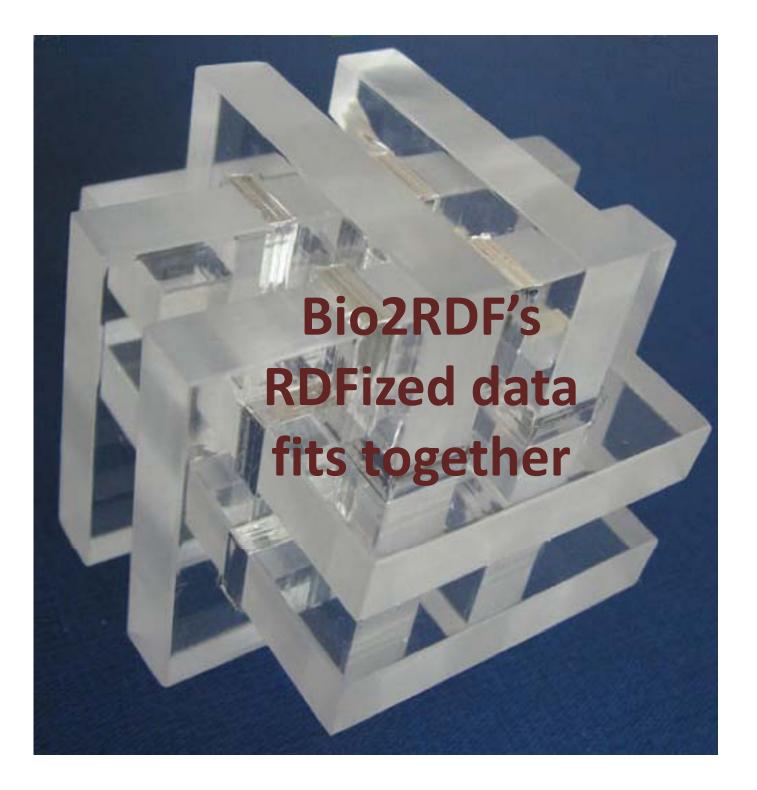
Copasi output: **not** machine understandable

| Α | В | С | D | Е | F | G | Н | 1 | J | K | L | M | N | 0 | Р | Q |
|-------|------------|------------|------------|-----------|----------|----------|---|-----------|-----------|-----------|------------|-----------|-----------|-----------|-----------|---------|
| #Time | Lacl prote | TetR prote | cl protein | Lacl mRNA | TetR mRN | cl mRNA | | Values[be | Values[al | Values[al | Values[tra | Values[n] | Values[KN | Values[ml | Values[pr | - |
| 0 | 0 | 0 | 0 | 0 | 20 | 0 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 1 | 81.4405 | 188.382 | 42.6413 | 19.9034 | 30.6156 | 7.491 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 2 | 218.539 | 358.027 | 84.5888 | 21.2335 | 23.6089 | 5.86627 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 3 | 337.623 | 469.627 | 113.055 | 18.5441 | 17.2349 | 4.40364 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 4 | 428.939 | 536.664 | 131.035 | 15.5598 | 12.4821 | 3.29582 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 5 | 495.497 | 572.019 | 141.441 | 13.018 | 9.03773 | 2.48567 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 6 | 542.466 | 585.398 | 146.532 | 11.0337 | 6.56428 | 1.90266 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 7 | 574.778 | 583.832 | 147.977 | 9.56151 | 4.79541 | 1.48837 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 8 | 596.57 | 572.335 | 146.993 | 8.51888 | 3.53331 | 1.19835 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 9 | 611.14 | 554.454 | 144.458 | 7.82324 | 2.63412 | 0.999828 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 10 | 621.044 | 532.674 | 141.004 | 7.40287 | 1.99408 | 0.869004 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 11 | 628.231 | 508.728 | 137.085 | 7.19849 | 1.5387 | 0.788821 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 12 | 634.16 | 483.805 | 133.028 | 7.16163 | 1.21462 | 0.747164 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 13 | 639.897 | 458.714 | 129.068 | 7.25233 | 0.983648 | 0.735535 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 14 | 646.193 | 433.993 | 125.381 | 7.43676 | 0.818491 | 0.748075 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 15 | 653.535 | 409.987 | 122.095 | 7.68527 | 0.699679 | 0.780855 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 16 | 662.19 | 386.909 | 119.309 | 7.97095 | 0.61336 | 0.83136 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 17 | 672.232 | 364.881 | 117.104 | 8.26865 | 0.549728 | 0.89813 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 18 | 683.569 | 343.958 | 115.547 | 8.55459 | 0.501895 | 0.980494 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| 19 | 695.958 | 324.155 | 114.698 | 8.80638 | 0.465075 | 1.07839 | 1 | 0.2 | 0.216404 | 216.188 | 20 | 2 | 40 | 2 | 10 | 2.88539 |
| | | | | | | | - | | | | | - | | _ | | |

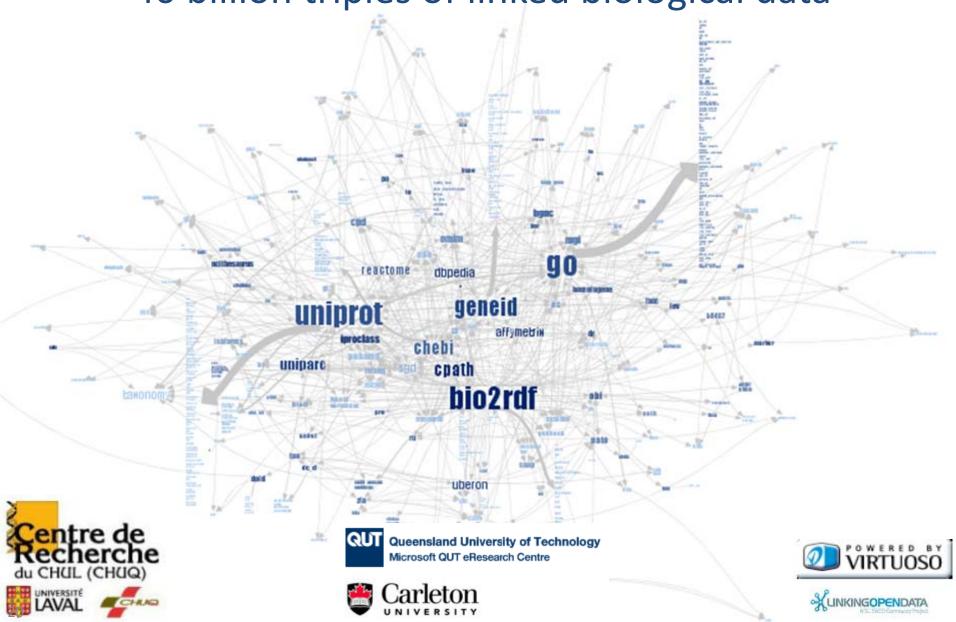
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Bio2RDF now serving over 40 billion triples of linked biological data



Query Answering over RDF/OWL

Find those concentration measurements for species that represent molecular entities that contain ribonucleotide residues

```
'concentration'

and ('measured at' some double[>20.0, <40.0])

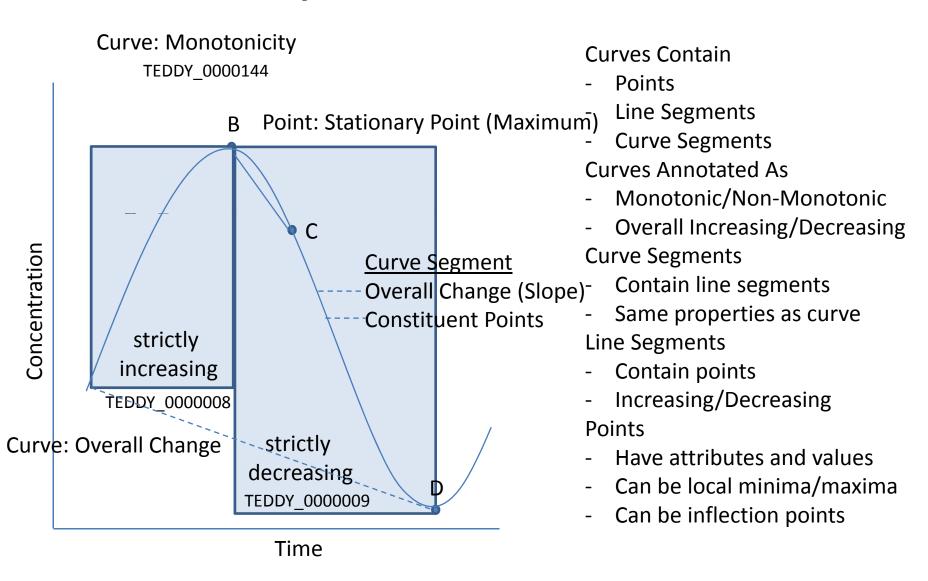
and 'is attribute of' some (

'species'

and 'represents' some ('has part' some 'ribonucleotide residue')

)
```

Curve Analysis: Elements of a Plot



Queries

```
'local maximum'
and 'is attribute of' some (
species
and represents some (
'has function' some 'dna binding'
))
```

Get the non-monotonic curves for protein species

```
'non-monotonic curve'
and 'has part' some (
 'concentration'
 and 'is attribute of' some (
  'species'
  and 'represents' some 'protein'))
```

Conclusion

- We extended our OWL ontology based representation to include
 - Modifiers
 - Mathematical Expressions and Parameters
 - Simulation Results (from tab files)
- We could answer questions about simulation results with reference to the semantic annotations (GO) in biomodels, UniProt
- Further develop and release software.

Acknowledgements

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Robert Hoehndorf



















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Publications: http://dumontierlab.com

Presentations: http://slideshare.com/micheldumontier