

# Enhancing the Semantics of Links and Paths in Life Sciences Data Sources

Louiqa Raschid  
University of Maryland

Collaborators:

Felix Naumann, S. Heymann, P. Rieger, Humboldt University

George Mihaila, IBM

Maria Esther Vidal, Universidad Simon Bolivar

Adam Lee and Yao Wu, University of Maryland

Alex Lash, Sloan Kettering

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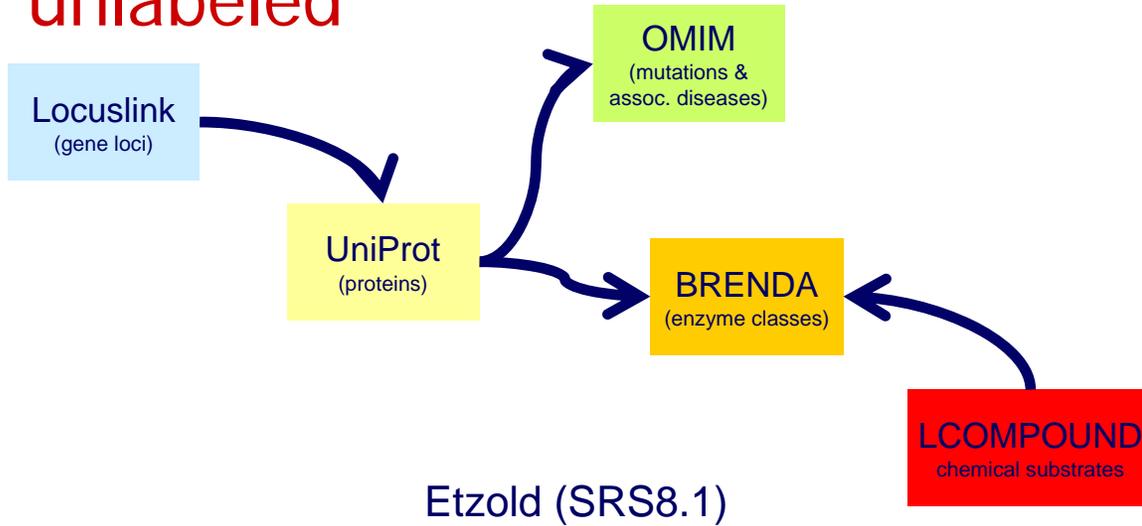
# Outline

- Motivation
- Example of (automated) link extraction
- Example of link labeling (ontologies)
- Data model for enhanced links and paths
- Query language for enhanced links and paths
- Query evaluation
- Status

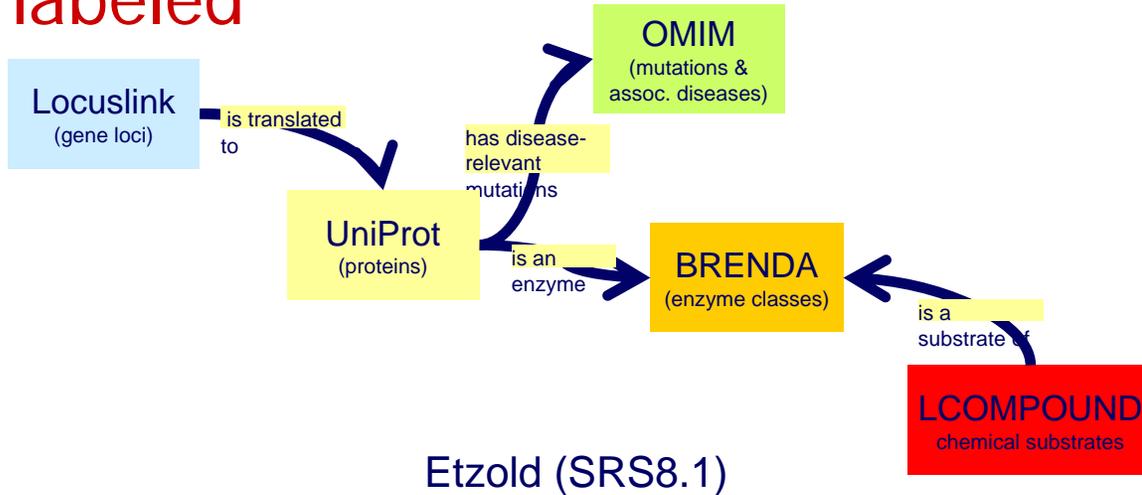


# Labels for Links

unlabeled



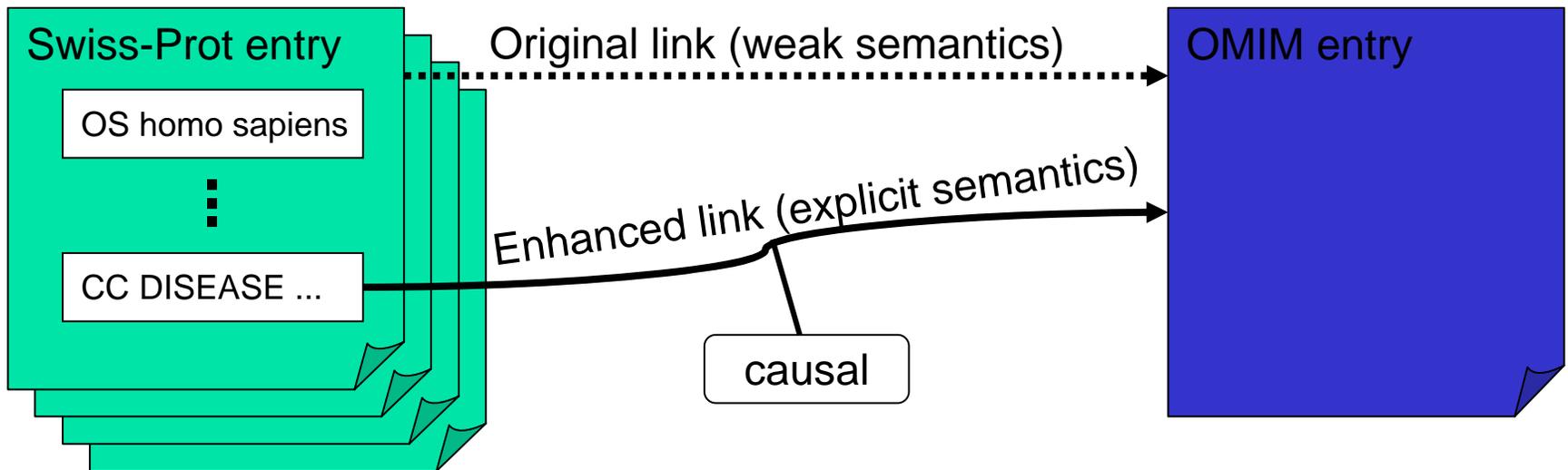
labeled



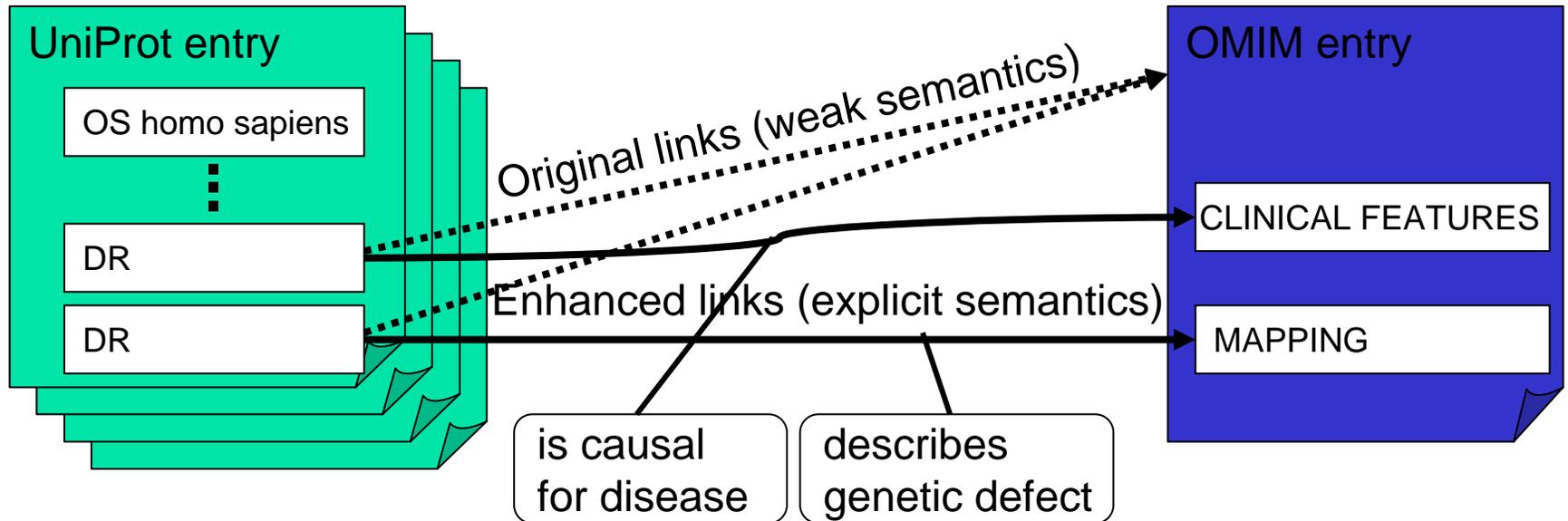
# What's in a link?

- Link may be added for different reasons.
  - Represents the result of an experiment protocol to test a hypothesis.
  - Data curators may add links following domain specific conventions.
  - A link may have been predicted by some (machine learning) software.....
- Current link implementation neither captures explicit semantics nor differentiates semantics.
  - RefSeq and LocusLink (NCBI); PDBSProtEC; ....
- Biologists can usually infer the meaning of a link and differentiate semantics but search engines and mediators cannot.

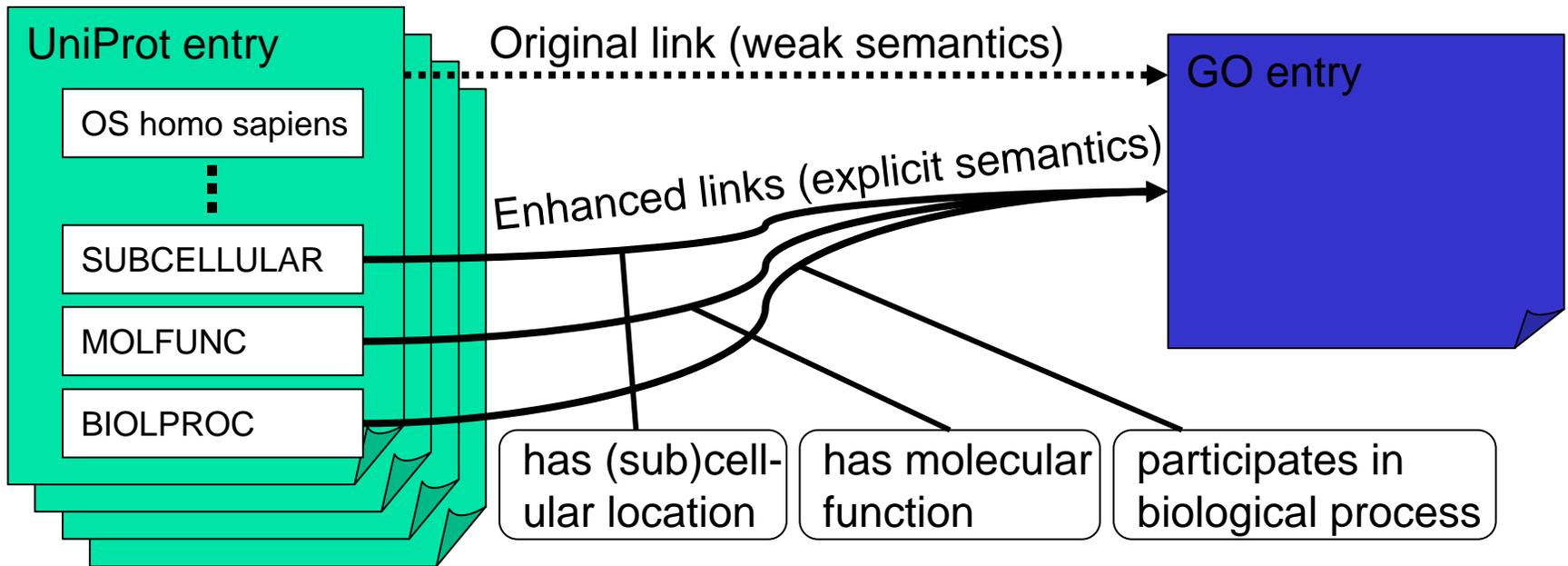
# Enhancing semantics of links



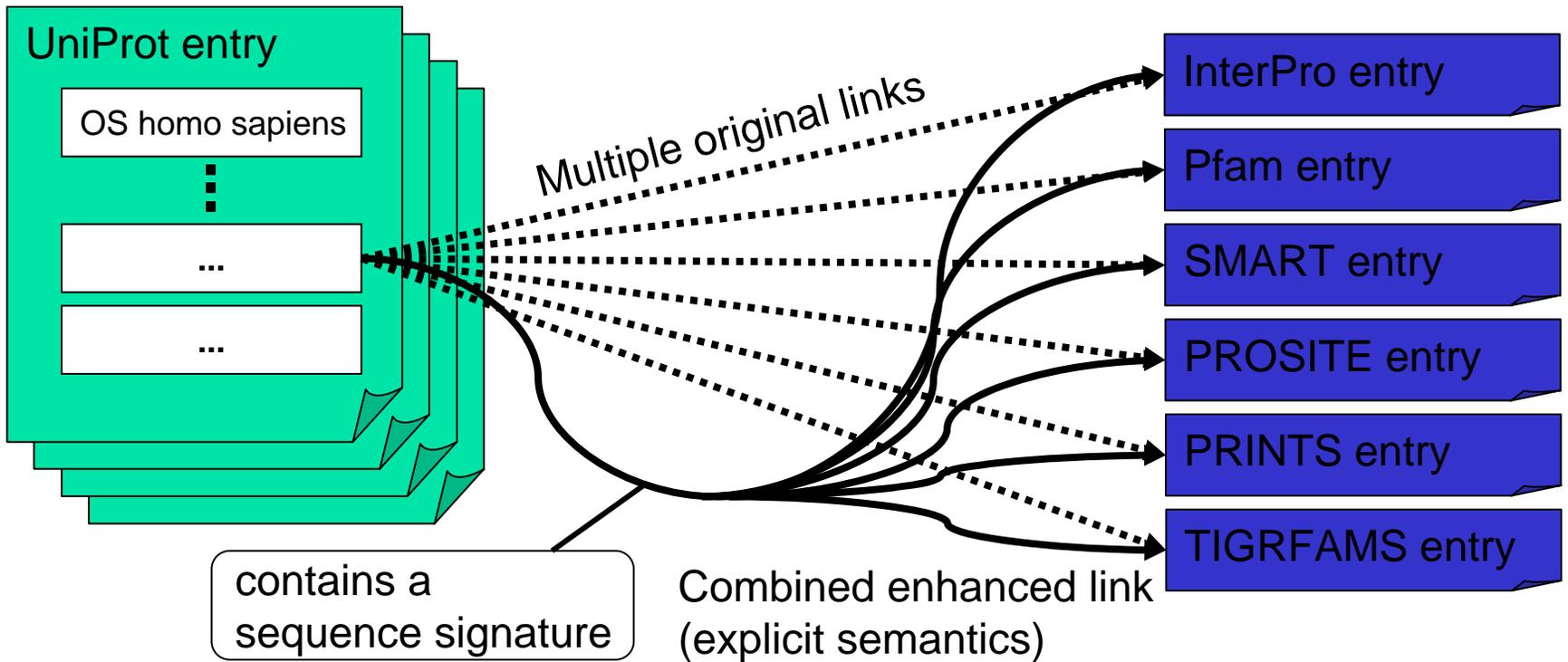
# Example of Enhanced Links



# Example of Enhanced Links



# More Complex Example of Enhanced Link



# enh-links

- Structure for enhanced links.
  - Source object and path to specific element of source object.
  - Target object and path to specific element of target object.
  - Label and meaning of links.
- Example: Link from UniProt to OMIM
  - **\$source is causal for disease \$target**  
UniProt ./DR[@name()="MIM"  
./CC[@name()="DISEASE"  
OMIM ./ID && ./CLINICAL FEATURES
  - **\$target describes genetic defects for \$source**  
Uniprot ./DR[@name()="MIM"  
OMIM ./ID && ./MAPPING
- Semi-automated techniques to enhance link labels.

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# PubMed to Human Genome: Machine assisted extraction of links

- Map PubMed citations (with marker references) to the human genome and determine link semantics.
- Each PubMed citation with a genomic locus reference may have four attributes:
  - (a) start position (string)
  - (b) end position (string: will be empty if start is a point locus)
  - (c) trait (one term of an enumerated list: "hypermethylation", "loss", "gain", "mutation", "polymorphism" "phenotype")
  - (d) LOD score (floating point number)
- Only (a) will be required, and all others may or may not be present.
- None are dependent on the others except for the above.
- Expected occurrence of attribute values:
  - (a) 100%
  - (b) <50%
  - (c) >75%
  - (d) >75%

# Machine assisted extraction, generation and enhancement of links

- Two link types:
  - marker semantics;
  - "study" or "trait" semantics.
- Marker semantics can be further enhanced
  - single marker without score;
  - single marker with score;
  - interval between markers without scores;
  - interval between markers with scores .....
- Both source and (implicit) target entries contribute to the link semantics.

# Example of assisted extraction

- Extraction protocol:
  - Search for "Fanconi" using Entrez Global Query. 105 OMIM hits; Select result #3: Fanconi Renotubular Syndrome.
  - Follow Entrez Link to PubMed. Select result #7, "Lichter-Konecki, U., Broman, K.W., Blau, E.B., Konecki, D.S.
  - Markers "D15S182" and "D15S537" appear in the abstract.
  - Use NCBI Map Viewer with parameters "Homo sapiens (human)"/organism and "D15S182 OR D15S537" /query box.
  - Results in 2 hits on Chromosome 15.
- Enhanced link from the disease "Fanconi Renotubular Syndrome" to a position interval on the human genome defined by markers D15S182 and D15S537 with log odds (LOD) scores of 4.44 and 4.68, respectively.
- How can this be used in a query? "Give me all genes associated with Fanconi Renotubular Syndrome" can use this enhanced path OMIM-PubMed-human genome concatenated with a link to your favorite gene source.

# Parsing rules (incomplete?)

- 1) split abstract into sentences
- 2) for each sentence
  - 2.a) find all semantic terms (below)
  - 2.b) find all markers
  - 2.c) find all words indicating intervals (between, from-to)
  - 2.d) find all negation words
  - 2.e) find all LOD scores
  - 2.f) for each marker
    - 2.f.i) associate marker to LOD scores (within 50 letters of one another?)
    - 2.f.ii) associate two markers if interval words come between them
    - 2.f.iii) associate all semantic terms in sentence to marker
    - 2.f.iv) associate negation term to semantic term (within 30 letters of one another?)
  - 2.g) for each interval
    - 2.g.i) associate all semantic terms in sentence to markers in interval

# Genomic marker semantics (ontology?)

## 1) EPIGENETIC ALTERATION

1.a) methylation

1.a.i) hypermethylation

1.a.ii) hypomethylation

1.b) histone moiety alteration

1.b.i) acetylation

1.b.ii) deacetylation

## 2) GENOMIC SEGMENT LOSS (synonym: loss)

2.a) genomic instability

2.a.i) microsatellite instability

2.a.ii) allelic imbalance (synonym: allelic loss, allelic reduction)

2.a.ii.1) loss of heterozygosity (synonym: LOH)

2.a.ii.2) hemizyosity

2.b) heterozygosity

2.c) homozygosity

2.d) haploinsufficiency

# Genomic marker (ontology?)

3) GENOMIC SEGMENT GAIN (synonym: gain, amplification)

4) GENOMIC SEQUENCE ALTERATION

4.a) mutation

4.b) polymorphism

4.b.i) microsatellite

4.b.ii) restriction fragment length polymorphism (synonym: RFLP)

4.b.iii) single nucleotide polymorphism (synonym: SNP, SNIp)

4.c) translocation

5) PHENOTYPIC ASSOCIATION (synonym: phenotype, trait)

5.a) locus association (synonym: locus, loci)

5.a.i) linkage

5.a.ii) quantitative trait locus (synonym: QTL)

5.b) allelic association (synonym: allele)

5.b.i) linkage disequilibrium

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# Data Model

- Ontology Graph:
  - Logical Classes  $\mathcal{C}$  (protein, gene, publication, disease,...)
  - Link Labels  $L$  (is causal for disease, describes genetic defect)
  - Link Types  $LT - (\mathcal{C}_1, l, \mathcal{C}_2) - l$  is a link label from  $L$  - between origin class  $\mathcal{C}_1$  and target class  $\mathcal{C}_2$   
(protein, is causal for disease, disease)
- Source Graph
  - Sources  $\mathcal{S}$  and a mapping  $ms: \mathcal{S} \rightarrow \mathcal{C}$
  - A set of source links  $L_S - (\mathcal{S}_1, l, \mathcal{S}_2)$  such that there exists  $(\mathcal{C}_1, l, \mathcal{C}_2)$  and  $\mathcal{S}_1$  maps to  $\mathcal{C}_1$  and  $\mathcal{S}_2$  maps to  $\mathcal{C}_2$  in  $ms$
  - Sources are responsible to publish  $L_S$

# Data Model

- Object Graph
  - Objects  $O$  and mapping  $mo: O \rightarrow S$
  - Links between objects  $L_O$  iff there exists  $(C_1, l, C_2)$  in  $LT$  and  $(S_1, l, S_2)$  in  $L_S$
- Link composability matrix  $LL$  specifies meaningful concatenations of link types of  $LT$ 
  - ☺  $(C_1, l_a, C_2) \cdot (C_2, l_b, C_3)$
  - ☹  $(C_1, l_a, C_2) \cdot (C_3, l_b, C_4)$
  - ☺  $l_a \cdot l_b$
- ☹ A life science data model is a 10-tuple!  
 $(C, L, LT, S, L_S, ms, mo, O, L_O, LL)$

# Query Language

*(C, L, LT, S, L<sub>S</sub>, ms, mo, O, L<sub>O</sub>, LL)*

- Identify **sources** in **S** that implement a given class.
- Identify **sources** in **S** that contain objects of a given class whose structure satisfies a given predicate.  
`protein [ in $s | $s contains Attr ]`
- Identify **objects** in **O** from a given source in **S** or from a given class in **C** whose attribute values satisfy a given predicate.  
`protein [ in Sn | o in Sn contains Attr with Value ]`
- Identify **paths** in **S, L<sub>S</sub>** that satisfy a path regular expression and **LL** and can include source predicates.  
`p .lab-a g .lab-b d .lab-c c`
- Identify **objects and paths** in **O, L<sub>O</sub>** that satisfy a path regular expression and **LL** and can include source/object predicates.

# Query Evaluation

*(C, L, LT, S, L<sub>S</sub>, ms, mo, O, L<sub>O</sub>, LL)*

- Path-labeled-link regular expression with predicates.
  - Validate regular expression against *LT* and *LL*.
  - Enumerate paths in *S, L<sub>S</sub>*.
  - Eliminate meaningless paths using *LL*.
  - Rank and further select/eliminate paths.
  - Enumerate paths on *O, L<sub>O</sub>*.
- Naive evaluation in a mediator architecture.
- Statistics and optimization.
- Ranking results.

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  - Automated extraction and labeling of links
  - Query evaluation