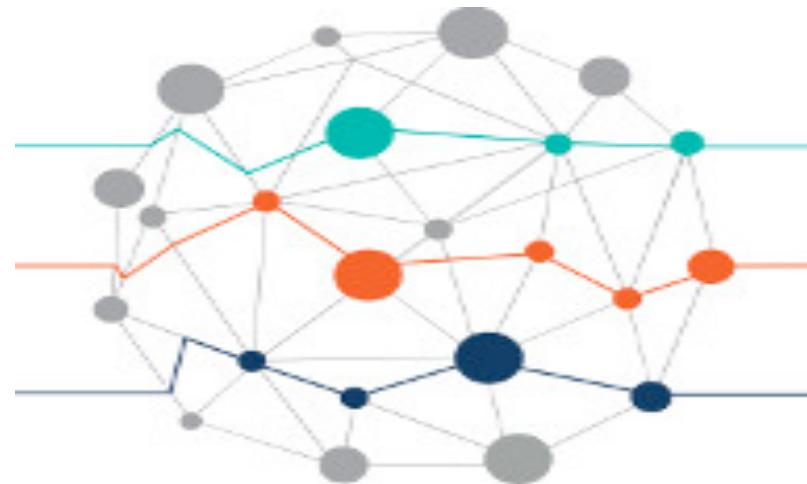




Knowledge Graph Semantics

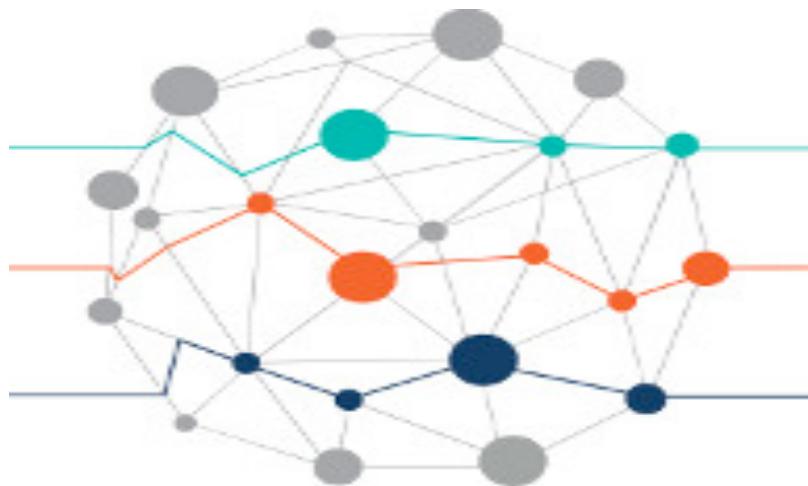


Professor James Hendler, RPI
Tetherless World Chair of Computer, Web and Cognitive Sciences
Director, Rensselaer Institute for Data Exploration and Analytics
@jahendler

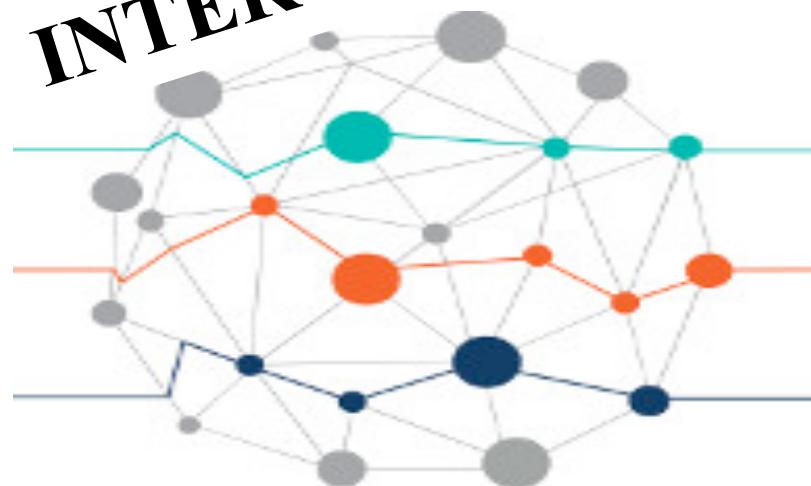


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Knowledge Graph Services



INTEROPERABILITY



Professor James Hendler, RPI
Tetherless World Chair of Computer, Web and Cognitive Sciences
Director, Rensselaer Institute for Data Exploration and Analytics
@jahandler



- The Web is growing
 - Siloed search engines
 - Social web just taking off
 - Flickr will be the future!
 - Challenge: hyperlinks are not enough

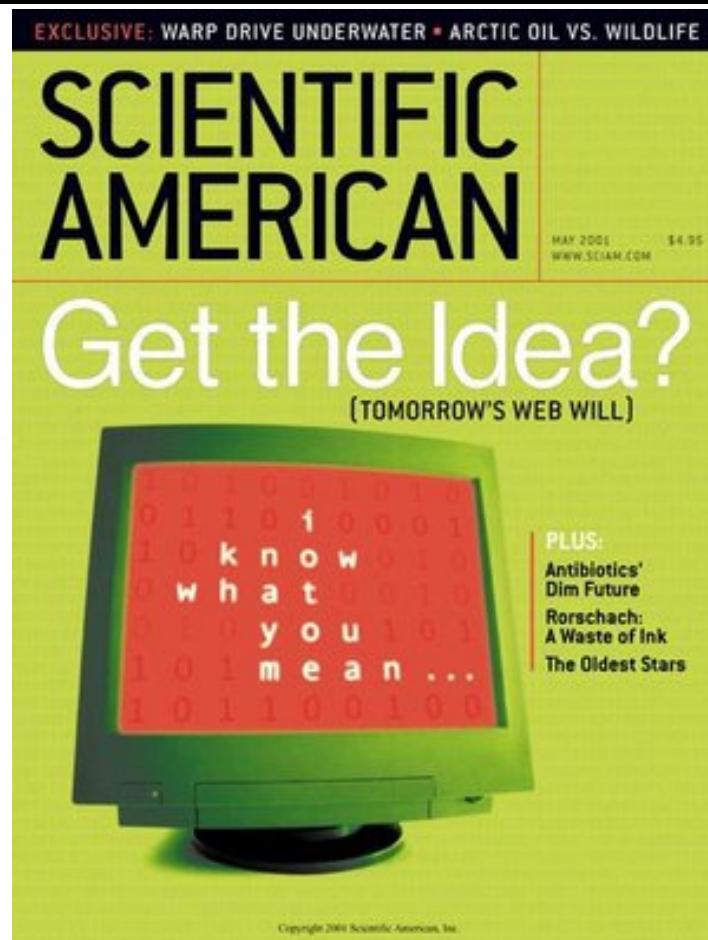


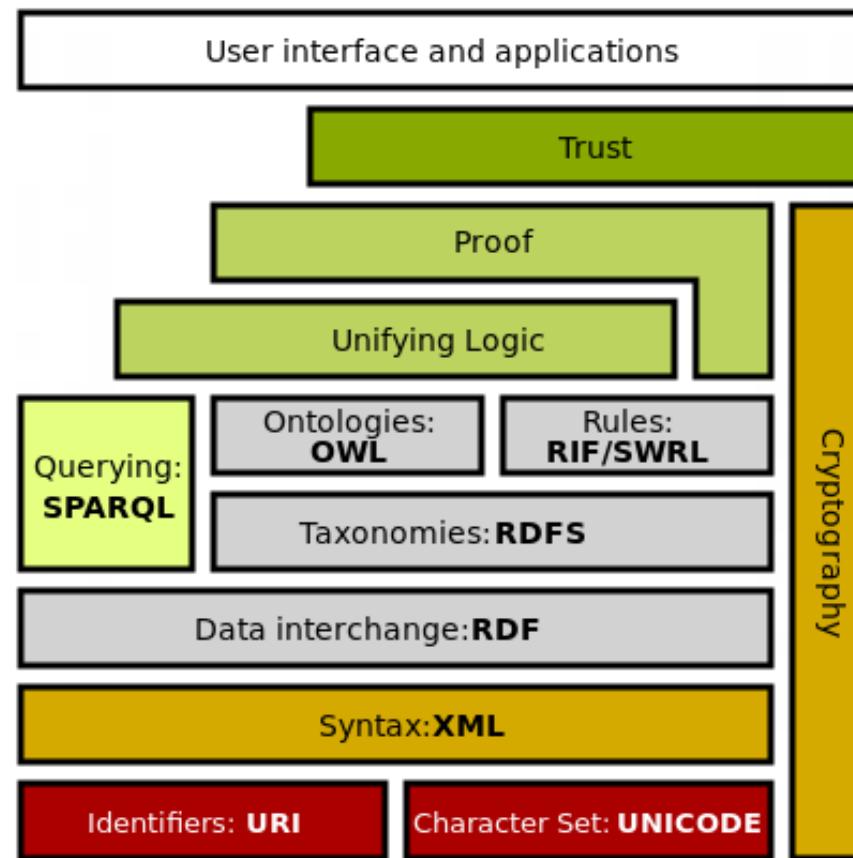


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Ancient History I (ca 2000)

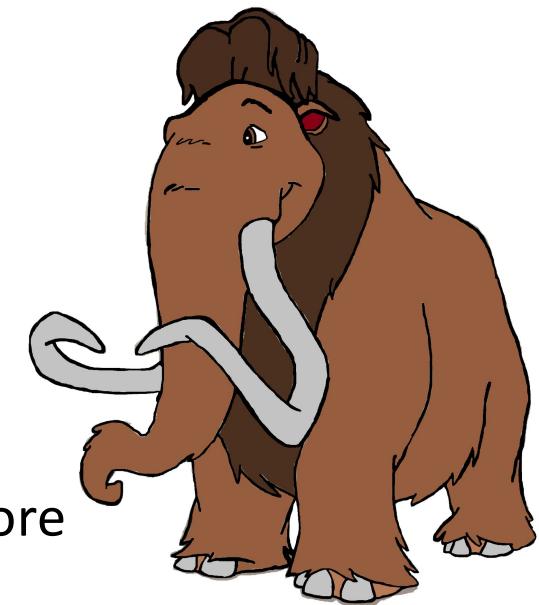
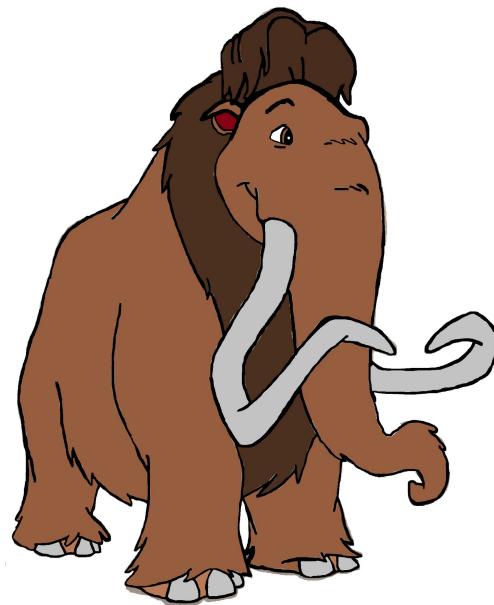
why not change the world?®







- Database access from the Web is Growing
 - Powerful KDD tools evolving
 - More powerful tools can consume more data
 - More powerful tools need more data
 - Open Data Movement gets started

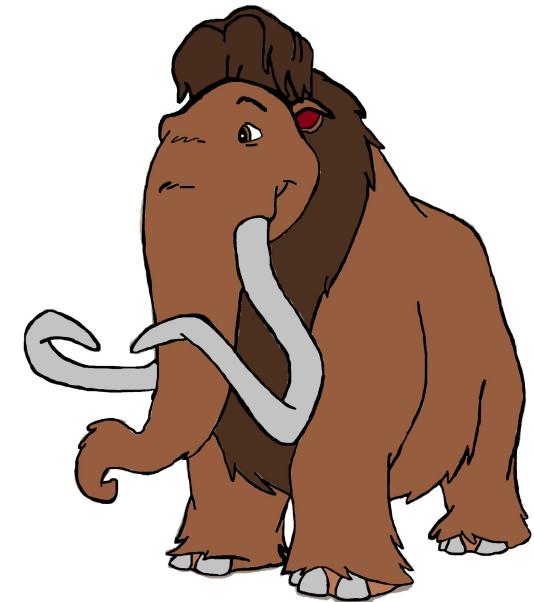
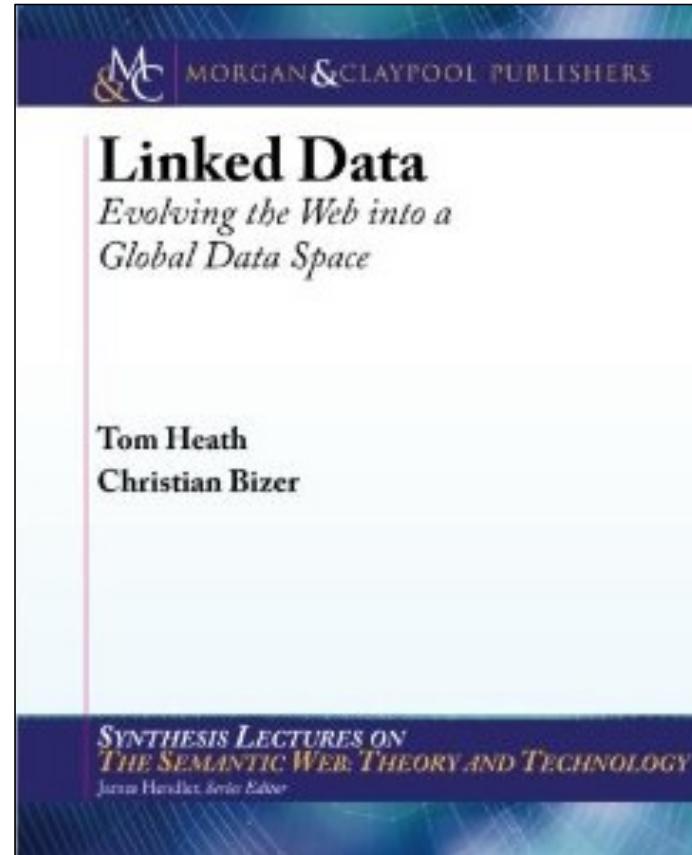
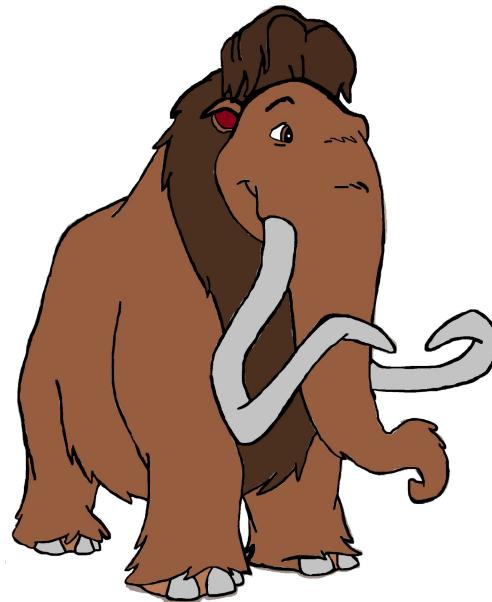


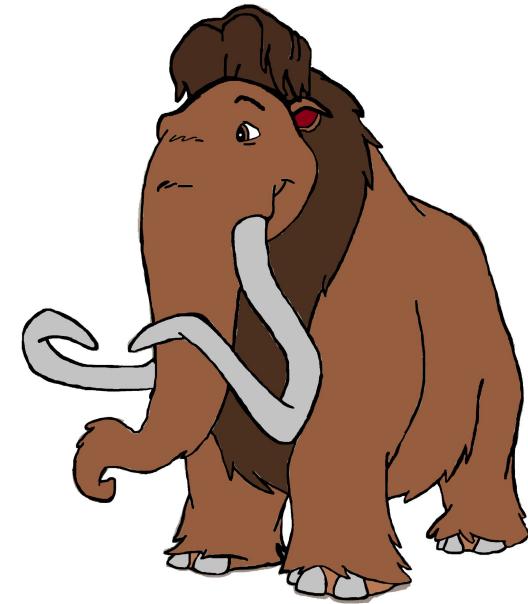
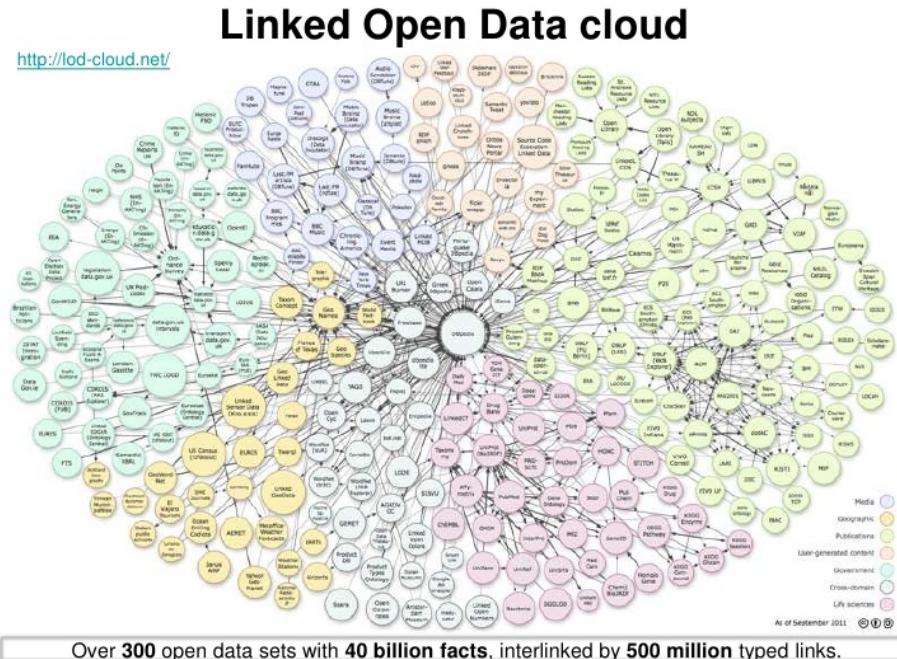
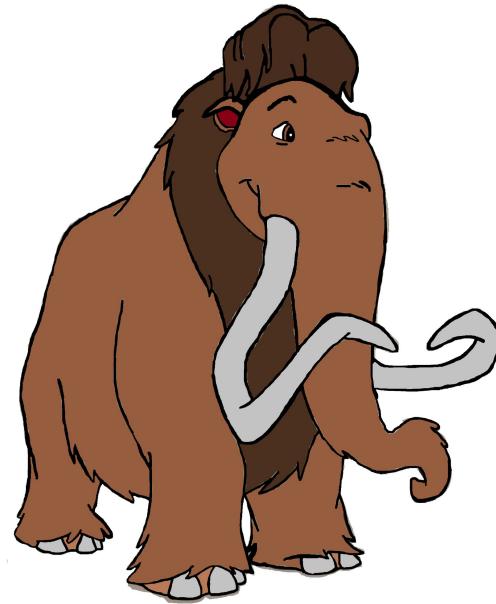


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Ancient History II (ca 2010)

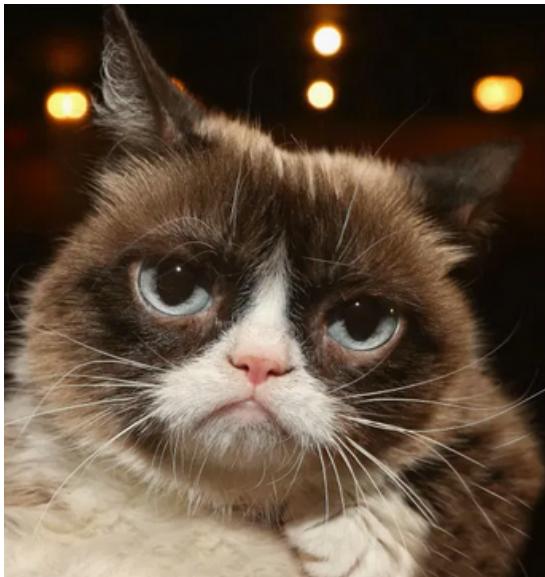
why not change the world?®





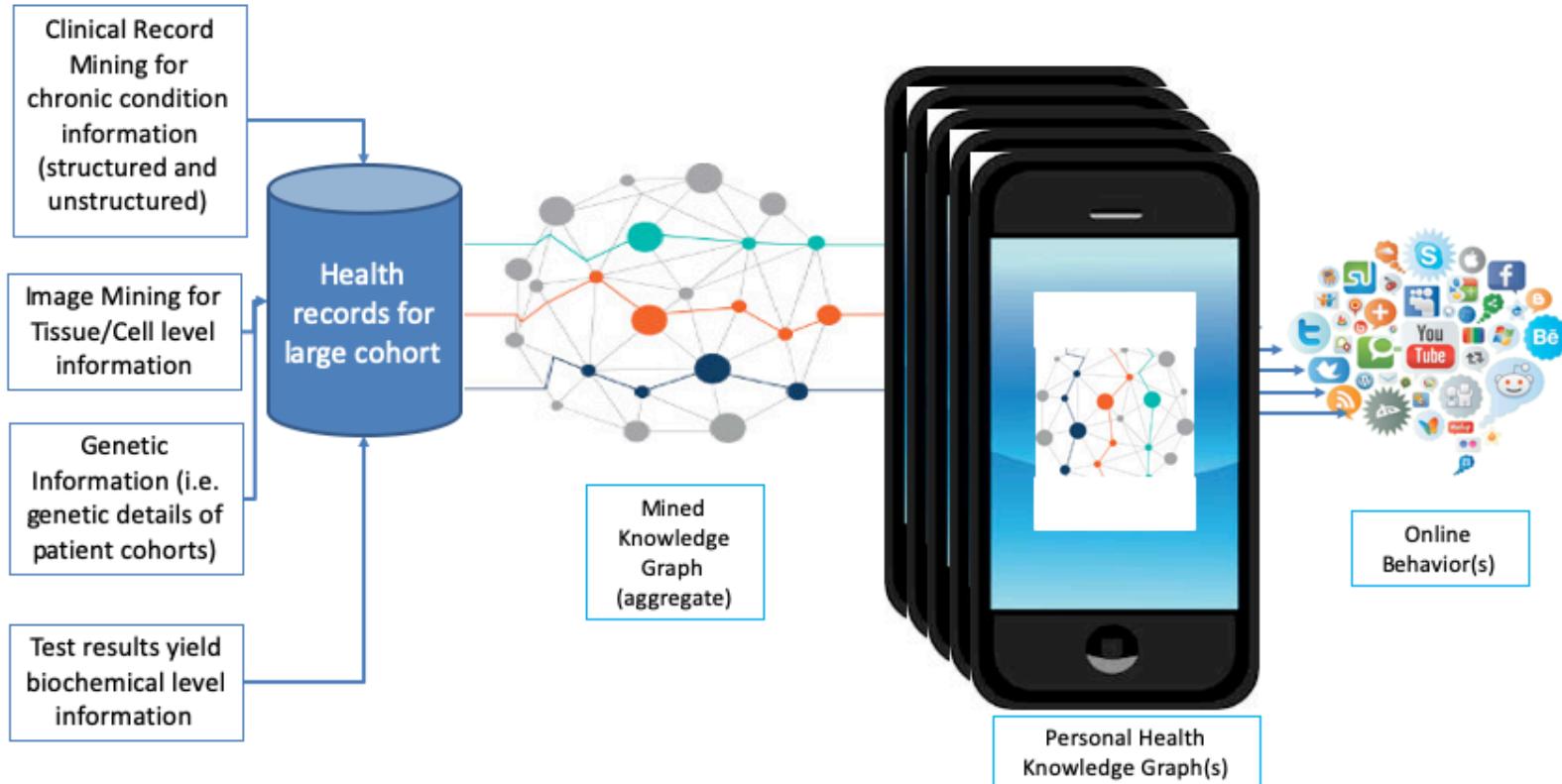


- Unstructured data use is increasing
 - Powerful KG tools evolving (esp as GNNs improve)
 - More powerful tools can consume larger KGs
 - KGs are growing within, but not between siloes
 - “open” KGs mainly powered by wikidata or other single systems





- Open, or interoperable knowledge graphs, could power new and innovative applications
 - General KGs interoperable with specialized KGs
 - For example, Health Knowledge Graphs
 - Specialized KGs merged with Business of Personal KGS
 - For example, Personal Health Knowledge Graphs



PHKG 2020: Workshop on The Personal Health Knowledge Graph

<https://suitclub.ischool.utexas.edu/PHKG2020/index.html>

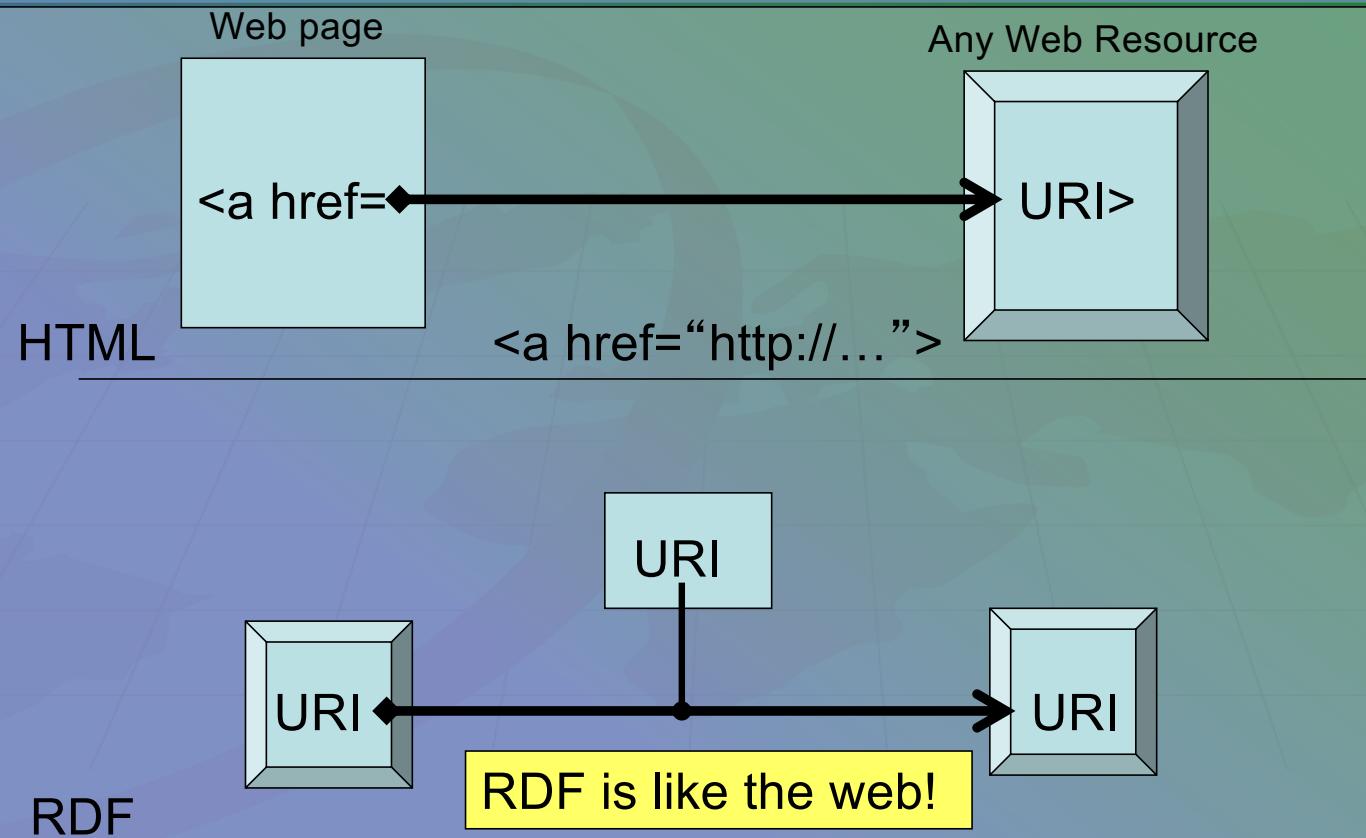


- Start from what already works (Don't reinvent):
 - Reuse some of the best parts of RDFS/OWL (or their equivalents)
 - URI-based name scheme (RDF or JSON-LD)
 - Heavily used vocabularies
 - Schema.org, Wikidata, DBpedia, YAGO, OGP, ...
 - Equality statements (owl:sameAs, skos:exactMatch)



On the Web -- links are critical!

Tetherless World Constellation





Links in the data

Tetherless World Constellation

DOC1

```
<mind:Person rdf:id="Hendler">
  <mind:title jobs:Professor>
  <jobs:placeOfWork http://www.cs.rpi.edu>
</mind:Person>
```

Mind:

Jobs:

DOC1

Hendler

Jobs: Professor

Mind:title

Jobs:placeOfWork

Web Page
http://www...



DOC2

```
<mind:Person rdf:id="Hundler">  
  owl:sameAs  
  <http://dbpedia.org/page/James_Hundler>
```

Dbpedia:Hundler

Dbpedia:ComputerScientist

Dbpedia:occupation

Owl:sameAs

Hundler

Jobs:Professor

Mind:title

Jobs:placeOfWork

Web Page
http://www...



Linking Web Resources

Tetherless World Constellation

indice "James Hendler"

<sameAs>

1. <http://southampton.rkbexplorer.com/id/person-0e287d169ba5234bf52a8c..840c1bf1cd>
2. <http://data.semanticweb.org/person/jim-handler>
3. <http://data.semanticweb.org/person/james-hendler>
4. <http://acm.rkbexplorer.com/id/person-140392-138bb61e61c7ac2750b8a8f91708cb7e>
5. <http://acm.rkbexplorer.com/id/person-140392-4f99f5c802da7ecb9b918188a9cd92e>
6. <http://acm.rkbexplorer.com/id/person-140392-85039bb5ec9c2d7ae4f7923683260c74>
7. <http://acm.rkbexplorer.com/id/person-140392-9ea8f3dfb4696b4032d090aea4eceff>
8. <http://dblp.rkbexplorer.com/id/people-0e287d169ba5234bf52a8c5d977aa...c7febb08558>
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24. <http://eprints.rkbexplorer.com/id/fupm/person-0e287d169ba5234bf52a..8982b45892>
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40. <http://eprints.ecs.soton.ac.uk/id/person/ext-b908909a811e5af11bf5735440b297e1>
41. http://kisti.rkbexplorer.com/id/PER_000000000000000066693
42. http://kisti.rkbexplorer.com/id/PER_000000000000000066695
43. <http://semanticweet.com/jahendler#me>
44. <http://www.cs.umd.edu/~hendler/2003/foaf.rdf#jhendler>

indice "http://dbpedia.org/resource/Macao"

<sameAs>

1. <http://dbpedia.org/resource/RAEM>
2. <http://dbpedia.org/resource/Aomen>
3. <http://dbpedia.org/resource/Aumen>

Show 86 more

90. <http://www4.wiwiiss.fu-berlin.de/factbook/resource/Macau>

rdf+xml · n3 · json · text

indice "http://dbpedia.org/ontology/SoccerPlayer"

<sameAs>

1. <http://dbpedia.org/resource/Fitba>
2. <http://dbpedia.org/resource/Futbol>
3. <http://dbpedia.org/resource/Soccer>

Show 123 more

127. http://www.w3.org/2006/03/wn/wn20/instances/synset-football_player-noun-1

rdf+xml · n3 · json · text



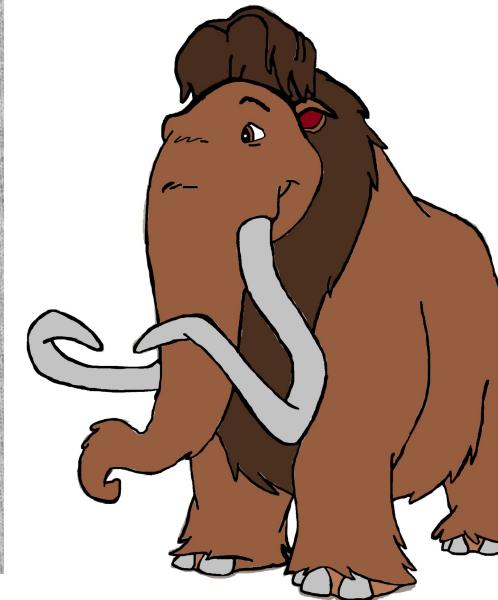
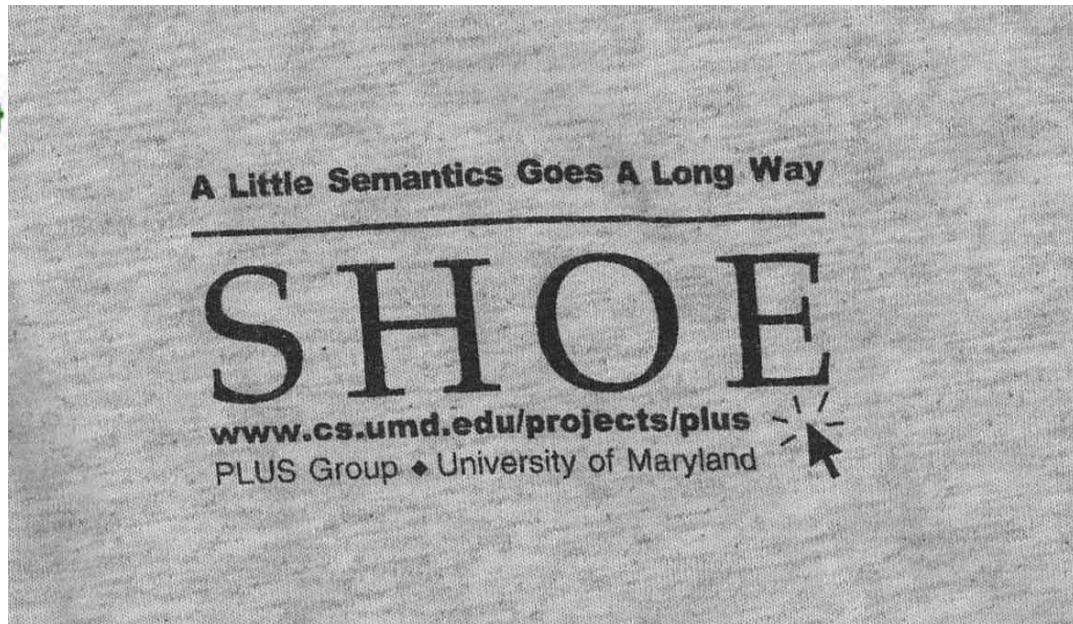
- Add some critical missing pieces
 - Procedural Attachment
 - Standardizing access from KG to data resources
 - Particularly KG to DB
 - Things needed in data interoperability
 - Part-Whole, Temporal model, Uncertainty, ...
 - More on this in <https://www.slideshare.net/jahandler/wither-owl>
 - » Pun on wither vs. whither is intentional
 - Privacy/Security controls
 - Access controls in particular
 - Links to heavily used Business & esp Business Intelligence tools
 - Monetize opening and sharing KG resources



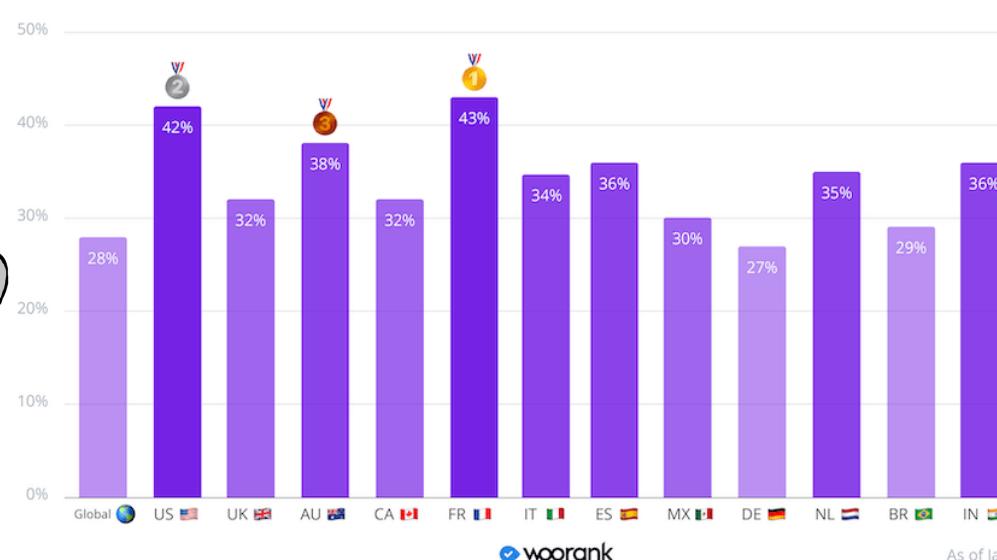
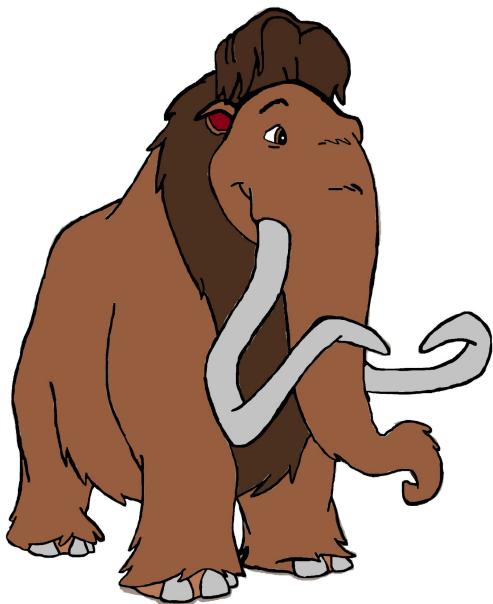
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Back to the Future

why not change the world?®



A little semantics goes a long way!



As of Jan. 16, 2020

**Schema.org, descendant of Semantic Web and Linked
Data is now on billions of web pages!**



- Let's OPEN the world of Knowledge graphs
 - Stress interoperability
 - Learn from the past
 - Avoid over standardization to particular use models
 - Reuse existing successful standards
 - Start from successful business models

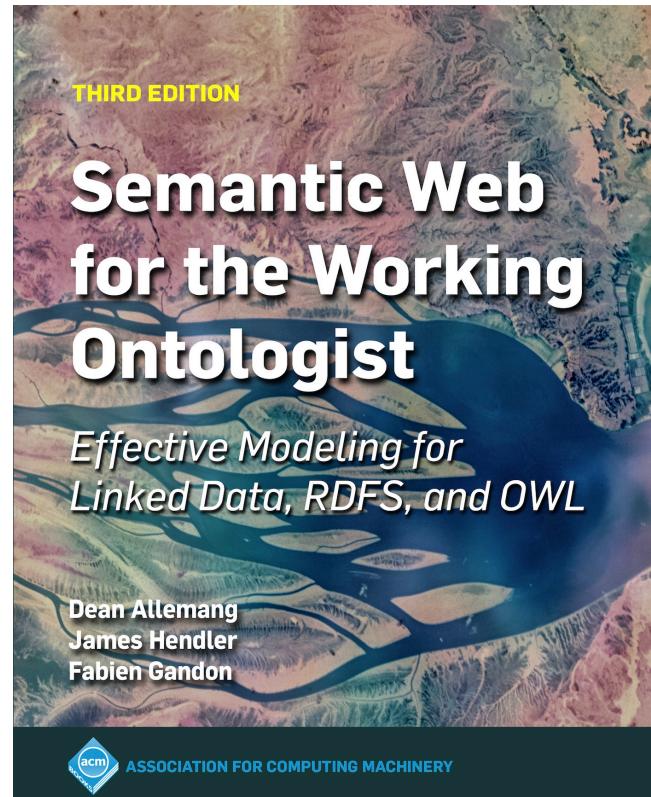




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Questions?

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3rd Edition includes:
Linked-Data Platform, Knowledge graphs, SHACL, schema.org, ...

IBM | Rensselaer
Rensselaer - IBM
AI Research Collaboration



 timbr.ai
The SQL Knowledge Graph Company™

KG/DB integration

 IDEA
Rensselaer Institute for Data Exploration and Applications