

# The Maturing Semantic Web: Lessons in Web-Scale Knowledge Representation

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#### The Web of Data

- A fully distributed web-based system to publish logical assertions
- A way to link to someone else's data, augment it, and add to it
- Democratic, crowd-based, scalable knowledge engineering
- The hottest area of Artificial Intelligence right now



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- RDF, RDFS, OWL (3 versions), OWL2
- Weaker than First Order Logic, more easily authorable, decidable, tractable in most cases using tableaux provers



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Also the messiest formal knowledge base on Earth



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# The largest formal knowledge base on Earth

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# A <u>revolution</u> in the way we think of data, crowds, and schemas

- Massive, partial, participatory, logically weak, dynamic, schema-last
- A way to democratize and scale knowledge bases and knowledge systems
- A route to impact for AI technologies



# **Talk Outline: The Maturing Semantic Web**

# The Origins of the Semantic Web

- DARPA's DAML Program
- RDF, OWL, and the Semweb Infrastructure

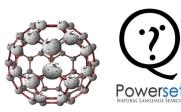
### Semantic Web Evolution to 2009

- Three Generations of Semantic Dreams
- Markets and Companies

### The Fourth Generation

A Scalable Revolution











# Talk Outline: The Maturing Semantic Web



# The Origins of the Semantic Web

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- Three Generations of Semantic Dreams
- Markets and Companies



A Scalable Revolution











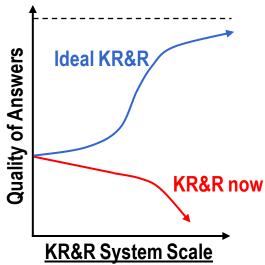
# At the End of the 90s: Traditional KR and the Google Property

- We seek KR systems that have the "Google Property:" they get (much) better as they get bigger
  - Google PageRank™ yields better relevance judgments as it indexes more pages
  - 1990's KR&R systems have the antithesis of this property

# So what are the components of a scalable KR&R system?

- Distributed, robust, reliable infrastructure
- Multiple linked ontologies and points of view
  - Single ontologies are feasible only at the program/agency level
  - Multiple authors and overlapping data sources
  - Private and public knowledge
- Mixture of deep and shallow knowledge
- Tractable reasoning algorithms
- Tolerant KB you are typically doing open-world reasoning (no NAF), things go away, contradiction is present, data is incomplete and dirty, computing must be resource-aware, surveying the KB is not possible
- (Relatively) easy for non-KE's to author, validate, and maintain





(Number of Assertions
Number of Ontologies/POVs
Number of Rules
Linkages to other KBs
Reasoning Engine Types ...)



## The Roots of the Semantic Web

# Semantic technology has been a distinct research field for decades

- Symbolic Logic (from Russell and Frege)
- Knowledge Representation Systems in Al
  - Semantic Networks (Bill Woods, 1975)
  - DARPA and European Commission programs in information integration
  - Development of simple tractable "description logics" for classification
  - Conceptual Graphs and this community
- Relational Algebras and Schemas in Database Systems

## Library Science (classifications, thesauri, taxonomies)

#### What's new was the Web!

- The material needed to answer almost any question is somewhere on the web
- A massive infrastructure of data servers, protocols, authentication systems, presentation languages, and thin clients that can be leveraged
- A way around needing the "big data warehouse"



# The Beginnings of the US Semantic Web: DARPA's DAML Program

#### **Problem:**

Computers cannot process most of the information stored on web pages

#### **Solution:**

Augment the web to link machine-readable knowledge to web pages

Extend RDF with Description Logic

Extensibility via frame-based language design

Create the first fully distributed web-scale knowledge base out of networks of hyperlinked facts and data

#### Approach:

Design a family of new web languages

Basic knowledge representation (OWL) Reasoning (SWRL, OWL/P, OWL/T)

Process representation (OWL/S)

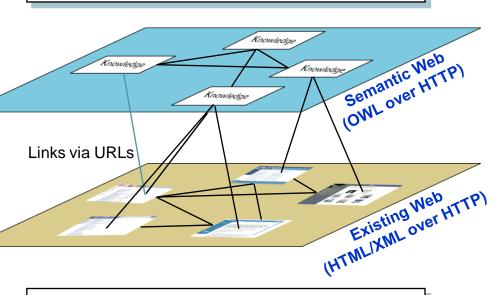
**Build definition and markup tools** 

Link new knowledge to existing web page elements

Test design approach with operational pilots in US Government

Partner with parallel EU efforts to standardize the new web languages

Computers require explicit knowledge to reason with web pages

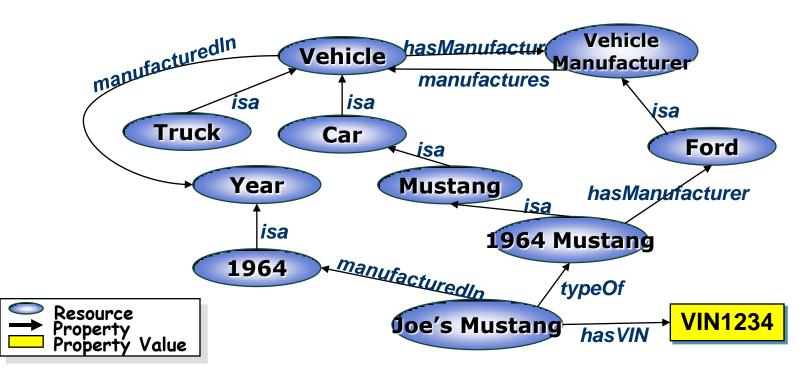


People use implicit knowledge to reason with web pages



### What is RDF?

- Defines the terms used to describe and represent an area of knowledge, using web-friendly technologies
  - Specified by triples (resource, property, resource) or (resource, property, value)
  - Precise enough to be interpreted by machines
  - Enables reuse of domain knowledge; makes domain assumptions explicit



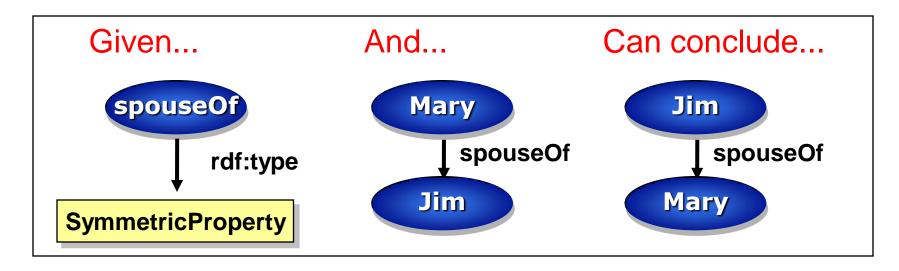


### What Does OWL Add?

### More Semantic Expressiveness

- Relations between classes
  - Equiv. Class (e.g., US\_President and PrincipalResidentofWhiteHouse)
  - Disjoint Class (e.g., Male and Female)
- Complex Classes (intersectionOf, unionOf, complementOf)
- Property characteristics (inverseOf, transitive, symmetric, etc.)
- Cardinality constraints (e.g., birthMother has exactly one value)

### Ability to combine facts and make inferences

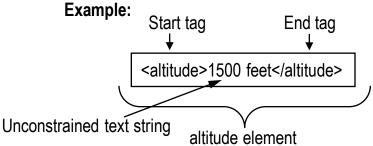


### From XML to OWL

#### **Increasingly Expressive Options for Web Data Markup**

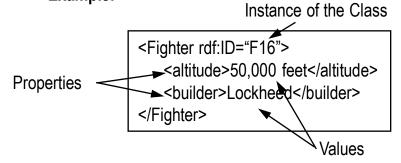
#### **XML**

**Issue addressed:** how to express data in text? **XML Solution:** "wrap" data within start tag/end tags, and empower users to create their own tags



#### RDF and RDF Schema

**Issue addressed:** how can data support statements? **RDF Solution:** use a *subject, property, object* pattern **Example:** 



#### XML Schema (XMLS)

**Issue addressed:** how should the type structure of the data be expressed?

**XML Schema Solution:** XML templates **Example:** 

<element name="altitude" type="integer"/>

altitude is constrained to be an integer

#### **OWL**

Issue addressed: how to express data semantics?

OWL Solution: use inheritance and a description logic to express restrictions and describe entailment Example:

```
<owl:Class rdf:ID="Fighter">
     <rdfs:subClassOf rdf:resource="#Aircraft"/>
     </owl:Class>
```

Fighter class: a Fighter inherits properties type of Aircraft



# **DAML Program Elements**

#### Web Ontology Language (OWL) (2/10/04)

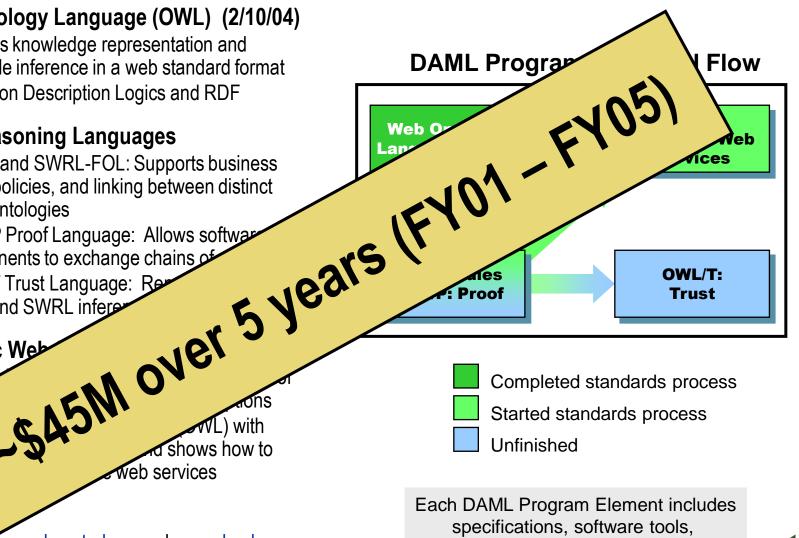
- Enables knowledge representation and tractable inference in a web standard format
- Based on Description Logics and RDF

#### **OWL Reasoning Languages**

- SWRL and SWRL-FOL: Supports business rules, policies, and linking between distinct OWL ontologies
  - OWL/P Proof Language: Allows software components to exchange chains of
  - OWL/T Trust Language: Re OWL and SWRL infered

#### Semantic Wel

- Allows web services
- **OWL**
- www.semwebcentral.org and www.daml.org

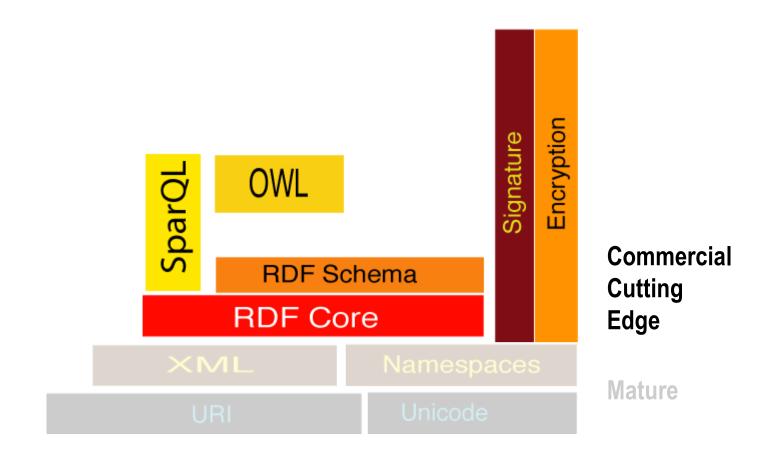


coordination teams, and use cases

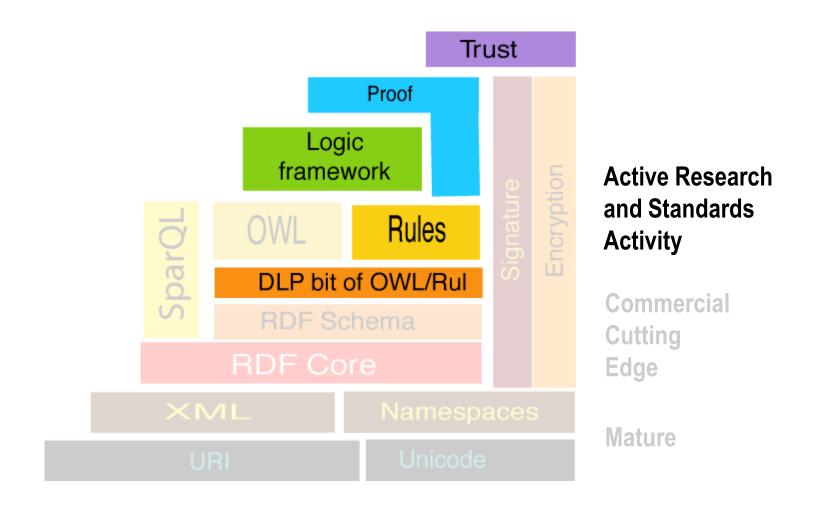
**VULCAN** 



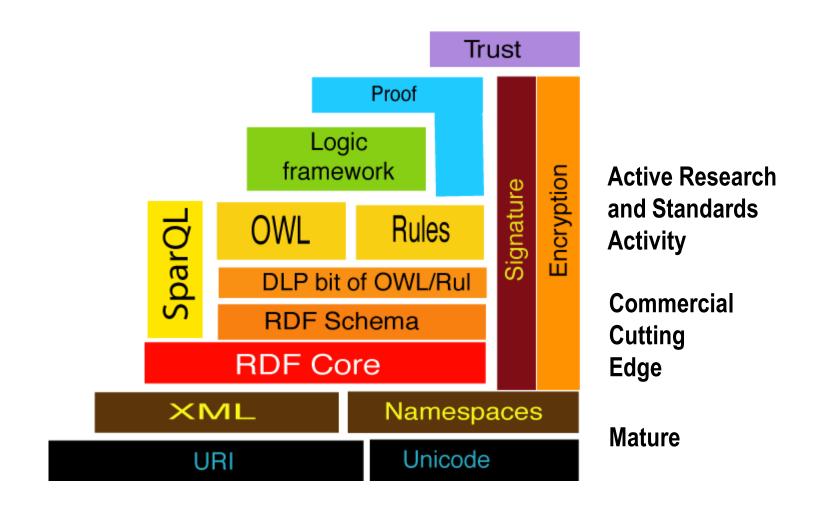






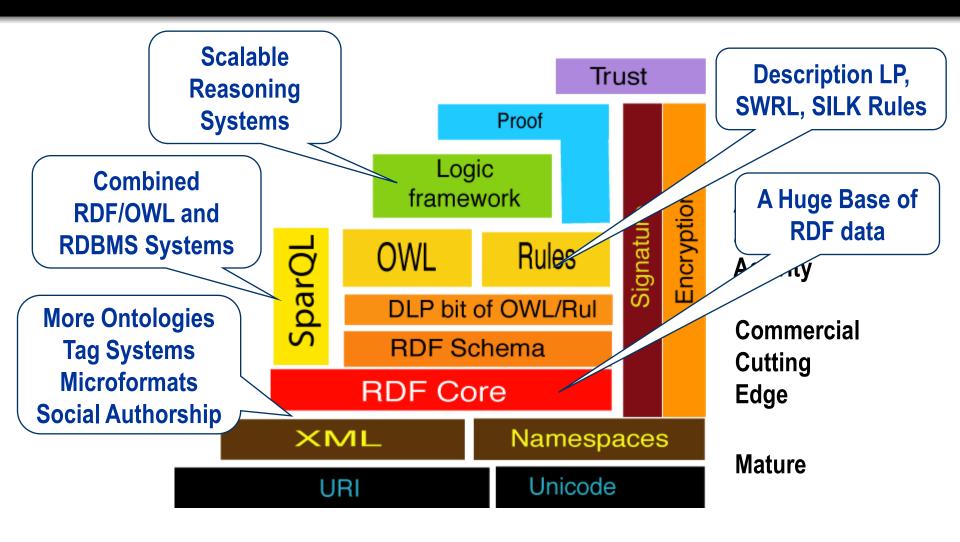








# **Completing the Semantic Web Picture**



Other Technologies Impact the Semantic Web



# Beyond RDF and OWL: 2009 Semantic Web Infrastructure

#### **Server Infrastructure**

#### Markup Languages

- HTML-friendly markup dialects: Microformats and RDFa
- OWL 2 is a Candidate Recommendation

#### Triplestores and SPARQL Servers

- Stores for 1B triples now available, though with caveats around write performance
- Commercial: AllegroGraph, Virtuoso, BigOWLIM, Oracle 11g Semantic Technologies...
- Open Source: 4Store, Sesame, Redland...
- Next step is parallel web delivery architectures

#### Entity Name Service (Okkam, DBpedia)

#### Semantic Web Reasoners

- Commercial: Oracle 11g RDFS/OWL engine, Ontobroker, Ontotext, RacerPro
- Open Source: Pellet, FaCT++...
- RIF is at W3C Last Call status

### **User-layer Tools**

#### Vocabularies and Design Tools

- Ontologies: Dublin Core, FOAF, SIOC...
- OpenSource: Protégé, SWOOP...
- Commercial: TopBraid Composer, Knoodl

#### Semweb Data Generation

- RDF / RDBMS front-ends
- NLP parsers into OWL
- Zemanta-type blogger's assitants
- Semantic wikis

#### Semweb Data Exploitation

- Semweb search engines (Sindice, Watson, Falcon...)
- Yahoo SearchMonkey / Google Rich Snippets
- Browser extensions and facets

#### Visualization Tools

- Simile Project (<a href="http://simile.mit.edu/">http://simile.mit.edu/</a>)
- Several Commercial Companies



# State of Semantic Web Work in the US

### DAML finished in 2005, with no followors

- NIH (Protégé, NCBO), NSF, some small DoD funding
- PAL/CALO funded broader semantic/Al work

### But... leading-edge Venture Capital moved in

Vulcan, Crosslink, In-Q-Tel, Benchmark, Intel Capital...

# An emerging commercialization ecosystem

- Startup/Small: Radar, Metaweb, Evri, AdaptiveBlue...
- Midsized: Metatomix, Dow Jones, Reuters/OpenCalais, Franz...
- Large: Yahoo!, Google, Oracle, IBM, HP, Microsoft...
- Semantic web meetup groups in Silicon Valley, Boston, Seattle...

# Emphasis is mostly Semantic dimension of Semantic Web

- That was where the money was
- RDBMS scale and orientation, powerful analytics for Business Intelligence
- Centralized workflows for ontology definition and management
- Use cases surrounding corporate data integration and document markup









# Semantic Web Work in the EU

### Continuing Large Public-Sector Investments

- Framework 6 (2002-6) More than €100M in several different programs
- Framework 7 (2007-13) ~€1B/year for information and communications technologies
  - · Semantics is more present as a general systems technology
  - Future Internet and Digital Libraries thrusts

#### Two Dedicated Multi-site R&D Institutes

- DERI: 100+ people and the world leader in research
- Semantic Technology Institute International
- A strong and growing cadre of graduate students









### Emphasis on the Social and Web Dimensions of the Semantic Web

- Web-scale Linked Data, social networks, simple scalable imperfect inference
- Ontology and data dynamics, imperfections, versioning
- Semantically-boosted collaboration with limited knowledge engineer involvement

Clear R&D leadership but lags in commercialization



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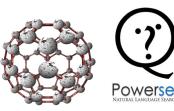
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A Scalable Revolution











# **Evolving Conceptions for the Semantic Web**

### **Initial Semantic Web Conception\***

- Semantic markup would be tightly associated with individual web pages
  - "Translate the Web for machines"
  - RDFa shows this is still a powerful vision
- Core problem is labeling free-text web pages with a (pre-defined) ontology markup vocabulary
  - Entity extraction and other lightweight NLP
  - Document segmentation technologies
  - Manual annotation
- Need an all-encompassing ontology or set of logically compatible ontologies
- Small number of knowledge engineers do semantic annotation because the modeling problems are so hard
  - Knowledge engineers rarely get markup right because they aren't domain experts

#### The Semantic Web in 2009

- The Web is a publishing platform for formal knowledge as well as pages
  - Semantic data doesn't have to be associated with HTML web text (just a URI)
  - Huge numbers of knowledge publishers
  - Simple RDF and owl:sameAs links
- Core problem is maintaining a set of evolving and partial agreements on semantic models and labels
  - Consensus is a human social problem
  - There will be massive numbers of overlapping ontologies and class hierarchies, and lots of bad data
  - Hard problem is cost-effectively maintaining semantic models and labeling data
- Supplemental semantics is carried in the free-text web



<sup>\*</sup> By most people but not Tim Berners-Lee

# **First Generation Semantic Web Applications**

# **Semantically-Boosted Search and Classification**

#### A really old problem type

- Semantics as the keystone technology for unstructured Information Retrieval
- Requires powerful NLP and document interpretation systems
  - Often also requires powerful semantic representations (e.g., events or causality)
  - Can use semantic web KR but usually augments it

#### Market Segments and Players

- Enterprise Document Management (EDM) and search systems
- Email autoclassifiers and inbox managers
- Web question answering: Hakia, Powerset, TrueKnowledge, Cycorp (inCyc)...
- Semantics for Search Result Enhancement: Yahoo! SearchMonkey

### Some lessons with applying semantic web technology in this space

- Still waiting for a compelling match between technical capability and business need
  - Statistical methods are surprisingly good for basic relevance scoring (e.g., Latent Semantic Indexing, PageRank)
  - Verticals (esp. pharma) have seen some success
- Semantic processing is only a small differentiator in these markets you have to be great at nonsemantic queries, data import, crawling, storage, performance...



# First Generation Examples: Powerset and Yahoo! SearchMonkey

### Powerset: Natural language consumer search

- Web crawling, keyword indexing, relevance ranking
- High performance for web-scale commercialization
- Parsing of web page text with Xerox PARC's XLE system
- Question answering with Wikipedia text and Freebase
  - Questions like "What did Microsoft acquire in 2006?" or "What did Steve Jobs say about the iPod?"
  - No standard corpora to evaluate performance
- Acquired by Microsoft in June 2008
- Powerset's semantic knowledge is a superset of semantic web KR



- GreaseMonkey-style web reformatting for search
- Yahoo's crawler indexes and interprets RDFa, microformats, delicious data, etc.
- Display URL as an enhanced result, with standard or custom presentations
- Incentives: "Structured data is the new SEO" (Dries Buytaert, Drupal)



Alex Moskalyuk on Facebook
Add friend | Poke | Send message | View friends

Alex Moskalyuk is on Facebook. Not the Alex Moskalyuk you were looking for? Visit Facebook to search for friends, family, coworkers. www.facebook.com/people/Alex-Moskalyuk/500013218 - Cached







# Second Generation Semantic Web Applications

# **Strategic Enterprise Information Technology**

#### An only slightly newer problem type

- Business exploitation of structured enterprise data (RDBMS, Spreadsheet, ERP data)
  - · Backwards to Data Management to reduce cost of managing, migrating, integrating
  - Forwards to Business Process Management
- Support for unified query, analytics, and application access
  - Includes SOA integration, Enterprise Application Integration

#### Markets Segments and Players

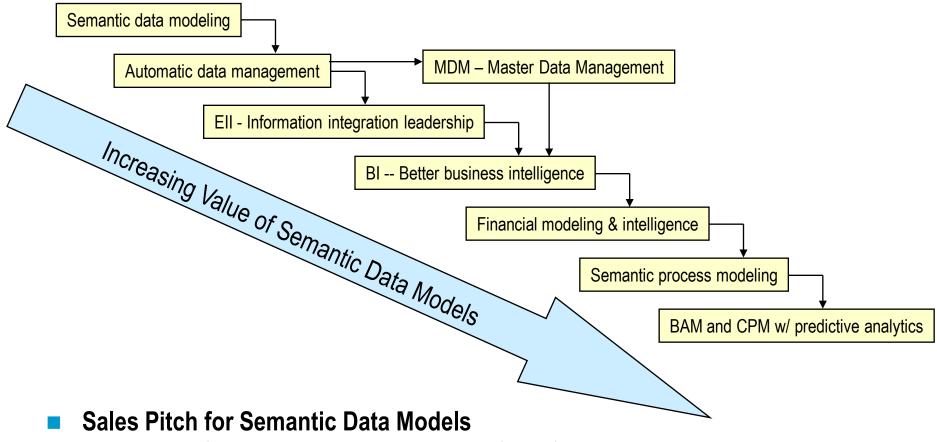
- Gartner estimates that EII software and services alone is \$14B/year, with 40% growth over 5 years (pre-recession numbers, though)
- Very complex market space includes EAI, Entity Analytics, MDM, BI, BPM, CPM...
- Huge entrenched players (IBM, SAP, Oracle...) and major consulting shops

#### Some lessons with applying semantic web technology in this space

- Fundamental problem is understanding the semantics from legacy systems, not in KR
- Pure Semantic technology companies tend to be unsophisticated about the customer
- RDF/OWL is typically too weak and must be augmented by rules, quantities, etc.
- Raw performance is typically inferior to a well-designed RDBMS
- Tends to be an IT sale (not Line-of-Business sale), with attendant cost pressures



# Semantic Technology in Enterprise Strategic IT



- Promote <u>flexibility</u> and <u>improvisation</u> in the face of dynamism
- Expose business processes as rules, for governance and compliance
- Can be driven all the way through the architecture, from SOA to CPM dashboards
- This vision has never been proven at scale outside the lab



# Second Generation Non-SemWeb Example: Wolfram Alpha



#### Alpha is a computational engine, not a search engine

- Ultra-calculator (Mathematica) combined with a massive almanac
- Example: "Height of Mt. Everest divided by age of youngest US President"
- Similar to Google's special computations, but much more powerful
- Displays the solution results using templates from Mathematica's visualization tools

#### Alpha includes 100s of manually integrated and curated data sources

- Topic coverage includes products, people, science, cooking, weather, travel, business, geography, music, chemistry, astronomy, physics, etc.
- Builds on the labor of >100 people over two years, who in turn built on 20 years of Mathematica
- NLP-driven front end with a "query-like" syntax

# Alpha's strength is representing mathematical relations between "factual" entities found in databases

These semantics are extremely deep and go beyond what is expressible in OWL



# Third Generation Semantic Web Applications

### Web 2.0 and the Socio-Semantic Web

#### A new problem type

- "Semantic Web should allow people to have a better online experience" Alex Iskold, AdaptiveBlue
- Enhance the human activities of content creation, publishing, linking my data to other data, socializing, forming community, purchasing satisfying things, browsing, etc.
- Improve the effectiveness of advertising



#### Market Segments and Players

- Mashup systems and consumer-oriented semantic web services (Drupal, Ning, ...)
- Semantic enhancements to blogs and wikis (Zemanta, Faviki, Ontoprise, Radar, ...)
- Semantics for Social Networking (MySpace RDF service and microformats, Facebook RDF models, etc.)

#### Some lessons with applying semantic web technology in this space

- If we don't have semantic convergence, then semantics isn't a differentiator
- No one really knows the design principles that allow some Web 2.0 sites to be successful and others to never get traction



# Third Generation Example: Semantic Wikis

- Wikis are tools for Publication and Consensus
- MediaWiki (software for Wikipedia, Wikimedia, Wikibooks, etc.)
  - Most successful Wiki software
    - High performance: 10K pages/sec served, scalability demonstrated
    - LAMP web server architecture, GPL license
  - Publication: simple distributed authoring model
    - Wikipedia: >2.9M English articles, 400K Russian, >2.5M images, #8 Alexa traffic rank
  - Consensus achieved by global editing and rollback
    - · Fixpoint hypothesis, although consensus is not static
    - Gardener/admin role for contentious cases
- Semantic Wikis apply the wiki idea to structured (typically RDFS) information
  - Authoring includes instances, data types, vocabularies, classes
  - Natural language text used for explanations
  - Automatic list generation from structured data, basic analytics, database imports
  - Reuse of wiki knowledge
  - See e.g., <a href="http://smwforum.ontoprise.com">http://smwforum.ontoprise.com</a> for one powerful semantic wiki

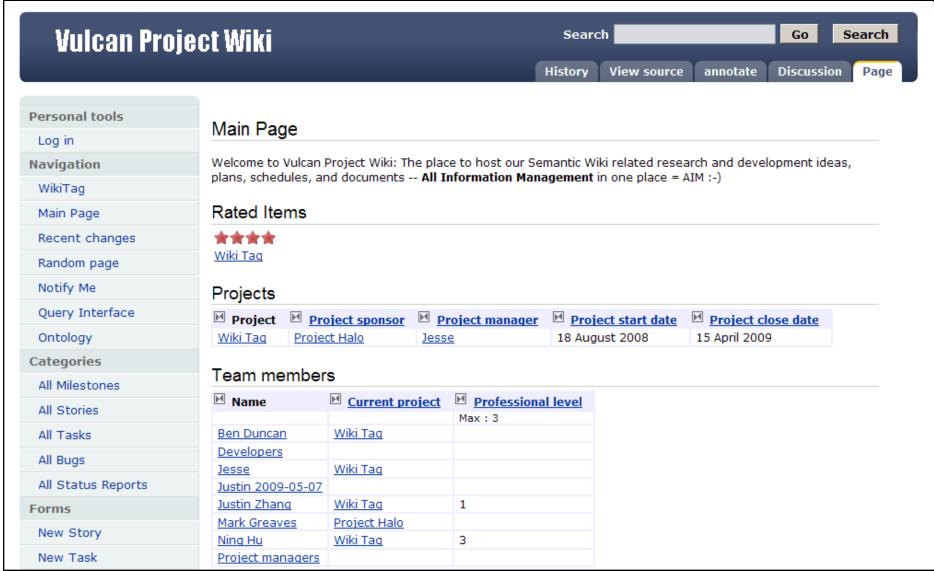
#### **Semantic Wiki Hypotheses:**

(1) Significant interesting Semantic Data can be collected cheaply

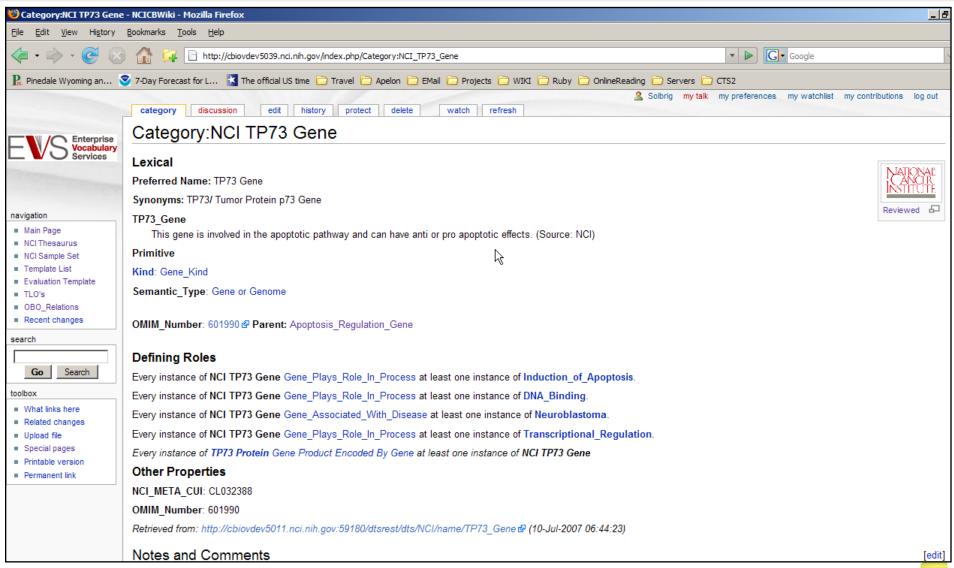
2) Wiki mechanisms can be used to maintain consensus on vocabularies and classes



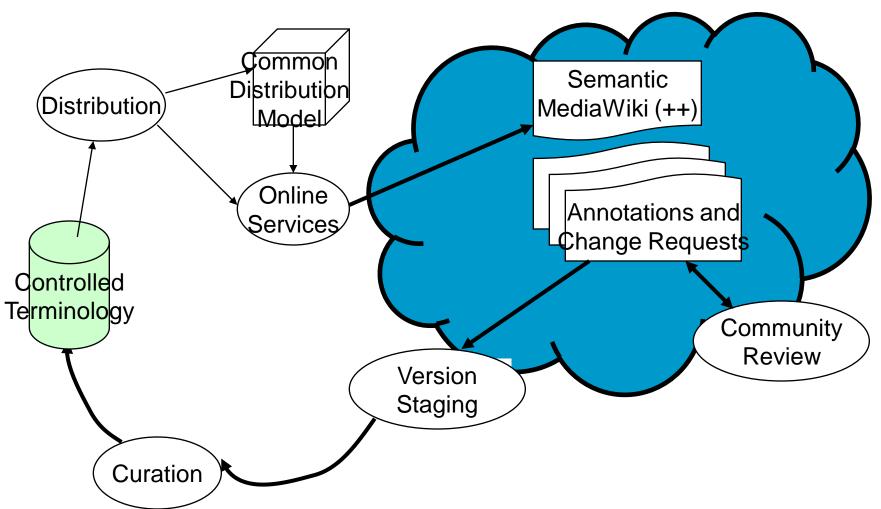
# An Example of Semantic MediaWiki



### **National Institutes for Health Cancer Thesaurus**



# **Real Workflows for Terminology Management**



# Example: Healthcare Vocabulary Management (HL7)



- Large-scale terminology management at <u>www.biomedgt.org</u>.
- Semantic MediaWiki+ blends a database and a wiki



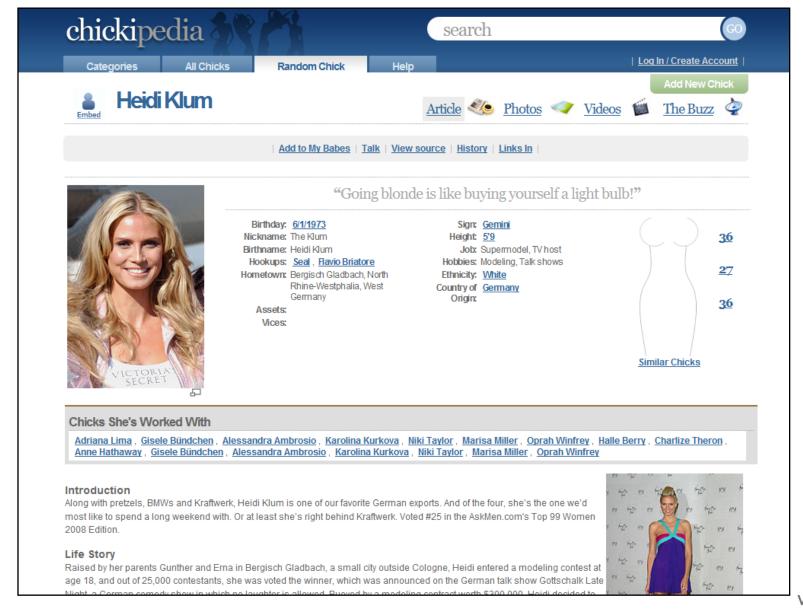
# Semantic Data in HL7 (www.BioMedGT.org)

```
RDF feed at
BGT Disease Has Associated Anatomic BGT Integumentary System(B13080) + Q
                          Site(R100)
       BGT Disease Has Finding(R108) BGT Cutaneous Involvement(B39743) + Q
    BGT Disease Has Primary Anatomic BGT Skin(B12643) + Q
                          Site(R101)
             BGT NCI META CUI(P208) CL108247 + Q 👩
            BGT Semantic Type(P106) Disease or Syndrome + Q 🕝
                 BGT Synonym(P104) Becker's Nevus + Q, Linear Papular Ectodermal-Mesodermal Hamartoma + Q, Pigmented Hairy Nevus of Becker + Q,
                                     Progressive Cribriform and Zosteriform Hyperpigmentation + Q, Pigmented Hairy Epidermal Nevus + Q, and Melanosis
                                     Neviformis + Q
      DCTerms hasVersion(hasVersion) BGT/Versions/01.01 + Q
                     Has default form LexWiki BGT Form + Q
                LexWiki Concept Code B4097 + Q
              LexWiki Preferred Name Becker's Nevus + Q
                        LexWiki URI urn:oid:2.16.840.1.113883.3.26.1.2:B4097 + Q
           SKOS inScheme(inScheme) BGT + Q
This category currently contains no articles or media.
Categories: BGT Hamartoma(B3248) | BGT Non Neoplastic Nevus(B4110)
```

- Subject-matter experts give simple, authorable statements
- Adds Protégé-managed rules for terminological coherence

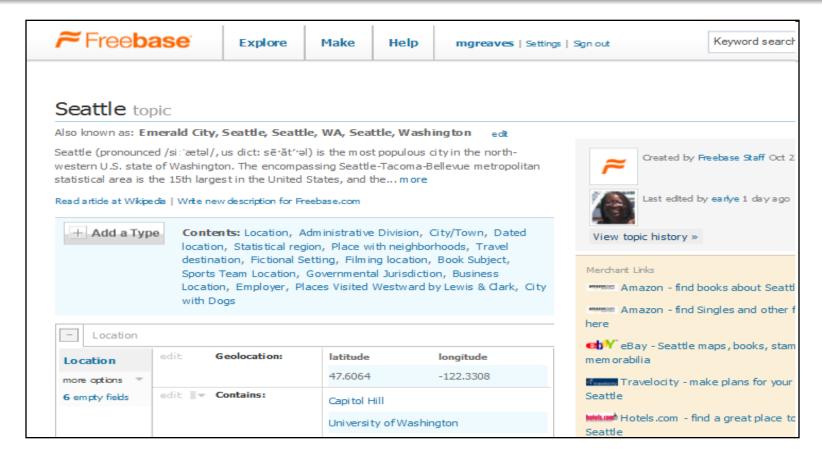


# Commercial Semantic Wikis: Chickipedia



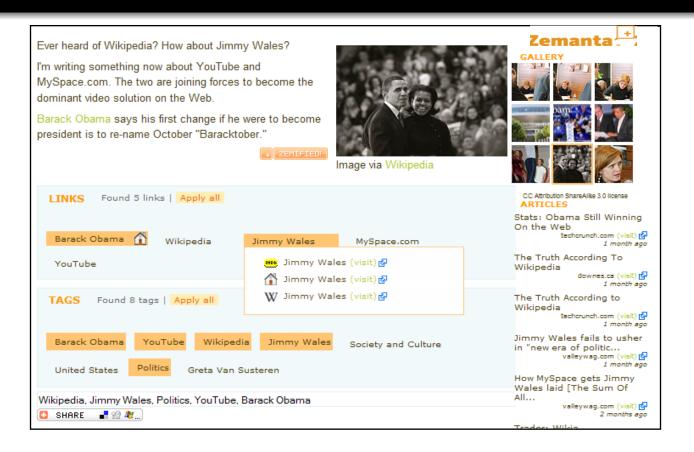


# Web Knowledge Bases: Metaweb and Freebase



- Massive amounts of almanac-style RDF data (Creative Commons license) that is readily available from partners
- Social authoring tools and wiki-style consensus combined with controlled reconciliation by Metaweb personnel
- Data outsourcing model for long-tail startups

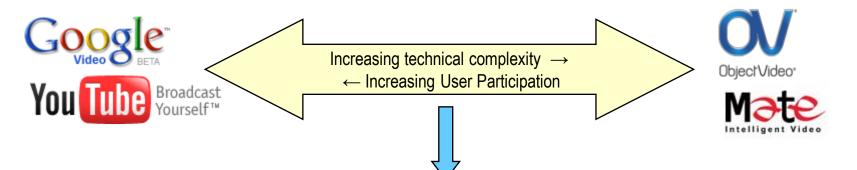
# Semantic Blogger Support: Zemanta



- Automatic link, image, keyword, tag suggestions for bloggers (and email)
  - Average semi-professional blogger spends ~20 mins adding "decorative" content
- Accuracy is guaranteed because users explicitly add the suggestions
  - Zemanta inserts RDFa and standard semantic markup in the background
  - Includes user specified friends/feeds/photos/etc as well as standard ones



## Semantic Video Wikis: US Football Video



- Social tag-based characterization
- Keyword search over tag data
- Inconsistent semantics
- Easy to engineer

## Semantic Entertainment (SMW 1.3)

- Social database-style characterization
- Category/Property+ wiki text query
- Semantic consistency via wiki mechanisms
- Easy to engineer

- Algorithm-based object characterization
- Database-style search
- Consistent semantics
- Extremely difficult to engineer







navigation

create a new play

views

toolbox

Log in / create account search

Ga Search

browse

Seahawks Games

⊕ SEA-GB

⊕ 

☐ SEA-STL

⊕ 
☐ 49ers-SEA

All plays for all games

#### Main Page

#### Welcome to Semantic Football

This is a sandbox site for putting semantic markup information on football video clps.

This site is currently restricted to authorized users only. Please contact related personnels to obtain a user account if you don't have one yet

#### Queries to demonstrate semantics

#### Contents [hide]

- 1 Welcome to Semantic Football
- 2 Queries to demonstrate semantics
  - 2.1 Some Interesting Queries
  - 2.2 Wikipedia NFL/Seahawks Player Data Import
- 3 All Seahawks Players
- 4 All Plays in Seahawks Games

#### Some Interesting Queries

A list of Interesting Queries that we can do now or make it happen easily with some extra work.

#### Wikipedia NFL/Seahawks Player Data Import

We can import player's data (birthdate, college, team, etc.) from Wikipedia/DbPedia or Freebase, so that contents available from external sources does NOT need be recreated again, and we can even sync with the external data in some way.

#### All Seahawks Players

#### All Plays in Seahawks Games

Currently, there are 639 plays in the Wik

where

- total of 152 plays for Seattle vs Green Bay game
- total of 160 plays for Seattle vs St. Louis game
- total of 163 plays for San Francisco vs Seattle game
- · total of 162 plays for Seattle vs Philadelphia game

# **Talk Outline: The Maturing Semantic Web**

## The Origins of the Semantic Web

- DARPA's DAML Program
- RDF, OWL, and the Semweb Infrastructure

## Semantic Web Evolution to 2009

- Three Generations of Semantic Dreams
- Markets and Companies



A Scalable Revolution















## **Fourth Generation Semantic Web**

## The Web of Data meets the Future Internet

#### A problem of scale

- The number of Internet devices is starting to explode (again!)
  - Mobile devices, embedded systems, and sensors
  - In 2008, Google reported 1 trillion unique URLs, ~200M web sites
  - Total 2008 web page estimates are ~30 billion (significant variation in these estimates)
- Gartner (May 2007, Report G00148725)
  - "By 2012, 70% of public Web pages will have some level of semantic markup, 20% will use more extensive Semantic Web-based ontologies"
- Can Semantic Web technologies work at web scales?
  - Sindice (<u>www.sindice.com</u>) is now indexing >10B triples/microformats over 100M pages
  - 20% of 30 billion pages @ 1000 triples per page = 6 trillion triples
  - 30 billion and 1000 are underestimates.

Material from Frank van Harmelen, Vrije Universiteit, Amsterdam

## Some lessons with applying semantic web technology in this space

- Does the Semantic Web have the Google Property?
- Can we exploit billions of triples, microformats, ontologies, rules, and services?
  - Are Semantic Web systems deployable on parallel web architectures, friendly to out-of-core algorithms, and compatible with giant databases?
- Is there a scaling limit to useful, profitable Semantic Web implementations?

## Fourth Generation Example: DBpedia

### Mine Wikipedia for assertions

- Mainly from Wikipedia Factboxes
  - ~23M triples
- Category assertions

#### DBpedia 3.2 dataset (Oct 08 Wikipedia)

- ~2.6M things, ~274M triples
  - 213K persons, 328K places, 57K music albums, 36K films, 609K links to images, 3.2M links to relevant external web pages, 4.9M links into RDF datasets
- Classifications via Wikipedia categories, YAGO, and WordNet synsets
- One of the largest broad knowledge bases in the world
- V.3.3 released July 3 (May 09 Wikipedia)

#### Simple queries over extracted data

- "Things near the Eiffel Tower"
- "The official websites of companies with more than 50000 employees"
- "Soccer players from team with stadium with >40000 seats, who were born in a country with more than 10M inhabitants"

```
Innsbruck
{{Infobox Town AT
  name = Innsbruck
  image_coa = InnsbruckWappen.png |
  image_map = Karte-tirol-I.png |
  state = [[Tyrol]] |
  regbzk = [[Statutory city]] |
  population = 117,342 |
  population_as_of = 2006 |
  pop_dens = 1,119 |
                                                               Tyrol
  area = 104.91 |
                                                               Statutory city
                                               Administrative region
  elevation = 574
                                               Population
                                                               117,342 (2006)
  lat_deg = 47
  lat_min = 16
  lat_hem = N |
                                                               1,119 /km²
                                               Population density
  lon_deg = 11
                                                               574 m
  lon min = 23 |
  lon_hem = E \mid
                                                               47°16' N 11°23' E ₫
                                               Coordinates
  postal_code = 6010-6080 |
                                               Postal code
                                                               6010-6080
  area_code = 0512 |
  licence = I |
                                               Area code
                                                               0512
  mayor = Hilde Zach |
                                               Licence plate code
  website = [http://innsbruck.at] |
                                               Mayor
                                                               Hilde Zach
                                               Website
                                                               www.innsbruck.atd
```

#### UNIVERSITÄT LEIPZIG



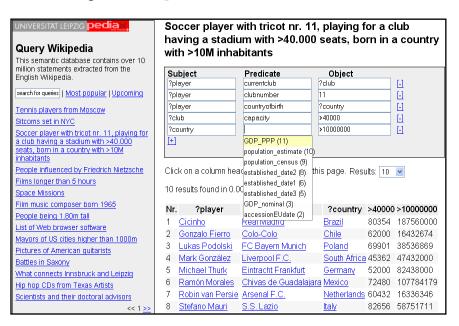






## **DBpedia for Users**

## **Query Wikipedia like a database**



## **DBpedia Mobile**





# Fourth Generation Example: Linking Open Data

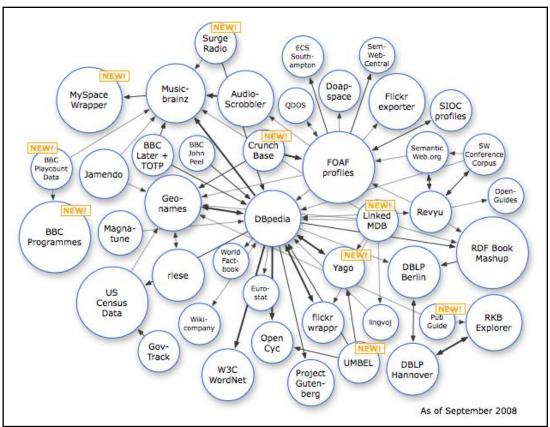
#### Goals

- Create a single, simple set of rules for publishing and linking RDF data
- Build a data commons by making open data sources available on the Web as RDF
- Set RDF links between data items from different data sources

## May 2009 LOD dataset

- ~4.7B triples, and ~140M RDF interlinks, and growing faster than I can track
- Database linkage means that LOD will soon be impossible to count except by order of magnitude

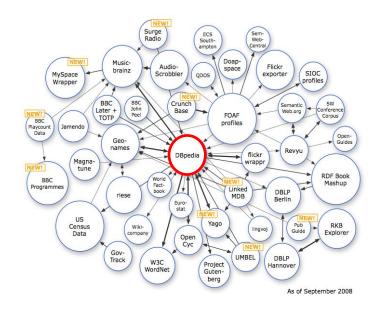




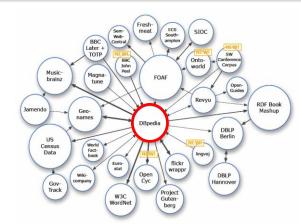
# The Growing Web of Data



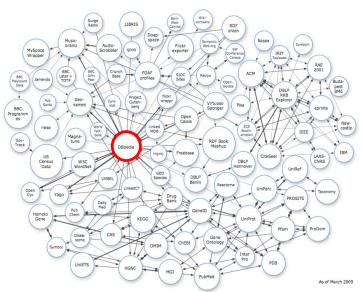
**May 2007** 



September 2008



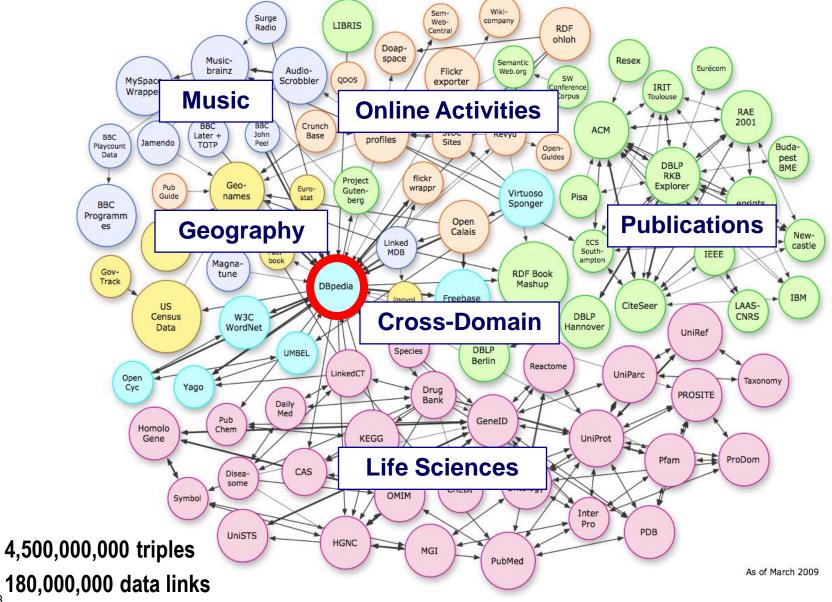
September 2007



**March 2009** 

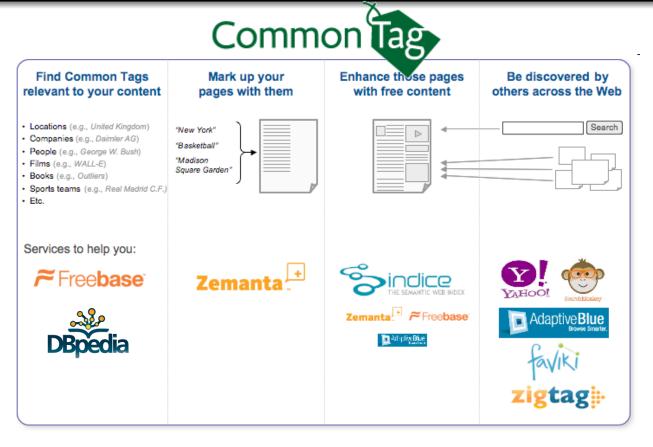


# **Topic Distribution in the Linked Datasets**





## **Common Tag Specification**



- Instead of tagging with language terms, tag with terms + RDFa
  - Distinguish between "jaguar" the animal, the car company, and the operating system
  - Provides metadata for each Common Tag and relations to other Common Tags
    - The Barack Obama Common Tag includes <employment, President of the United States> and <spouse, Michelle Obama>
- More discoverable, more connected, more web-like, more useful

# **Semantic Dynamism at Web Scale**

## Semantics are always changing

- Per minute, there are:
  - 100 edits in Wikipedia (144K/day)
  - 200 tags in del.icio.us (288K/day)
  - 270 image uploads to flickr (388K/day)
  - 1100 blog entries (1.6M/day)
- Will the Semantic Web be less dynamic?



- Ontologies are abstractions
  - Different applications lead to different ontologies
  - Ontology authors make design choices all the time
- Google Base: >250K schemas
- "Ontologies = Politics"



Lesson of the HTML <META> tag









Material from Denny Vrandečić, AIFB



## Fourth Generation Application: The Large Knowledge Collider



#### EC Framework 7 Program

 Lead partners: Univ. Innsbruck and Vrije University Amsterdam, plus 12 partners

## Goals of LarKC – Scaling to Infinity

- A platform for massive distributed incomplete reasoning
- Remove the scalability barriers of currently existing reasoning systems for the Semantic Web.
- Combine reasoning/retrieval and search
- Want to trade off answer quality and answer timeliness

### Reasoning pipeline

- Heavy emphasis on probability, decision theory, anytime algorithms
- Plugin architecture, with sampling
- Explicit cost models
- Public releases of LarKC platform, with APIs
- Encourage participation through Thinking@home
  - Kind of like SETI@Home



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## Exploiting web-scale semantics is the new frontier

- Generations 1 and 2 used web resources to support classical KR approaches
- Generation 3 (social semantic web) leverages web social patterns for KR
- Fourth generation applications address general web-scale KR

the Semantic Web.

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## Fourth Generation Application: The Large Knowledge Collider



- EC Framework 7 Program
  - Lead partners: Univ. Innsbruck and Vrije
- Reasoning pipeline
  - Heavy emphasis on probability,
- The real money in semantics will be made in apps/tools that exploit web-scale data
  - The cost of semantic data creation is going to zero
  - The size of semantic data is going to web-scale
- If LarKC is successful, this could be as big as PageRank™!
  - the Semantic Web.
  - Combine reasoning/retrieval and search
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## **Summing up: The Maturing Semantic Web**

#### In mid-2004...

- RDF and OWL had just been standardized
- Advances were made via traditional corporate/public R&D programs
- The first wave of semantic web startups (many of which have since failed)
- US Government implementations were technically very sophisticated, but fully custom and had no web involvement
- A few early conferences (ISWC, SemTech) and session tracks



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#### Now in 2009...

- The Semantic Web is the most exciting thing happening on the web
- RDF assertions scaling into the billions, with little to no programmatic control
- Search majors are starting to develop products
- Bestbuy is publishing store descriptions and hours in RDFa



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## I've Got that Scaling Feeling (i.e., the Google Property)

- Incentives are starting to falling into place with the search engines
- The Linked Data cloud is getting bigger and better
- The infrastructure to build non-tools-based companies is in place
- Conceptual Graph Results are directly relevant



# Спасибо (Thank You)

