INFO216:
Advanced Modelling

Theme, spring 2018:
Modelling and Programming the Web of Data

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Session S08-S09: Linked Open Datasets

- Themes:
  - semantic vocabularies *(mostly S07)*
  - linked open datasets *(S08-S09)*
    - Linked Open Data (LOD)
    - the LOD cloud
    - Open semantic repositories:
      - DBpedia, Wikidata, GeoNames
      - some others *(WordNet, YAGO, SUMO, Facebook OGP, Graph API)*
    - *...some of them have their own vocabularies*

Terms (→ S07–S09)

- *Semantic vocabularies*
  - graphs/datasets (in RDFS, OWL...) that define:
  - standard IRIs for *types of resources*
  - standard IRIs for *properties*
  - standard types (identified by IRIs) for *literals*
- *Semantic repositories, open semantic datasets*
  - graphs/datasets (in RDF, RDFS, OWL...) that define:
  - standard IRIs for *individual resources*
  - facts (as triples) about those *individual resources*
  - *may* also define their own vocabularies

Readings

- Resources in the portal:
  - research papers
  - LOD cloud og LOD stats
  - DBpedia
  - Wikidata
  - GeoNames
  - WordNet

Linked open datasets

Places to start (→S02)

- Open and semantic:
  - open semantic data sets: *http://lod-cloud.net*
  - vocabularies: *http://lov.okfn.org/dataset/lov/*
  - statistics and overviews: *http://stats.lod2.eu/*
- Open data in general:
  - internationally: *http://datahub.io*
  - Norge: *http://data.norge.no*
  - EU: http://publicdata.eu (and others)
  - Storbritannia: *http://data.gov.uk*
  - USA: *http://data.gov*

Linked Open Data (LOD, →S02)

- 3-4 basic principles (Berners-Lee 2006):

1. IRI-er (Uniform Resource Identifier) *identify resources*
   - http://dbpedia.org/resource/Bergen
2. IRI-s *answer to HTTP requests* (*dereferencing*)
   - requests be *SPARQL queries*
3. Returns *information about the resource* on standard format, e.g.,
   - *RDF-XML, Turtle, N3, JSON-LD (JSON, XML, CSV, TSV, HTML)*
   - *may use "303 redirection" to distinguish the Concept from the Document about it, e.g.,*
     - *http://sws.geonames.org/3161732/*
     - *http://sws.geonames.org/3161732/about.rdf*
4. The information contains IRI-s that *identify related resources*

Best Practices for Data Provisioning

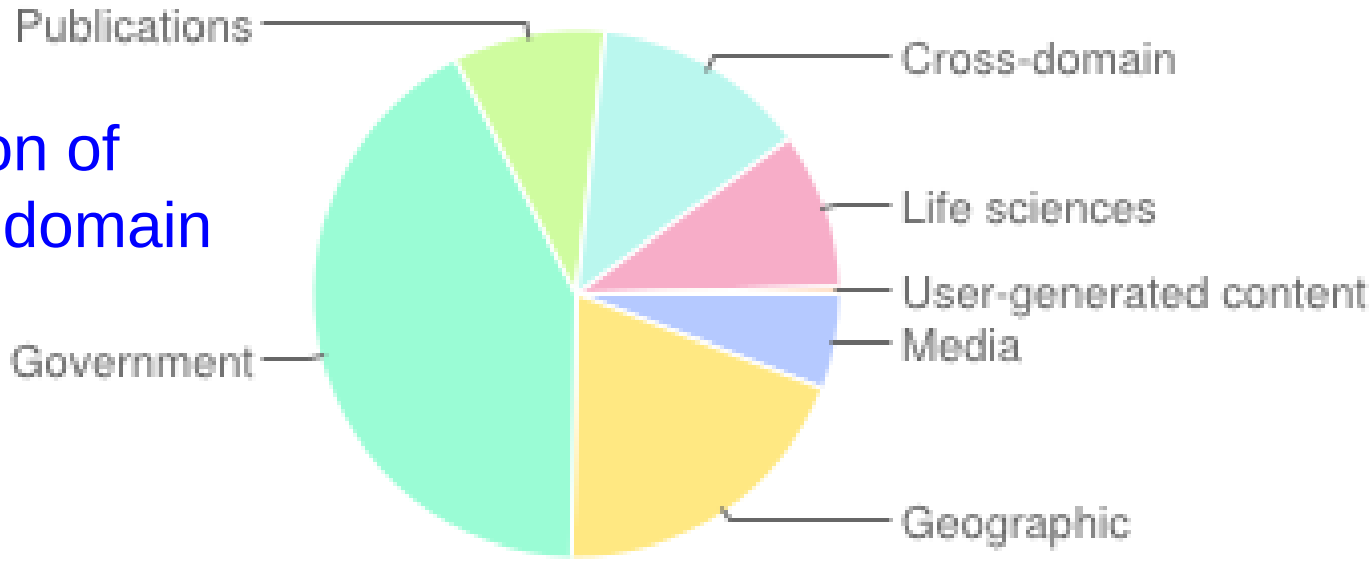
- Recommended directly by W3C
  - or have emerged within the LOD community:

1. Provide dereferencable IRIs
2. Set RDF links pointing at other data sources
3. Use terms from widely deployed vocabularies
4. Make proprietary vocabulary terms dereferencable
5. *Map proprietary vocabulary terms to other vocabularies*
6. *Provide provenance metadata (e.g., PROV)*
7. *Provide licensing metadata (e.g., CC)*
8. *Provide dataset-level metadata (e.g., VANN, VS)*
9. *Refer to additional access methods (e.g., SPARQL)*

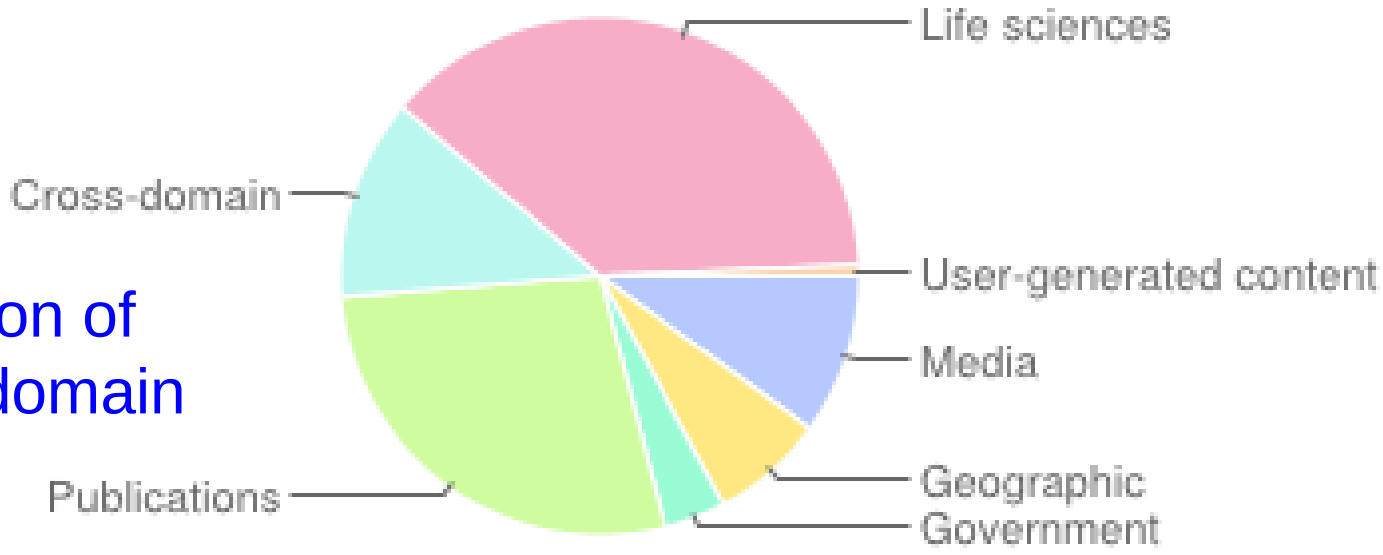
The LOD cloud

- *http://lod-cloud.net/*
  - 1163 datasets from datahub.io
    - started in 2007, doubled since 2011
    - still growing, but *consolidating*
    - triples with object or subject IRIs that belong to other datasets
  - statistics at http://lod-cloud.net/state/state_2014/
- *http://stats.lod2.eu/ is less restrictive*
  - 149G (149 423M) triples from 2973 data sets
  - mostly SPARQL endpoints, some from file dumps

Distribution of *triples* by domain (2014)



Distribution of *links* by domain (2014)

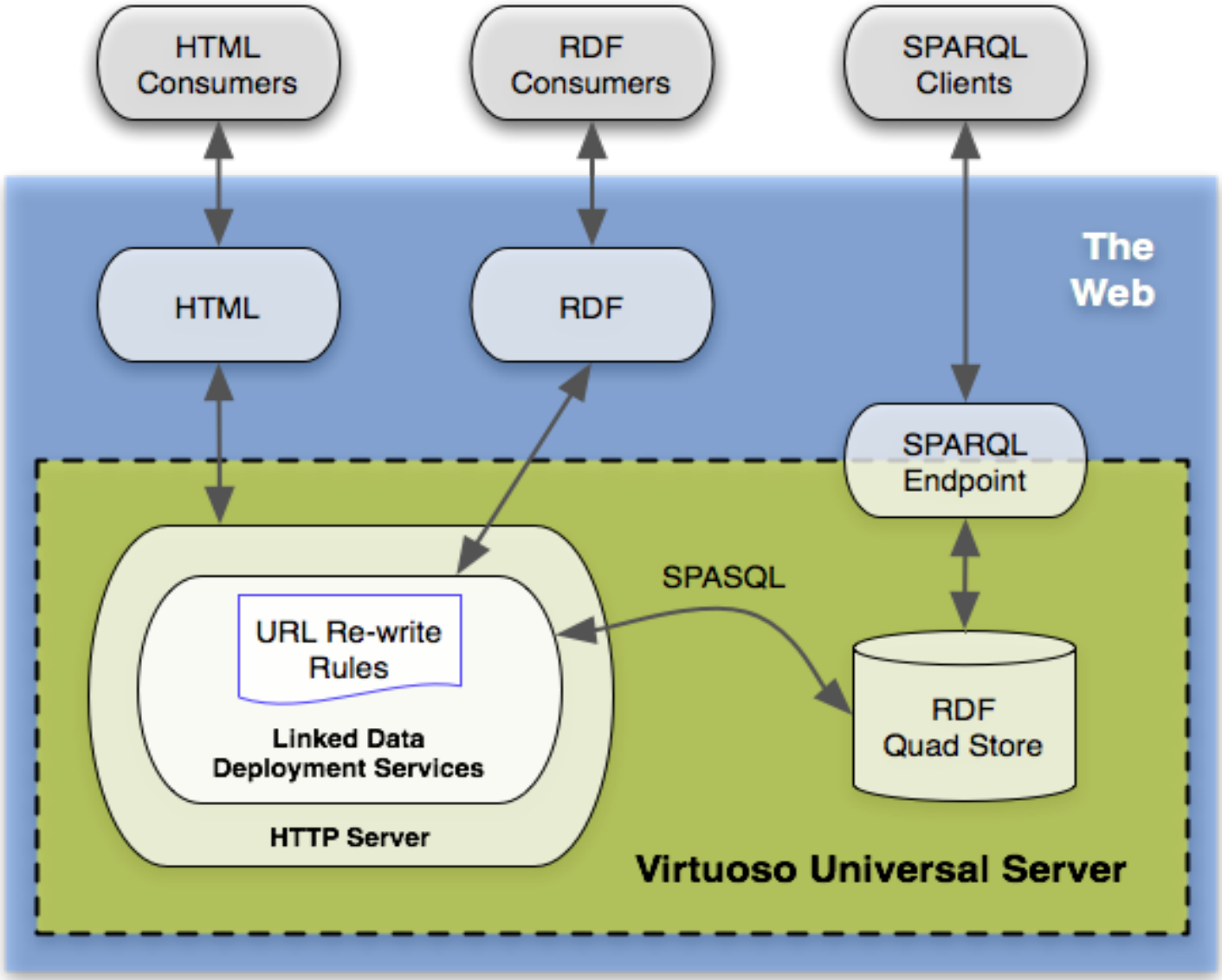


Challenges

- Semantic technologies and the Web of Data and LOD has an enormous potential
  - ...but is not so much used *in its entirety* so far
  - parts of it are used
    - commercially: biodata, publishing, music/media...
    - publically: clean energy, libraries...
- Possible causes:
  - abstraction: general versus domain data
  - trust: open versus closed networks
  - maintenance: individuals versus organisations
- *Some of the "lumps" in the LOD cloud form such domain-specific and more tightly-knit subnetworks*

DBpedia

- Extracting structured information from Wikipedia
  - a crowd-sourced community effort
  - making this information available on the web
- Important interlinking-hub for the Web of Data
  - http://dbpedia.org/resource/<Res>
- Available as:
  - RDF files, SPARQL endpoint (http://dbpedia.org/sparql)
  - HTML pages (http://dbpedia.org/page/<Res>)
  - faceted RDF browsing, powered by Virtuoso OpenLink
  - live SPARQL endpoint (http://live.dbpedia.org/sparql)
  - entity resolver dataset (http://demo.dbpedia-spotlight.org/)
  - lexicalizations dataset (maps names to Dbpedia IRIs)


HTML Consumers
RDF Consumers
SPARQL Clients
The Web
HTML
RDF
SPARQL Endpoint
SPASQL
URL Re-write Rules
Linked Data Deployment Services
HTTP Server
RDF Quad Store
Virtuoso Universal Server

DBpedia: extraction

- Extracted approximately once a year
  - current version is 2016-10
- Since January 2007:
  - first only in English
  - then 15 largest languages (since 3.7)
    - not Norwegian, but Swedish
  - today around 125 languages (since 3.8)
  - triple version + quad version with *provenance*
- Wikipedia's *infoboxes* are central
- ...also some full-text extraction and some NL parsing

DBpedia: ontology and identities

- IRIs derived from Wikipedia, e.g.:
    - *http://en.wikipedia.org/wiki/Bergen* →
    - *http://dbpedia.org/resource/Bergen*
    - English, canonical, dereferencable *URIs*
  - localised/national:
    - *http://no.dbpedia.org/resource/Bergen*
    - not always dereferencable *IRIs*
- Ontology (a stronger type of vocabulary):
  - 685 classes, 2795 properties
  - max depth: 5

DBpedia: raw and mapped extraction

- Wikipedia's *infoboxes* are central
  - raw transformation from *infoboxes* to triples:
    - generates national property names
    - infobox templates may be badly defined and used
    - inconsistent properties, no literal types
  - manual mapping (by scripts) from *infoboxes* to triples:
    - generates standardised properties
      → the DBpedia *ontology*
    - fixes many infobox problems
    - increasingly specific

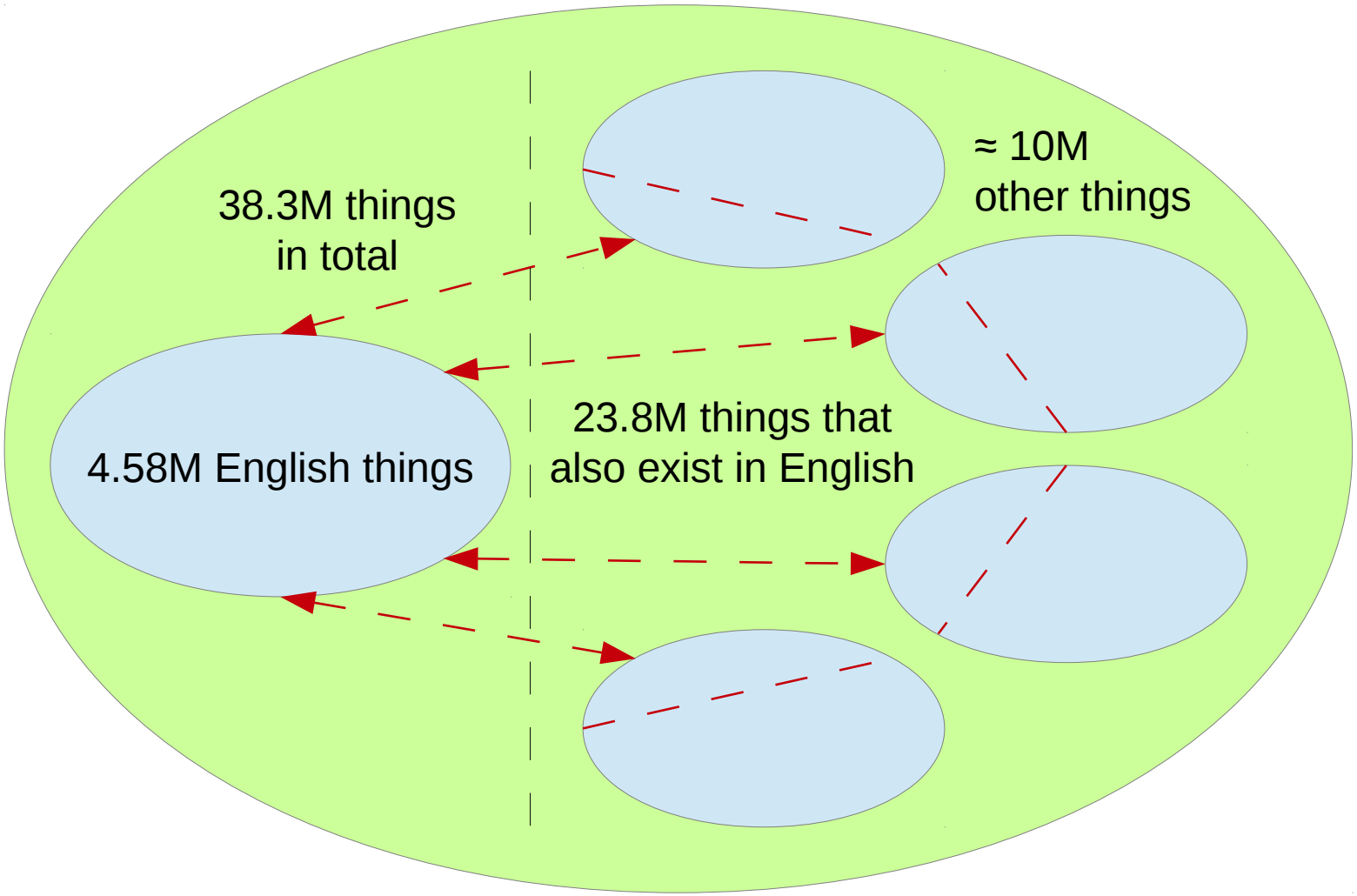
DBpedia: name spaces

- http://dbpedia.org/ – language-independent base, URIs
- http://nn.dbpedia.org/ – language-specific base, IRIs
  – approx.125 languages, not all dereferencable
- http://dbpedia.org/resource/ – resources (individuals)
- http://dbpedia.org/property/ – raw infobox properties
- http://dbpedia.org/ontology/ – mapped infobox properties and types
- http://dbpedia.org/reference/ – external references
- foaf:homepage – external identifier reference
- owl:sameAs – interlinking, e.g, across languages
- rdf:type – three classification schemes

DBpedia: statistics

- Contents:
  - 38.3M resources (“things”, in 2015)
    - 128 languages
    - 23.8M resources (2015) are localised versions of
    - 4.6M resources from the English Wikipedia
      - 1.5M persons, 810k places, 490k works, 275k organisations, 301k species...
      - also 1.7M SKOS concepts and other stuff

Canonical and normalised resources



(Example numbers from 2015-10.)

DBpedia: triples

- The full (international) data set:
  - 9.5G triples *(≈ 6.4% of http://stats.lod2.eu/)*
    - 1.3G from the English Wikipedia
    - 5.0G from other Wikipedias
    - the rest from Commons and Wikidata
  - 38M labels and abstracts (2015 here and below)
  - > 120M categorisation links
    - 67M links to Wikipedia categories
  - 24.6M links to images
  - 27.6M links to external web pages
  - 45M other external links: GeoNames, Freebase, Wikidata, Flickr wrappr, UMBEL...

Dbpedia: advantages

- Covers many domains
  - like Wikipedia, exploits *the long tail*
- Real community agreement
- Automatically evolves (as Wikipedia changes)
- Is truly multilingual

DBpedia: classification schemes

- Wikipedia Categories:
  - *81M links*
  - SKOS vocabulary and DCMI terms
- YAGO Classification:
  - *41M links*
  - Yet Another General/Great Ontology
  - derived from Wikipedia using WordNet (also from GeoNames)
- Word Net Synsets:
  - derived directly from the infoboxes
- *...also 50M other links (30M to web pages)*

Freebase

- *A terminated free and open knowledge base that could be read and edited by both humans and machines*
  - from 2007
  - similar to DBpedia, but crowdsourced
  - acquired by Google in 2010
  - closed in 2014
    - data dumps still available
- *...a central information source for Wikidata*

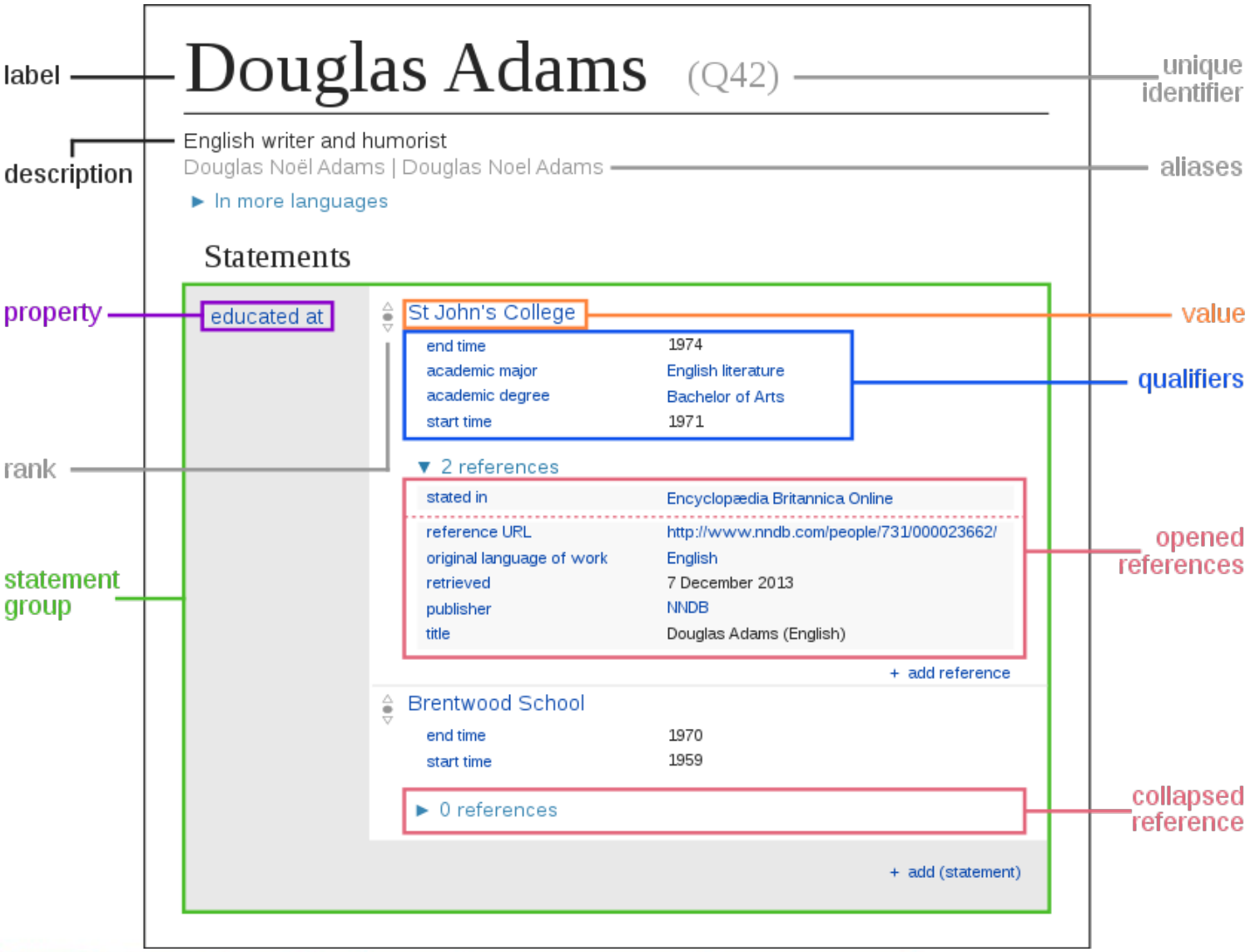
Wikidata

- *A free and open knowledge base that can be read and edited by both humans and machines*
  - a Wikimedia project, crowdsourced
  - *a Wikipedia for structured data*
  - central storage for the structured data of its Wikimedia sister projects:
    - Wikipedia, Wikivoyage, Wikisource, etc.
  - supports many other sites and services
  - free license, standard formats, interlinked
- Wikidata entities:
  - 30M items (things)
  - 3000 properties

Wikidata access

- Available through
  - the WikiMedia API
  - HTTP: http://www.wikidata.org/entity/Q42
  - RDF: http://www.wikidata.org/entity/Q42.ttl
  - SPARQL endpoint: http://query.wikidata.org
    - Wikidata Query Service (WDQS)
  - for download (JSON, RDF, XML)
- Also as Linked Data Fragments:
  - https://query.wikidata.org/bigdata/ldf
- DBpedia also offers Wikidata compatible dumps

Wikidata item structure

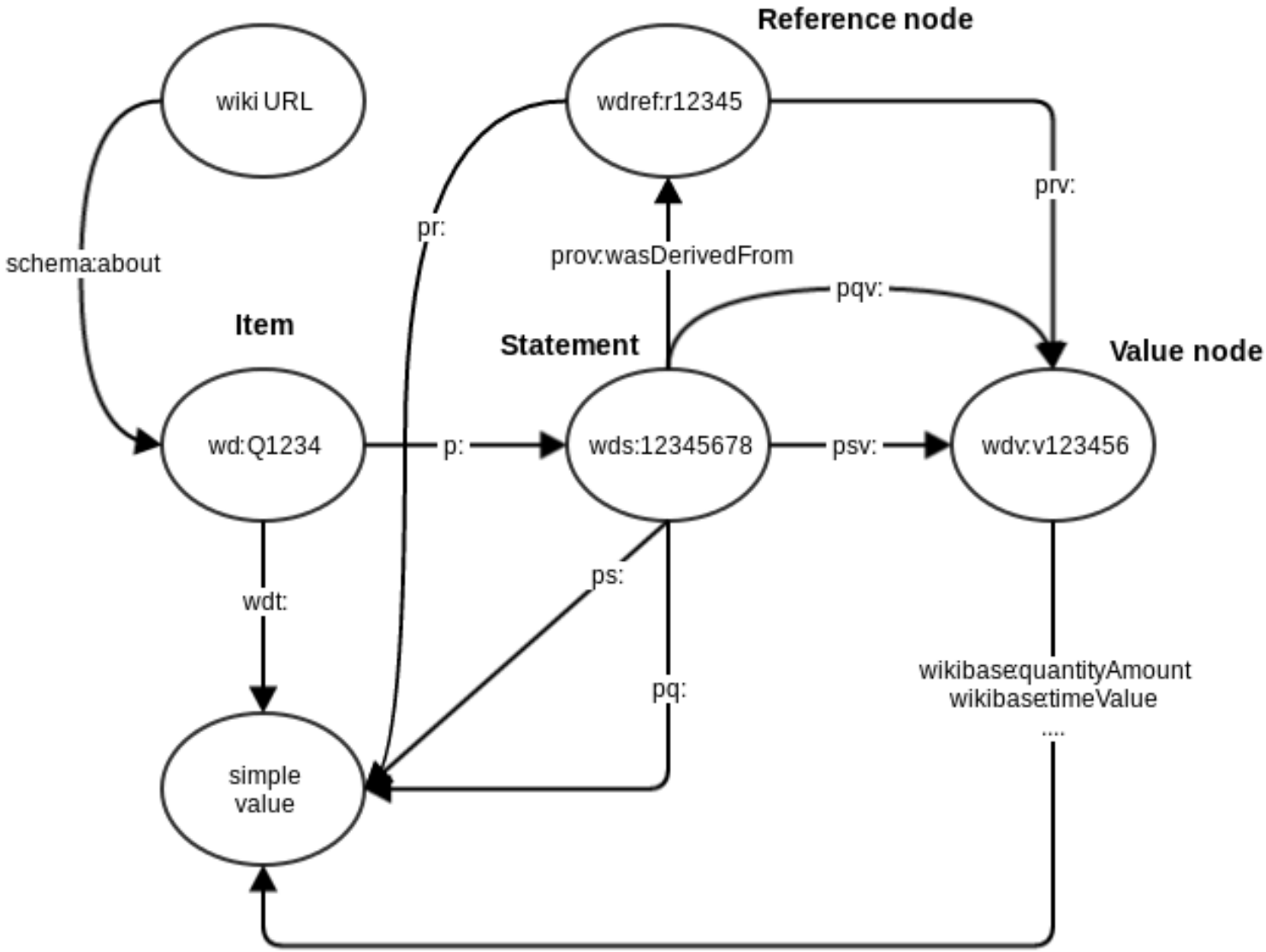


Wikidata item structure

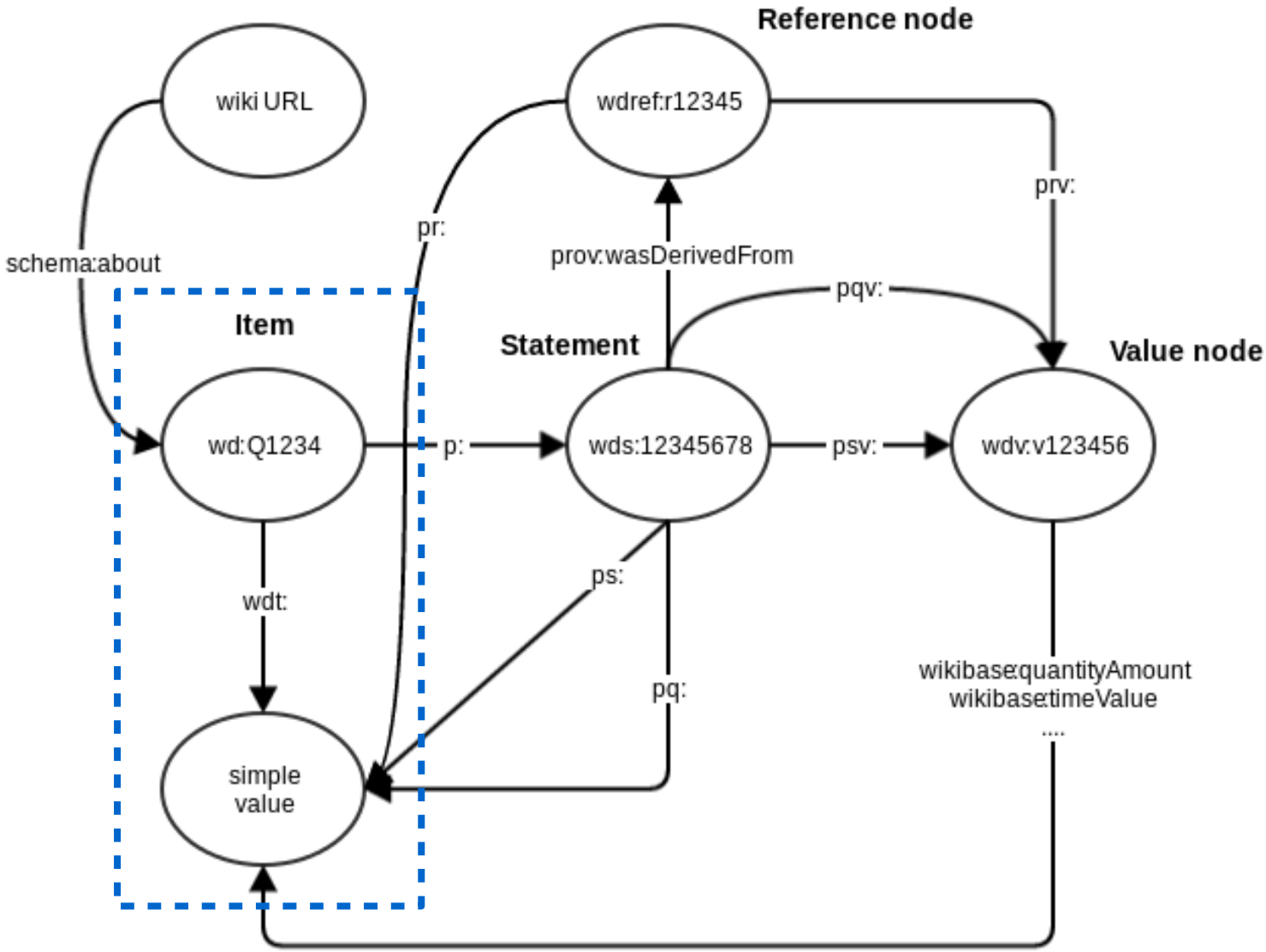
- Items:
  - item identifier (Q*nn*)
  - fingerprint:
    - multilingual label, description, aliases
  - statements, each:
    - claim: a property-value pair
    - qualifiers: additional property-value pairs
  - references (one or more property-value pairs)
  - rank
- Site links

- *Similar structure for properties!*

Wikidata RDF mapping



Wikidata RDF mapping



Wikidata Query Service (WDQS)

- SPARQL wrapper for Wikidata (http://query.wikidata.org)
  - based on BlazeGraph, OpenRDF/RDF4J
  - built-in prefixes
  - generate query IRIs
  - various entity/ontology explorers, e.g.,
    - SQID (https://tools.wmflabs.org/sqid/#/)
  - GraphBuilder
  - built-in visualisations
  - built-in SERVICEs (wikibase:label)
- Also:
  - Linked Data Fragments (https://query.wikidata.org/bigdata/ldf)

```
PREFIX wikibase: <http://wikiba.se/ontology#>
PREFIX wd: <http://www.wikidata.org/entity/>
PREFIX wdt: <http://www.wikidata.org/prop/direct/>

#defaultView:BubbleChart

SELECT ?cLabel ?p WHERE {
    ?c wdt:P31 wd:Q6256 .
    ?c wdt:P30 wd:Q46 .
    ?c wdt:P1082 ?p .
    SERVICE wikibase:label {
        bd:serviceParam wikibase:language "en" .
    }
}
```

WDQS visualisations

- Use a comment: #defaultView:viewName
- Supported viewNames:
  - Table - default view, displays the results as a table
  - Map - displays coordinate points if present
  - ImageGrid - displays result images as a grid
  - BubbleChart - displays numbers as bubble chart
  - TreeMap - displays hierarchical tree map for numbers
  - Timeline - displays timeline for results having dates
  - Dimensions - displays rows as lines between points
  - Graph - displays result as a connected graph
- (More limited) server-side alternative to Sgvizler

Wikidata versus DBpedia

- Similarities:
  - both publish RDF data about entities/resources
  - both use standard IRIs derived from Wikipedia
  - both define ontologies
  - both are extensively linked to other semantic datasets
- Differences:
  - source: DBpedia is derived; Wikidata is crowdsourced
  - direction: DBpedia extracts data from Wikipedia; Wikidata provides data to Wikipedia
  - structure: DBpedia adds structure to Wikipedia data; Wikidata is natively structured
  - maturity: DBpedia is older; Wikidata getting started

GeoNames

- *Adding geospatial semantic information to the web*
  - a geographical database: *http://www.geonames.org*
  - collected from a large number of sources
  - > 10M geographical names (*toponyms*, Norway 68k), > 9M unique features, ~ 2.8M populated places, ~ 5.5M alternate names
- Offers *dereferencable IRIs* for *toponyms / place names*
  - *"303 redirection"* for *Concept-Document distinction*
  - i.e., an entity and the information about it are different resources
    - *http://sws.geonames.org/3161732/*
    - *http://sws.geonames.org/3161732/about.rdf*

GeoNames

- Available as:
  - map-based HTML pages (POW – “Plain Old Web”)
  - web APIs (REST, XML, RDF)
  - SPARQL endpoints
  - dereferencable IRIs
  - downloadable (TSV)
  - Gazetteer lists
- Also as Linked Data Fragments:
  - http://data.linkeddatafragments.org/geonames

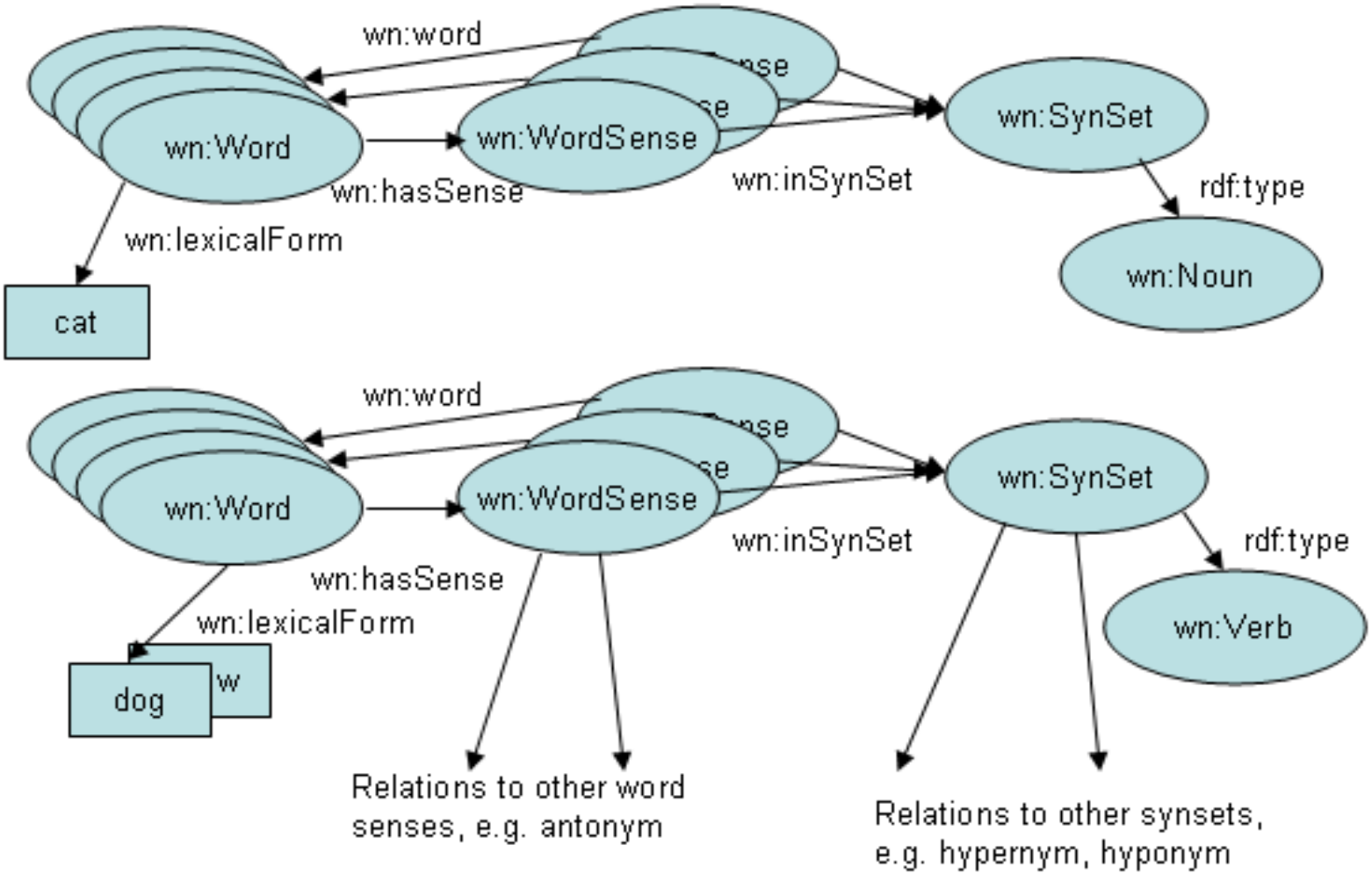
GeoNames ontology

- Vocabulary in OWL:
  - @prefix gn: <http://geonames.org/ontology#> .
  - gn:Feature class
  - 9 top-level feature codes:
    - **A** country, state, region, ...; **H** stream, lake, ...; **L** parks, area, ...; **P** city, village, ...; **R** road, railroad; **S** spot, building, farm; **T** mountain, hill, rock, ...; **U** undersea; **V** forest, heath, ...
    - 645 detailed feature codes (in a hierarchy)
  - gn:name, gn:alternateName, gn:locationMap, gn:countryCode, gn:featureClass, gn:featureCode, gn:nearbyFeatures, gn:parentADM1, gn:parentADM2, gn:parentCountry, gn:population, gn:wikipediaArticle
  - also uses properties from *geo, foaf, dcterms, cc, rdfs...*

WordNet

- An electronic open-source dictionary (Miller, 1985-):
  - 155k open-class words, 118k synonym sets *(synsets)*, 207k Word-Sense pairs
  - hand-written definitions, common-use frequencies
  - version 3.1 available for download or online:
    - http://wordnetweb.princeton.edu/perl/webwn
  - APIs in many languages (Java, Python)
  - RDFS and OWL versions exist
    - WordNet in RDF:
      https://www.w3.org/TR/wordnet-rdf/
      http://wordnet-rdf.princeton.edu/
  - also versions for other languages

WordNet: Structure



WordNet: Standard synset IRIs

- *@prefix wn20schema: <http://www.w3.org/2006/03/wn/wn20/schema/> .*
- *@prefix wn30: <http://purl.org/vocabularies/princeton/wn30/> .*
- *@prefix wn31: <http://wordnet-rdf.princeton.edu/wn31/>.*
- Example:
  - *wn31:synset-bank-noun-2*
- Other open semantic datasets – partly derived from WordNet – offer other IRI-schemas

WordNet: Synset structure

- Different *concept relations* for each *Part of Speech (PoS)*
- Nouns:
  - hyponyms/hypernyms
    bat-n-1 is-kind-of placental_mammal-n-1
  - type / instance
    Norway-n-1 instance-of Scandinavian_country-n-1
  - holonyms/meronyms
    bat-n-1 has-part wing-n-1
  - *antonyms*
    birth-n-1 has-antonym death-n-1
  - entailment, domains
    bat-n-2 has-domain baseball-n-1

WordNet: Synset structure

- Verbs:
  - troponyms/hypernym
    communicate-v-2 has-troponym talk-v-2
    talk-v-2 has-troponym whisper-v-1
    - depending on semantic field:
      run-v-1 has-troponym jog-v-3
      like-v-2 has-troponym love-v-2
  - verb groups
  - antonyms
    love-v-1 has-antonym hate-v-1
  - similarity, sister terms
    bat-v-1 has-sister swat-v-1

WordNet: Synset structure

- Adjectives:
  - semantic, similarity, antonyms, indirect antonyms
- Adverbs:
  - similar to adjectives
- Also cross-PoS:
  - island – islander (derived from)
  - talk – speak for (phrasal)...
  - ...and others

WordNet: Norsk Ordvev

- Developed Kaldera språkteknologi
  - for Nasjonalbiblioteket (The national library)
  - both *bokmål* and *nynorsk*
  - ≈ 50 000 words, 200 000 synsets each
- Available at
  - http://www.nb.no/sprakbanken/show?serial=sbr-27&lang=nb
  - https://www.nb.no/sprakbanken/show?serial=sbr-7&lang=nb
  - updated January / February 2016
- *So far not looking finished...*

International language resources

- Global Wordnet Grid (http://globalwordnet.org/)
  - building a *Global Multilingual Wordnet* http://compling.hss.ntu.edu.sg/omw/
- DBpedia Wiktionary as Linked Data Fragments
  - *extracting a DBpedia from Wiktionary*
  - http://data.linkeddatafragments.org/wiktionary
- Dbnary (http://kaiko.getalp.org/about-dbnary/)
  - *extracting a DBpedia from Wiktionary*
  - automatic extraction of RDF graphs from Wiktionary
- BabelNet (http://babelnet.org)
  - multilingual text analysis and translation
  - *BabelNet is very active at the moment!*

BabelNet

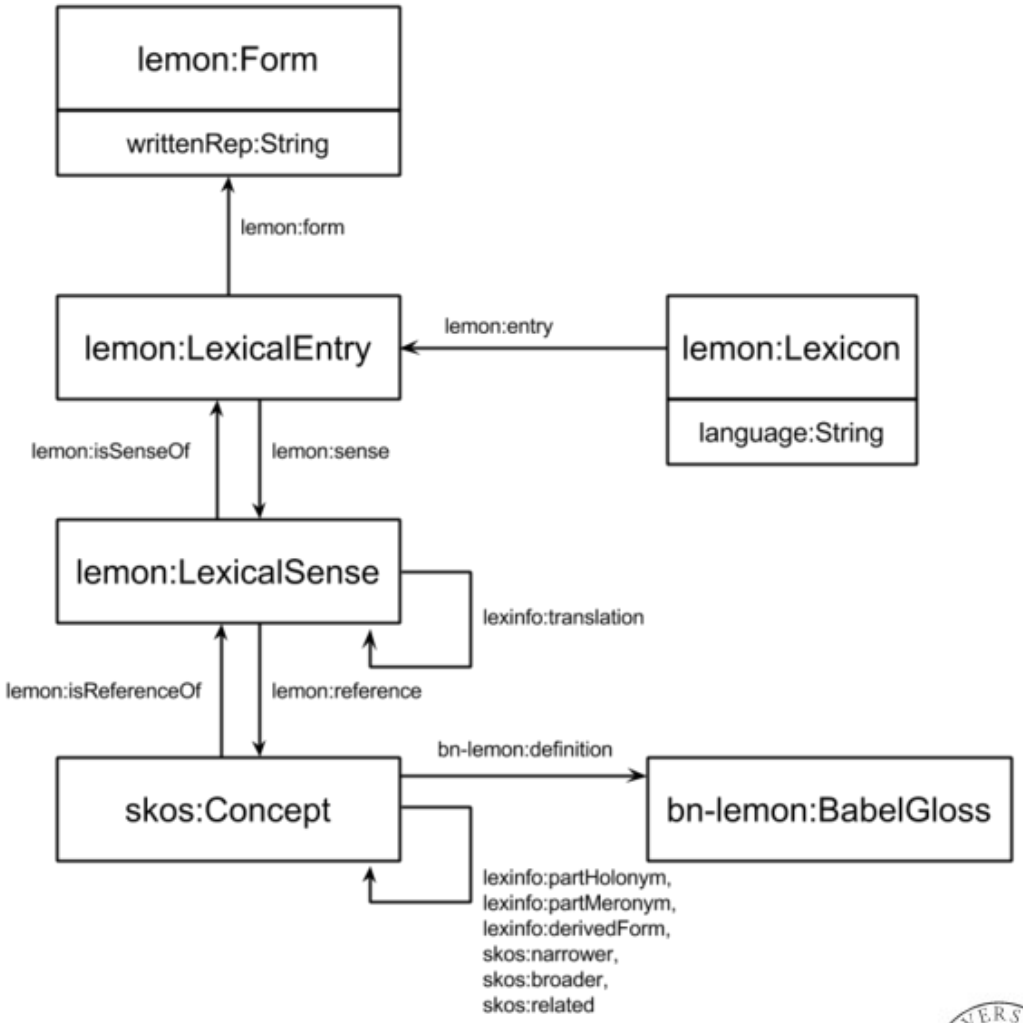
- A multilingual encyclopedic dictionary and a semantic network of concepts and named entities
  - both lexicographic and encyclopedic coverage
  - 15 million Babel synsets
  - integrates data from *WordNet, Open Multilingual Wordnet, Wiktionary, Wikidata, Wikipedia, Wikiquotes, GeoNames* and several others

BabelNet availability

- Available as:
  - web lookup service
  - web translation service
  - web API (JSON) with Java library
  - SPARQL endpoint
  - linked data interface
    - http://babelnet.org/rdf/page/
    - the Linguistic LOD (LLOD) cloud

BabelNet conceptual model

- Making BabelNet part of the LLOD cloud
- Vocabularies:
  - Lemon
  - BabelNet-lemon
  - LexInfo
  - SKOS
  - RDFS
  - DC elements
  - DC terms
- Lemon is the backbone

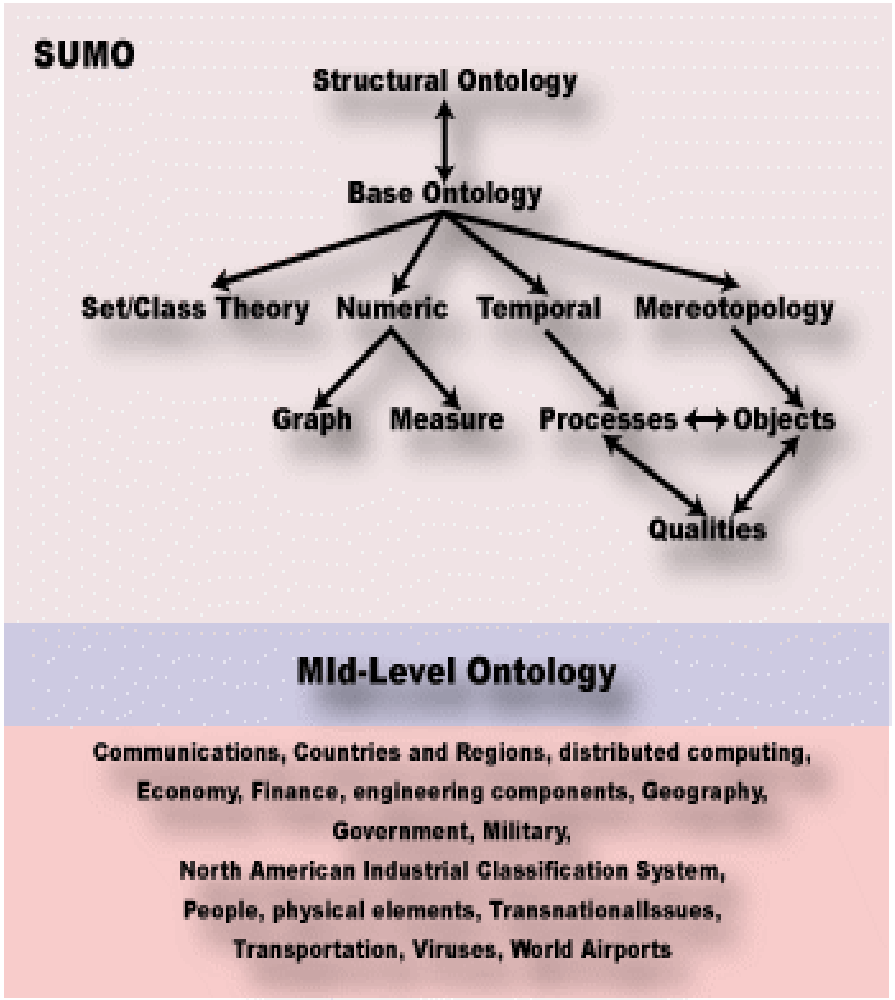


YAGO2

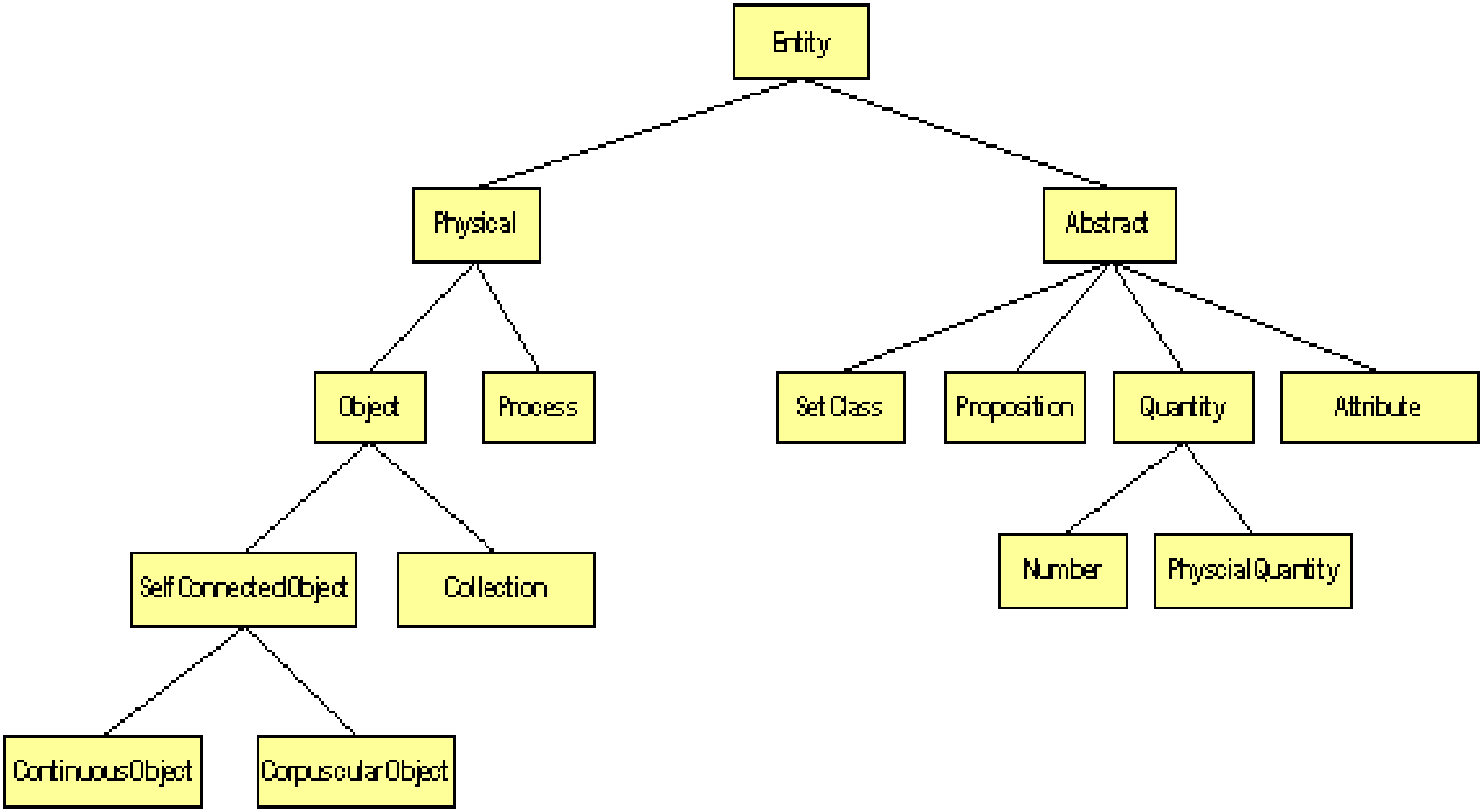
- *Yet Another General/Great Ontology:*
  - facts extracted from Wikipedia (the category structure), WordNet and GeoNames...
    - 10M entities, 120M triples/facts
    - places facts and entities in time and space
    - ...and in WordNet domains
  - integrated with DBpedia and SUMO
    - used to categorise DBpedia's resources
  - a commonsense knowledge base
    - used in IBM's Watson system
  - downloadable as RDF
  - querying and browsing at http://www.mpi-inf.mpg.de/yago-naga/yago/

Suggested Upper Merged Ontology (SUMO)

- Defines and organises concepts *formally and philosophically*:
  - 22.6k terms
  - 307k axioms
  - 5k rules
- Mapped to WordNet, DBpedia, YAGO...
- Available online, KIF and OWL dumps
- IEEE working group



High-level concepts



Subclass Hierarchy Tree

- entity
  - physical
    - object
    - process
      - dual object process
      - intentional process
        - intentional psychological process
        - recreation or exercise
        - organizational process
        - guiding
        - keeping
        - maintaining
        - repairing
        - poking
        - content development
        - making
          - constructing
          - manufacture
            - publication
          - cooking
        - searching
        - social interaction
        - maneuver
      - motion
      - internal change
      - shape change
  - abstract

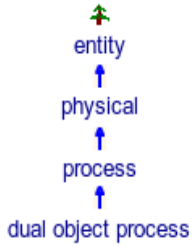
dual object process (DualObjectProcess)

Any Process that requires two, nonidentical patients.

Ontology

SUMO / BASE-ONTOLOGY

Superclass(es)



Subclass(es)

substituting transaction comparing attaching detaching combining separating

Coordinate term(s)

intentional process internal change motion shape change

Axioms (1)

If process is an instance of dual object process, then there exist obj1,obj2 so that obj1 is a patient

```
(=>
    (instance ?PROCESS DualObjectProcess)
    (exists
        (?OBJ1 ?OBJ2)
        (and
            (patient ?PROCESS ?OBJ1)
            (patient ?PROCESS ?OBJ2)
            (not
                (equal ?OBJ1 ?OBJ2)))))
```

UMBEL

- CYC:
  - base of common sense knowledge
  - Douglas Lenat (since 1984)
  - > 1M assertions, rules or common sense ideas
- OpenCYC:
  - 47k concepts and 306k facts
  - available in OWL
- UMBEL:
  - a lightweight reference structure of 20,000 subject concept classes and their relationships derived from OpenCyc
  - can act as binding classes to external data
  - linked to 1.5M named entities from DBpedia and YAGO

Google's Knowledge Graph

- Google Hummingbird (2013)
  - one of many updates of Google's search engine
  - attempts to leverage user context and intention
  - a move towards semantic search
- Google Knowledge Graph
  - seeded from Freebase
  - facts from Wikipedia, Wikidata, CIA World Factbook
    - explicit entities
  - also enriched by natural-language parsing (NLP)
    - implicit entities

Caution: *The public documentation is limited, so this is compiled based on presentations, technical notes, forums etc.*

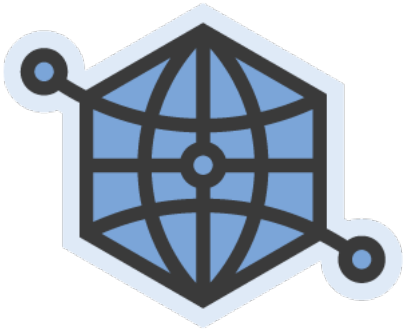
Google's Knowledge Vault

- Google Knowledge Vault
  - extends the Knowledge Graph
  - covers resources not from open semantic datasets
  - facts extracted from the whole web
    - NLP of text documents
    - HTML trees and tables
    - human annotated pages (e.g., schema.org)
  - probabilistic reasoning
    - graph-based priors
    - knowledge fusion

Caution: *The public documentation is limited, so this is compiled based on presentations, technical notes, forums etc.*

Facebook's “Open” Graph Protocol (OGP)

- Including resources (in particular web pages), through their IRIs, in social graphs
  - targetting webmasters and content-management system (CMS) developers
- @prefix og: <http://ogp.me/ns#>
- Main properties:
  - required: og:title, og:type, og:image, og:url
  - optional: og:audio, og:description, og:determiner, og:locale, og:locale:alternate, og:site_name, og:video
    - ...some of them combines with more specific ones
  - *...markup with RDFa <meta>-tags*



OGP uses

- Uses:
  - originally developed by Facebook to extend the “Likes” mechanism to resources outside Facebook
  - also taken up by some other graph maintainers (claim: used by Google)
  - publishing side:
    - IMDb, Microsoft, Rotten Tomatoes, Yelp

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OGP resource types

- <meta property="og:type" content=”ResType" />
- Some predefined resource types for:
  - music: music.song, music.album, music.playlist...
  - video: video.movie, video.episode, video.tv_show...
  - others: article, book, profile, website
- Each predefined resource type has further type-specific properties, e.g.,
  - music:duration, music:album:track, music:musician
- Data types:
  - boolean, date/time (ISO 8601), enum, float, integer, string, URL

Facebook's Graph API

- Letting external applications access the information in Facebook's social graph
  - inspired by *social networks*
- *Nodes* represent “things”: *User, Photo, Page, Comment*
- *Edges* represent connections between the "things":
  - Users' *friends*, Pages' *photos*, Photos' *comments*...
- *Fields* contain information about the "things":
  - the *birthday* of a User, the *name* of a Page...
- *Seriously restricted since version 2.0... (Privacy!)*
  - *the idea remains important*
  - *open, user-owned alternatives are emerging*
    - *GNU social (StatusNet), Diaspora...*

Facebook Graph API

- *REST*-based (REpresentational State Transfer)
  - an example of a *web service*
  - all nodes have IRIs
  - GET, POST, DELETE over HTTP
- GET graph.facebook.com/facebook/picture?redirect=false
  - this is sent over HTTP (at least):
    GET /facebook/picture?redirect=false HTTP/1.1
    Host: graph.facebook.com
- Many API operations are based on *access tokens*
  - returned by *Facebook login*
  - mandatory for POST and DELETE
  - *friends' information must be explicitly granted*

Facebook Graph API

- Most HTTP-requests go to:
  - http://graph.facebook.com/...
  - http://graph-images.facebook.com/...
- Node paths:
  - GET graph.facebook.com/{node-id}
- Edge paths:
  - GET graph.facebook.com/{node-id}/{edge-name}
- With access token:
  - GET graph.facebook.com/me
- POST and DELETE are also used

Try it out: https://developers.facebook.com/tools/explorer