

## **Part 3: Knowledge Modeling – Semantic Web**

## Implicit vs. Explicit Knowledge

Information retrieval and data mining aim at extracting and using knowledge that is implicitly represented in documents

Alternatively, knowledge can, and is, also explicitly represented

feature extraction:  
implicit

# **Overview**

1. Semi-structured data
2. Semantic Web
3. RDF - RDF Resource Description Framework
4. Semantic Web Resources

# **1. SEMI-STRUCTURED DATA**

# Database Schemas

**Schemas** define data structures for databases

- Relational database schemas, XML Schemas

Agreement on data structures

- Well understood interpretation of data values
- Data consistency, e.g., integrity constraints

Optimizing query evaluation and data storage

- e.g. schema fragmentation for distributed databases

STUDENTID	NAME	COURSE	Schema
1234	John	DIS	
3456	Bob	physics	
2345	Ann	DIS	

Schemas in database management systems play two important roles. On the one hand they define a priori data structures that capture that application semantics. In particular they label data values with names (e.g. attribute names) that have a well-understood semantics. By defining fixed data structures and additionally imposing integrity constraints they additionally assure that data stored in the database remains structurally and semantically coherent. Exploiting knowledge on data structures also enables query and storage optimizations. Distributed database schema design, as studied in the previous part of the lecture are a typical example of how schema information is exploited for optimization.

However, in many information processing settings, e.g., on the Web, schema information is not always readily available, and imposing the use of schema might be too rigid and turn into a disadvantage.

# Data on the Web

Example: Searching biological data

- Based on textual content of Web pages (e.g. Google)

Searching for data on "anglerfish"

- Results will be precise

This seems easy, but the same for "leech"

- Organism leech
- Software: LeechFTP
- Rock band: Leech
- Authors: Leech
- Protein sequences: ...MNTSLEECHMPKGD...



Search for "257" ...

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In the typical Web setting no schema information is being used. When searching for information content-oriented queries are used, e.g., by providing keywords. This may work well for very specific search terms, such as illustrated for the example "anglerfish", but might become problematic, when the search term has an **ambiguous** meaning, as illustrated for the example "leech". The problem is that when the type of the information that is searched is not specified (in the case of the example the type would be "Organism"), the search algorithm cannot disambiguate the different potential meanings of the search term. If we consider the search term as a data value, this would correspond to the case where we consider a data value in a relational database without knowing its type and attribute name. For purely data-oriented searches, such as for a numerical value the problem becomes even more evident. Thus it appears for some cases having a data schema available, would seem also helpful for searches in the Web.

ambiguity

- different results when searching for leech

## Using HTML to Structure Data

The screenshot shows a web page with a table of protein entries. The table has columns for ID, Accession, Name, and Description. A callout bubble points from the table to the text "HTML table layout to structure the data!?".

All	Accession	Name	Description
<input type="checkbox"/>	Q96451	1433B_SOYBN	14-3-3-like protein B <sub>c</sub> (SGF14B) (Fragment)
<input type="checkbox"/>	P68252	1433D_BOVIN	14-3-3-like protein gamma (Protein kinase C inhibitor protein 1) (KCIP-1) (Cleaved into: 14-3-3 protein gamma, N-terminally processed)
<input type="checkbox"/>	Q5F3W6		14-3-3 protein gamma-2
<input type="checkbox"/>	P61981		Bos taurus (Bovine)
<input type="checkbox"/>	P61982		Gallus gallus (Chicken)
<input type="checkbox"/>	Q5RC20	1433G_PONAB	14-3-3 protein gamma
<input type="checkbox"/>	P61983	1433G_RAT	14-3-3 protein gamma [Cleaved]
<input type="checkbox"/>	Q2F837	1433Z_BOMMO	14-3-3 protein zeta
<input type="checkbox"/>	Q6PC29	143G1_DANRE	14-3-3 protein gamma-1
<input type="checkbox"/>	Q6UFZ3	143G1_ONCMY	14-3-3 protein gamma-1 (Protein 14-3-3G1)
<input type="checkbox"/>	Q6PCG9	143GA_XENLA	14-3-3 protein gamma-A

Done

HTML table layout to structure the data!?

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A typical approach to handle data in the Web is to use structured layouts, e.g. using HTML tables. In this way a context is provided, that allows to correctly interpret data values. When inspecting the source code of a typical HTML-based page with structured data, we recognize however that it might become difficult to automatically process such a page and correctly interpret the data contained in it. Such processing might be very involved and error-prone, even more so that in the context of editing Web page layout no mechanisms assure that the intended page structure is correctly implemented. The problem is that a layout language, such as HTML, never has been conceived to specify semantics of data.

instead of using tags to provide layout instructions

## Application-specific Markup

we use tags to provide meaning

### Limitations of HTML

- Structure of data expressed as layout:  
`<tr><td> leech </td><tr>`
- Semantics of data hard to analyse and difficult to share
- No schemas, no constraints

### Making the meaning of data explicit

- SwissProt: `<Species> leech </Species>`
- EMBLChange: `<Organism> leech </Organism>`

### Embedding of schema information into the data

Application-specific  
markup (tags)

Therefore an alternative approach for specifying the meaning of data contained in documents, in particular in Web documents, has been conceived. As for HTML it is based on the idea of using tags, i.e. markup that associates to parts of a document a name. However, instead of using tags to provide layout instructions (e.g. a table format), tags are used to provide domain-specific meaning to data contained in a document. For example, markup can be used to specify that a specific name (such as leech) denotes an organism. This approach is of course well known and widely used. For example, email formats contain different standard markups to indicate the different parts of a mail. In the Web this approach has found wide-spread adoption through the XML format. XML generalizes the markup approach from HTML to allow applications to specify their application-specific tags and to embed them into documents.

**Exercise:** refresh your knowledge on XML and schemas in XML.

## Semi-structured Data

Data that contains tags, markup or similar to specify the semantics of data values and to relate different data values (e.g. hierarchically)

No predefined structure, no schema required!

Examples of semi-structured data

- Email
- Microformats (e.g. hCard)
- JSON
- XML (Extensible Markup Language)

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Data that contains embedded schema information, such as tags or markup, is generally called semi-structured data. Semi-structured data allows to indicate the meaning of data values, as in structured data with schemas, without requiring predefined schemas. This combines flexibility with the ability to capture meaning. The fact that semi-structured data does not require schemas, does not imply that we cannot define schemas for semi-structured data. XML is an example of this. We can have XML structured documents without schema, so-called well-formed XML documents, but define in addition schemas for XML (document type definitions, so-called XML DTDs). Documents that follow such a schema are then called valid XML documents.

- what does predefined schemas mean [something that already has a layout / table with its elements already specified](#)
- why does semi structured data not require schema [read above](#)
- what is a schema [think of it as a format](#)

# XML – a Document Markup Language

```
<?xml version="1.0"?>
<purchaseOrder orderDate="1999-10-20">
  <shipTo country="US">
    <name>Alice Smith</name>
    <street>123 Maple Street</street>
    <city>Mill Valley</city>
    <state>CA</state>
    <zip>90952</zip>
  </shipTo>
  <billTo country="US">
    <name>Robert Smith</name>
    <street>8 Oak Avenue</street>
    <city>Old Town</city>
    <state>PA</state>
    <zip>95819</zip>
  </billTo>
  <comment>Hurry, my lawn is going wild!
  </comment>
```

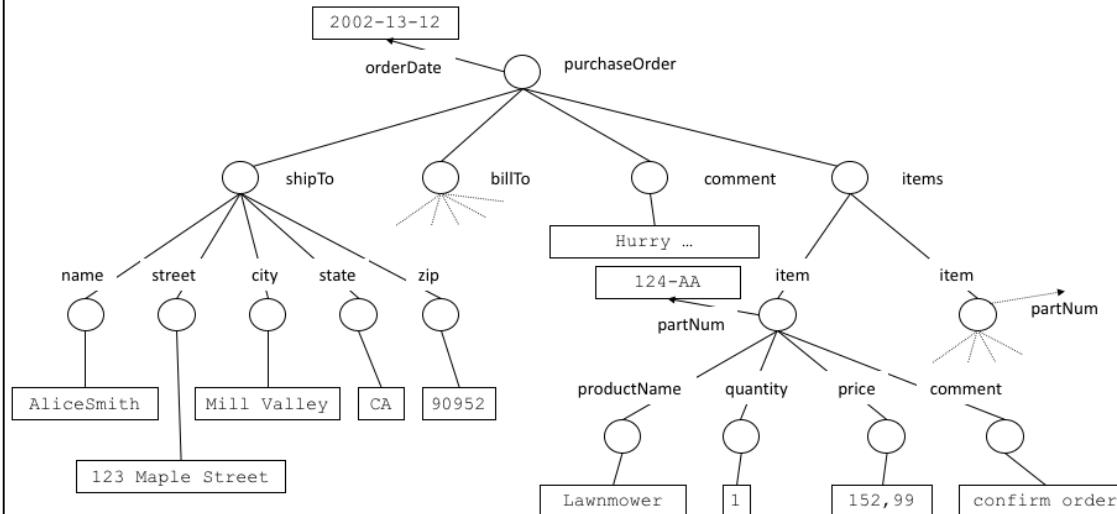
```
<items>
  <item partNum="872-AA">
    <productName>Lawnmower
    </productName>
    <quantity>1</quantity>
    <price>148.95</price>
    <comment>Confirm this is electric
    </comment>
  </item>
  <item partNum="926-AA">
    <productName>BabyMonitor
    </productName>
    <quantity>1</quantity>
    <price>39.98</price>
    <shipDate>1999-05-21</shipDate>
  </item>
</items>
</purchaseOrder>
```

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Originally XML has been conceived as a document model. In this example of an XML document we can clearly see the document nature of XML. An XML document consists of hierarchically nested tags which enclose textual content.

# XML- a Semi-structured Data Model



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However, the same XML document can also be viewed as structured data. An XML parser would typically generate a hierarchical data structure as illustrated. This explains why we can understand XML also as a data model, more precisely a **semi-structure data model, as it embeds schema information into the data.**

## semi structure vs structure

### structure

- data which can be stored in database SQL in table with rows and columns

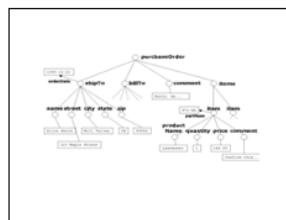
### semi structure

- doesn't reside in a relational database but that does have some organizational properties that make it easier to analyze.

# Data and Documents

## Serialization

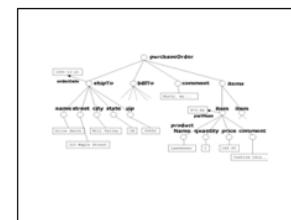
Document = medium for exchange of information



Information system 1



Communication



Information system 2

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The duality of XML, being a document model and a data model at the same time makes it particularly suitable for applications that have to exchange data over communication networks. For every data collection or database that is represented in XML there exists a canonical encoding into a text (document). The encoding is called serialization. Since documents are sequences of symbols they can be naturally exchanged over communication networks.

XML is both  
- document model  
- data model  
- easy to convert

# Schema-less data

## Benefits of schema-less data

### Increased flexibility

- e.g. dynamically adding or dropping structural elements such as attributes

### Self-contained data

- e.g. context (schema information) directly encoded into data (markup)

## Drawbacks

### Loss of consistency

### Certain optimizations not feasible

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Semi-structured data can be schema-less. This has significant advantages for applications that do not know the structural elements in advance. For example, often it is helpful if new types of attributes can be added in a database as application requirements evolve. Another advantage is that by embedding schema information into the data, data can be interpreted without requiring additional context information in the form of database schemas. This can be useful in applications where data is exchanged, as illustrated before for the case of XML.

Having no schema has however also its drawbacks as, the additional flexibility also my be at the detriment of data consistency. Applications might, for example, not be able to properly process attributes that have been arbitrarily added. Also many optimizations that rely on the availability of a schema, and on the assumption that the schema is stable, can not be applied.

### Schema-less data

- data that does not need a pre-defined format
- data that has schema embedded
- flexible

## Semi-structured data ...

- A. is always schema-less
- B. always embeds schema information into the data
- C. must always be hierarchically structured
- D. can never be indexed

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## Why is XML a document model?

- A. It supports application-specific markup application specific markup without a schema cannot be converted from document to graph
- B. It supports domain-specific schemas has nothing to do with a document model
- C. It has a serialized representation
- D. It uses HTML tags has nothing to do with a document model

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## **2. SEMANTIC WEB**

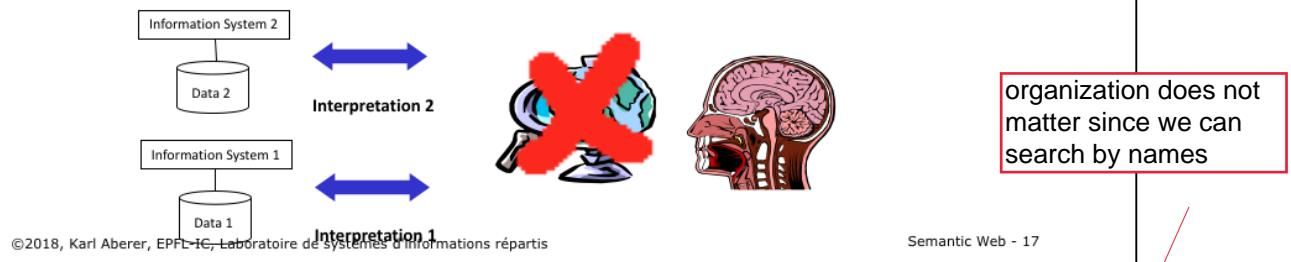
# The Semantic Web

User-defined markup (schemas): provides possibility to share interpretation of data across various applications

Different databases – Different schemas

- SwissProt: Find <Species> leech </Species>
- EMBLChange: Find <Organism> leech </Organism>

Problem: Semantic Heterogeneity → Semantic Web



XML provides a framework to encode data on the Web in a standardized fashion, to deal with irregular Web data structures and to exchange Web data among information systems. Thus it contributes in particular to overcoming **syntactic heterogeneity** on the Web.

The markup used in XML can be interpreted by applications. This enables automatic processing of Web data. However, for properly interpreting the markup, semantic heterogeneity needs to be overcome as well. The same concepts can (and will be) represented in different application contexts differently, e.g., by using different terms to denote the same meaning. This is a major obstacle to enable interoperability on the Web and indeed in industry this is considered as one of the major problems in the use of information technology.

Cost of semantic integration in 2010: 1 Trillion\$ / year (Mike Brodie, GTE)

- XML helps overcome syntactic heterogeneity
- XML still does overcome semantic heterogeneity

## The Vision of W3C: Semantic Web

The *Semantic Web* is an extension of the current Web in which *information is given well-defined meaning*, better enabling computers and people to work in cooperation. The mix of content on the Web has been shifting from exclusively human-oriented content to more and more data content. The Semantic Web brings to the Web the idea of having data defined and linked in a way that it can be used for more effective *discovery, automation, integration, and reuse across various applications*. For the Web to reach its full potential, it must evolve into a Semantic Web, providing a universally accessible platform that allows data to be shared and processed by automated tools as well as by people. The Semantic Web is an initiative of the World Wide Web Consortium (W3C), with the goal of extending the current Web to facilitate Web automation, universally accessible content, and the 'Web of Trust'.  
(<http://www.w3.org/2001/sw/Activity>)

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In order to address the problem of semantic interoperability and thus enable automated processing of Web data, the W3C initiated the “Semantic Web” initiative. The Semantic Web is a framework that builds on Web technology, including the XML framework and extends it with technologies that facilitate semantic interoperability.

# Three Ways to Overcome Semantic Heterogeneity

## 1. Standardization: agree on common user-defined markup (schemas)

- great if no pre-existing applications
- great if power player enforces it

## 2. Translation: create mappings among different schemas and databases

- requires human interpretation and reasoning
- mappings can be difficult, expensive to establish

## 3. Annotation: create relationships to agreed upon conceptualizations

- requires human interpretation and reasoning
- annotation can be difficult, expensive to establish
- reasoning over the conceptualization can provide added value

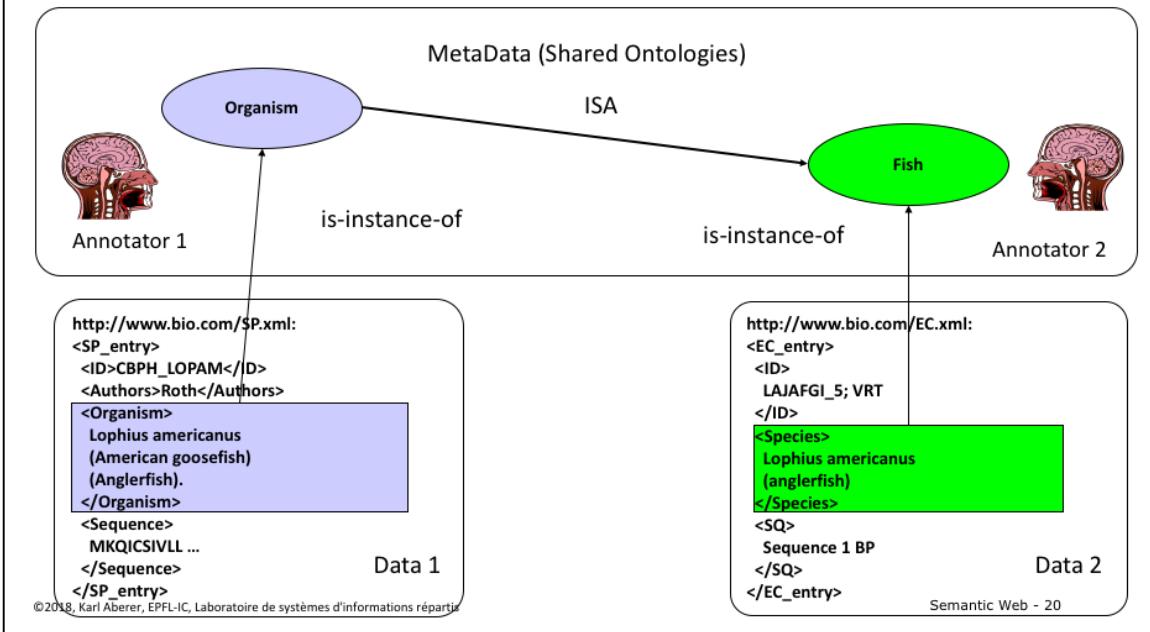
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There exist three basic approaches to tackle the problem of automating semantic processing of the data on the Web:

1. Standardization avoids the problem of semantic heterogeneity *a priori*. This approach is used when there exists already (historically) a wide agreement on the structure of relevant data and their interpretation. For example, terminology in the financial industry is largely standardized, and therefore it is not a major problem to come up with agreed upon formal specifications of such terminology and corresponding schemas to represent the data. This is even more the case as there exist in this type of business environment typically strong players that can enforce the standards.
2. Translation or mapping between different schemas and databases is the second possibility to establish semantic interoperability. This is the approach that has been extensively studied for data integration problems in relatively small and controlled domains, such as inside businesses and organizations. The requirements in these domains are typically changing not too quickly, thus much effort can be invested into developing the necessary mappings in order to properly map data from one representation into another, or to map data from multiple representations into one common global representation.
3. The third possibility is slightly different from the second: instead of engineering mappings between heterogeneous schemas for each integration problem, one first agrees on a common conceptualization of the domain, covering relevant aspects for a large class of applications. This conceptualization is normally called an **ontology** and is supposed to be **application independent**. Since ontologies have a formal representation they are machine-processable. Once such an ontology is in place existing information sources can relate their structural elements for expressing certain concepts (e.g. element names) to concepts from the ontology. This then (ideally) enables other applications to properly interpret the contents of the information system. In addition, ontologies in the general case should include reasoning capabilities, which would permit to use not only hard-coded, or pre-canned knowledge (e.g. in form of explicitly relating concepts from an information system to the ontology), but also to derive new knowledge from combining existing knowledge in different ways such that new implied relations can be derived that have not been explicitly provided.

# Annotation



This differentiation among different approaches to semantic interoperability can be nowadays found in standardization documents: according to ISO 14258 (Concepts and rules for enterprise models), there are three basic ways to relate entities together:

**Integrated approach.** There exists a common format for all models. This format must be as detailed as the models themselves. The common format is not necessarily a standard but must be agreed upon by all parties in order to elaborate models and build systems. (-> **Standardization**)

**Federated approach.** There is no common format. In order to establish interoperability parties must accommodate on the fly. Federated approach implies that no partner imposes their models, languages and methods of work. This means they must share a common ontology. (-> **Translation**)

**Unified approach.**-There exists a common format but only at a meta-level. This meta-model is not an executable entity as in the case of the integrated approach but provides a way for semantic equivalence to allow mapping between models. (-> **Annotation**)

This simple example illustrates of how ontologies might help to increase semantic interoperability and how new knowledge may be generated by reasoning. Take our earlier example of biological databases. These typically use different schemas to model related facts. For example, Database 1 uses the term *Organism* to denote an organism, and database 2 uses the term *Species* to do the same. Two annotators, who share the same ontology, now inspect the document and each of them associates the elements with terms taken from the ontology. So Annotator 1 decides that the element *Organism* corresponds to information related to an organism, whereas annotator 2 recognizes actually from the content that the element is related to information about a fish and annotates correspondingly (by establishing a *is-instance-of* relationship). At this point, the fact that both annotators used the same ontology and that reasoning is possible in this ontology comes into play. Since in the ontology a *Fish* is a subconcept of *Organism* (a fact represented formally by a *ISA* relationship in the ontology) an automated processing tool (e.g. for searching for information) might exploit this relationship and correctly identify for a request for information on *Organisms* in both databases the related elements.

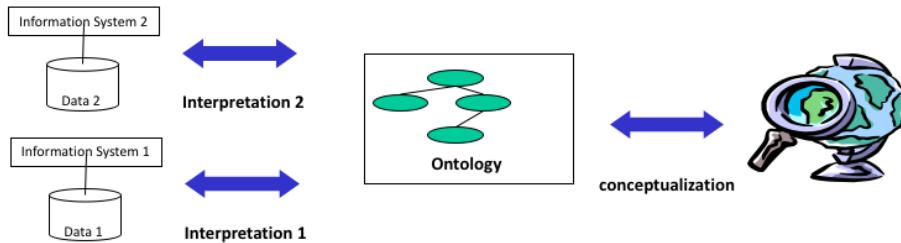
# Ontologies

Ontologies are an explicit specification of a conceptualization of the real world (Gruber, 1993)

Ideally

- different information systems agree on the same ontology
- relate their model/schema/data elements to the ontology
- mapping can be constructed via the ontology

Requires agreement on the conceptualization of the real world!



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Thus ontologies provide a “proxy representation” for the real world, to which the interpretation of data in information systems refers to and thus provide an interpretation of the data in an information system that can be automatically processed. In order to realize this vision a number of technical challenges need to be addressed.

# Creating Ontologies

Different approaches to create ontologies

1. Ontology engineering
  - Manual effort
  - Tools for editing and checking consistency
2. Automatic induction of ontologies
  - From large document collections or existing structured resources

Ontologies need to be built: this requires an agreement on the meaning of terms (symbols). In practice, there exists no other way to establish such an agreement than by extensively collecting knowledge (from humans) and represent it within a formal specification. This has been done in practice and as a result there exist extensive ontologies, some of them have been built up over many years. In the recent years, also approaches to construct ontologies automatically from existing data sources, either knowledge bases or large document collections, have been developed.

. manually create  
- learn from collection

# Modeling and Encoding of Ontologies

## Issues

- Modeling primitives and their semantics: what does an arrow mean?  
what does "instance-of" mean? what does ISA mean?
- Standardized encodings of the model
  - Into document language (XML, HTML)
  - Enriching document content with semantic markup

Ontologies need to be represented in a language or data model: in order to store the ontology a representation mechanism (a model) is needed, and the model needs to be encoded into data. The choice of the model is an important issue, since it should be very expressive (as a wide variety of aspects of the real world need to be modeled) and easy to use (as ontologies should be used in a wide range of applications) at the same time. The encoding is equally important, as it should be done in a standardized form. If this were not the case we would immediately lose the advantage of having a common conceptualization of the world at the abstract level, since we were not able to exchange it properly with others.

ontologies need to be  
- expressive  
- easy to use  
- done in a standardized form

language vs data model  
- language model: XML  
- data model: relational table

what does encoding here mean  
- read slide above. its a method to encode the ontology into eg. XML

# Model Requirements for Ontologies

	HTML	XML	RDF	OWL
Simplicity	+	+	+	+
Exchangeability	+	+	+	+
Non-intrusive annotation	+	-	+	+
Domain-specific vocabularies	-	+	+	+
Modeling primitives	-	-	+	+
Reasoning capabilities	-	-	-	+

"separate  
structure from  
presentation"

"separate  
interpretation from  
structure"

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With respect to modeling and encoding of ontologies for the Semantic Web, there exist a number of requirements, some of which follow from what we have discussed earlier:

1. **Simplicity:** the success of the Web was always founded on the principle of simplicity of concepts to encourage wide-spread use. Therefore complex models will not be successful. This is an important criterion, since some of the existing ontologies (one example is Cyc) are expressed in fairly complex knowledge representation models.
2. **Exchangeability:** Since the web is a communication environment, any kind of data that is processed must be easily exchangeable. This is what motivated the use of XML as a data representation format in the first place and should hold for metadata and ontology data as well.
3. **Non-intrusive annotation:** as the example on annotation we gave earlier demonstrated, machine-processable knowledge required for the interpretation of data will be associated with the data typically a-posteriori. Also there does not always exists a unique interpretation for the same data. Therefore any attempt to encode the knowledge required for interpretation directly into the data is not practical. This excludes, for example, the approach to use XML elements for annotation.
4. **Domain-specific vocabularies:** the model must provide a mechanism that permits to introduce vocabulary or terminology that is specific to a domain, in other words the possibility to specify schemas for different domains.
5. **Modeling primitives:** since an ontology model will be used in many different, and potentially very complex contexts (applications) they have to offer a sufficiently rich set of possibilities to model complex situations (e.g. complex structures or complex relationships). There exists a rich experience in modeling (e.g. from data modeling in databases, e.g. the entity-relationship model) and models for ontologies can draw from them.
6. **Reasoning Capabilities:** the example we discussed earlier already illustrates that even simple forms of reasoning within the ontology layer can make the interpretation of the data much more powerful (and thus the processing in the Semantic Web).

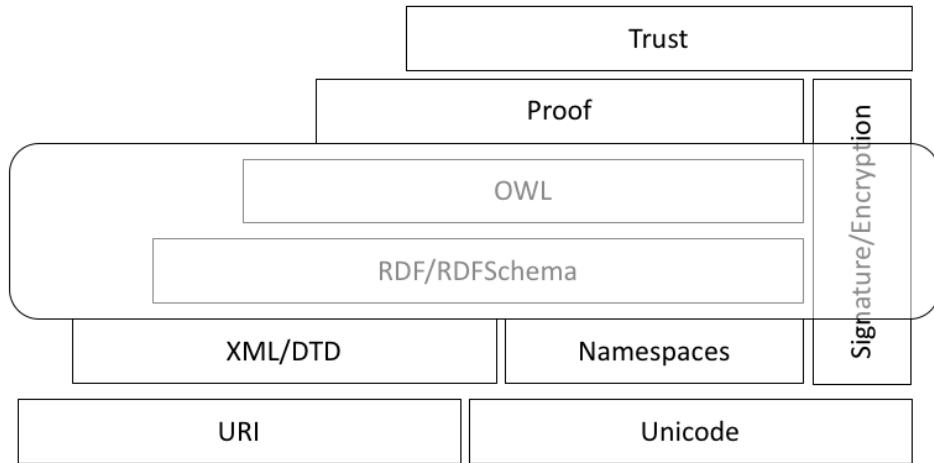
In this table we evaluate HTML, XML, RDF and OWL with respect to each of these aspects. RDF is the Resource Description Framework and is the first WWW standard proposed for the Semantic Web. OWL is the ontology interchange language, an extension of RDF proposed to enrich it with more reasoning capabilities and providing a well-defined semantics. We will introduce both models subsequently.

An interesting interpretation of the role of ontologies in the Web architecture is the following: ontology models support automated processing of semantics on the Web, and thus separate semantic concerns from the concern of structuring data; This is similar to the step from HTML to XML, were the issues of structuring data where separated from the issues related to the presentation (layout) of data. With the Semantic Web thus an attempt is made to separate meaning from structure.

should not encode any knowledge required to interpret the data

must be flexible enough to be used in many applications

## W3C Web architecture



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The Semantic Web standards RDF and OWL are positioned in the Semantic Web architecture in top of the syntactic layer.

# An ontology ...

- A. helps to separate layout issues from the structural representation of data

layout issues are always separated from structural representation. think of layout as a **drawing** and structural representation as the code / XML
- B. provides a common syntactic framework to represent standardized domain models

ontology is about semantic interoperability
- C. can be used as an annotation framework for integrating semantically heterogeneous databases

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## **3. RDF RESOURCE DESCRIPTION FRAMEWORK**

# RDF Resource Description Framework

## RDF (Instances)

- Statements about Resources (addressable by an URI) and literals (XML data)
- Statements are of the form: subject property object
- Like simple natural language sentences
- RDF statements are themselves resources (reasoning about RDF)
- Properties define relationships to other resources or atomic values

## RDF-Schema

- Data model to specify schemas for RDF instances
- Which properties are applicable for which objects with which subjects
- Defines "grammar" and "vocabulary" for semantic domains (ontology language)

## Relation RDF vs. RDFS comparable to well-formed vs. valid XML

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RDF is a standard supported by the W3C (<http://www.w3.org/RDF/>) to represent metadata. It is a fairly simple, graph-oriented data model to annotate any kind of XML document.

RDF consists of two parts: a language for representing metadata instances (RDF), which allows to annotate Web resources with statements. The Web resources are addressed by Universal Resource Identifiers (URI), of which URL's are the most important example. Thus any Web document or part of it can be annotated. The second part of the RDF standard is a language for specifying schemas for RDF Instances. This language enables specification of the vocabulary and grammar that is used for forming statements for annotation. Since RDF statements can be created also without using RDF schemas, RDF is a semi-structured data model, similar as with well-formed XML (instances) and XML-DTD (schemas).

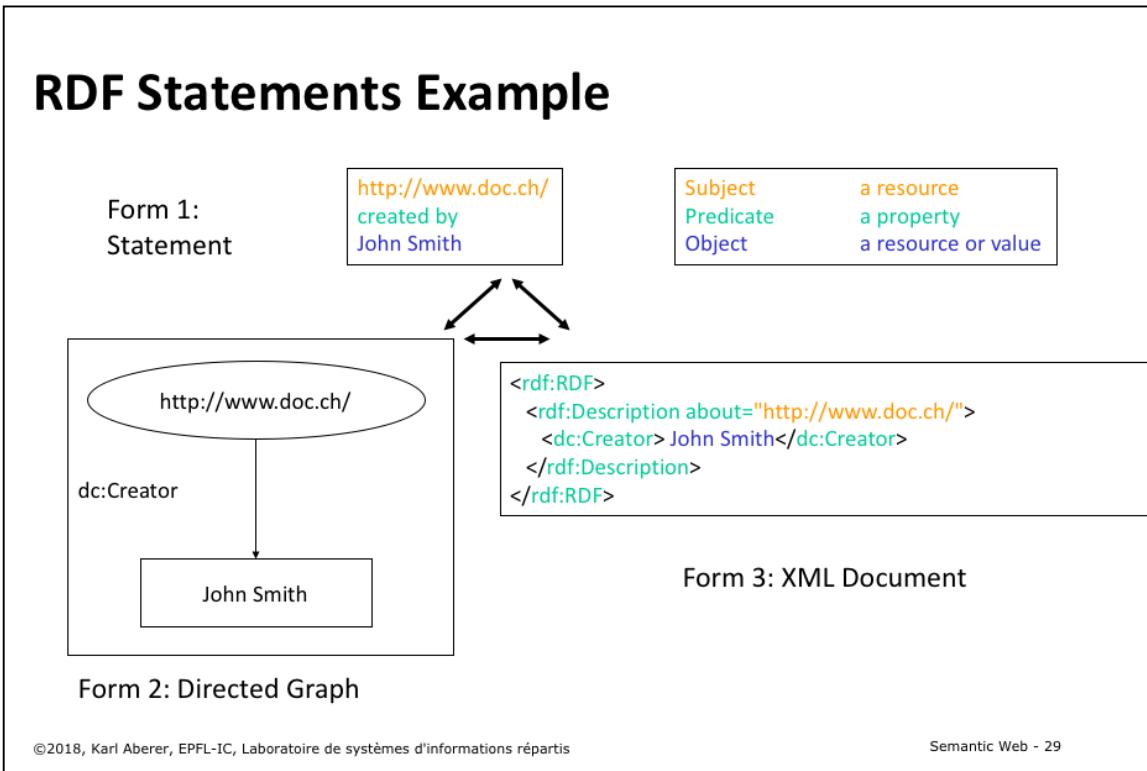
The RDF model is similar to the entity-relationship (ER) model. Entities correspond to resources and relationships correspond to properties. The main difference is that RDF requires that relationships are directed, and have a specific semantics: the resource from which the (directed) relationship emerges is assigned a property with the value to which the relationship points. This reflects the intention to use RDF to associate metadata (the value) with data (the source of the relationship). Sample RDF applications include PICS (annotating documents with information on the suitability of the content for certain groups, e.g. like the movie rating system) and Dublin Core (annotating documents with basic bibliographic information).

It is important to know that the syntax of RDF and its encoding into XML is well-specified, but that the semantics of RDF is only specified in a « semi-formal » manner. This introduces certain

Entities = Resources  
Relationships = Properties

ambiguities for applications interpreting RDF statements.

## RDF Statements Example



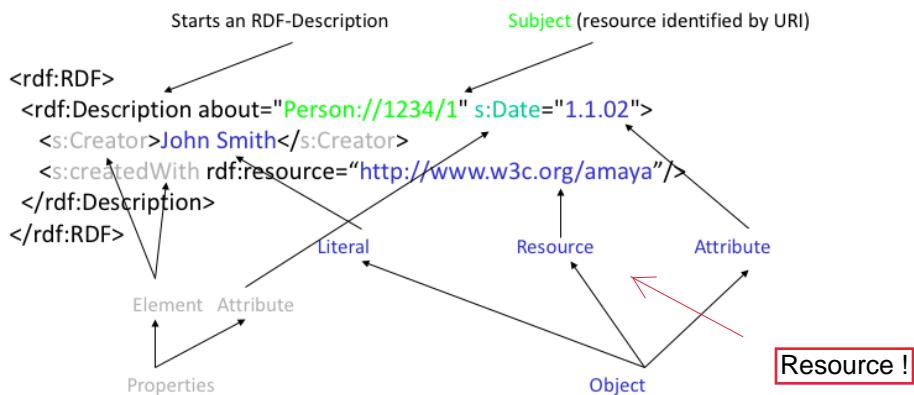
The basic constituent of RDF is an RDF statement. We can view RDF statements in three different ways: we can view them like natural language sentences, where the subject is a URI (uniform resource identifier) and the object can be either a URI or a String; we can view them as directed graphs, where the subject and object are represented as nodes (an ellipsis is used to represent resources (identified by a URI) and rectangles to represent literals (atomic XML values) and the predicate is represented as directed link , or we can view them as XML documents where the RDF statement is encoded into XML format. The graph representation is in particular suitable for visual presentation and reasoning, whereas the XML representation is used for exchange and storage.

- The subject of an RDF statement is either a uniform resource identifier (URI) or a blank node, both of which denote resources. Resources indicated by blank nodes are called anonymous resources.

# RDF Syntax

Many syntactic varieties possible

Basic form



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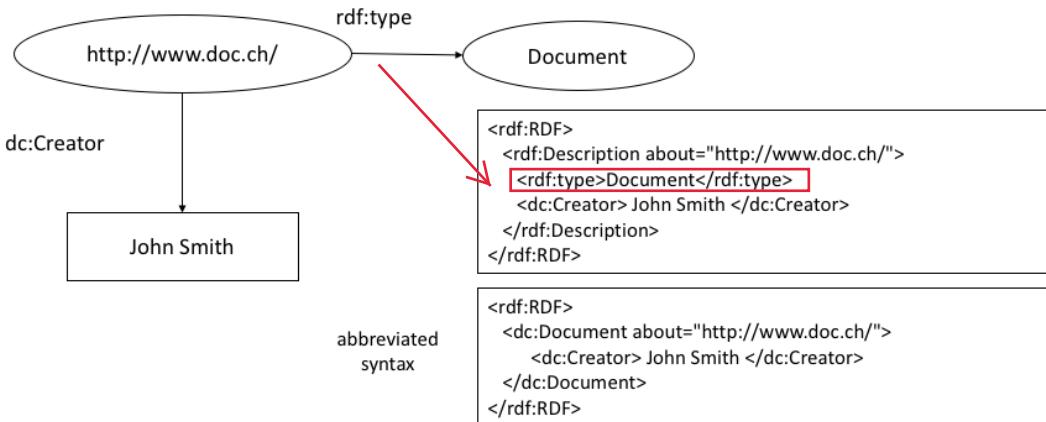
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For encoding RDF into XML there exist many syntactic variations, which can make the understanding of RDF documents sometimes rather difficult. Here we summarize the most important variants. The basic pattern of encoding is as follows: the subject is represented by an XML element called **rdf:Description**. This element is the root of the document fragment representing the RDF statement. In the content of this element one finds one (or more) predicates, represented by XML elements, e.g. **s:Creator**. The content of this XML element in turn represents the object of the RDF statement. If the object is not a literal, one can alternatively represent the object as an attribute of the predicate element. Also, both the predicate and the object can be encoded into the element representing the statement, as it is shown for **s:Date** predicate.

- subject must have **rdf:Description**
- predicate: **<s:Creator>**
- object: John Smith

# Typing Resources

Resources can be associated with a type by using **rdf:type** (a special property)



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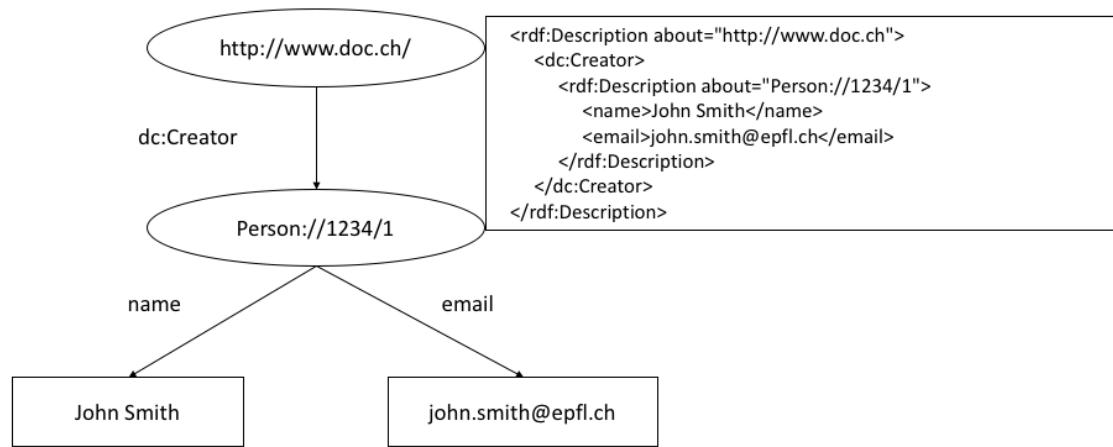
Semantic Web - 31

RDF allows us to categorize resources into different classes (typing). For that purpose one associates with the resource that should be categorized another resource, that represents the category, using a special RDF property `rdf:type`. We will see later, when introducing RDF schema, what are possible uses of typing. With respect to encoding, the type property can either be represented explicitly like any other property, or one can use a special abbreviated syntax, where the name of the type becomes the element name of the element representing the statement.

two ways to encode the type property

## RDF Complex Values

Use an intermediate resource



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Semantic Web - 32

Associating a subject with a property whose value is a simple object is just the simplest form of a statement. In general, the value of a property (the object of the statement) may be a complex statement itself (in data type parlance “of a complex type”). In order to represent such complex object values a new intermediate resource is created (in the example Person://1234/1) to which different properties are associated. Note that this is different of directly associating these properties with the subject of the overall statement (http://www.doc.ch/ in the example) (why?).

In the XML encoding such a complex object value can be represented by directly inlining the complex object into the content of the statement.



- previously we associate 1 object to 1 subject.
- now we want to associate a "statement / complex object" to a subject

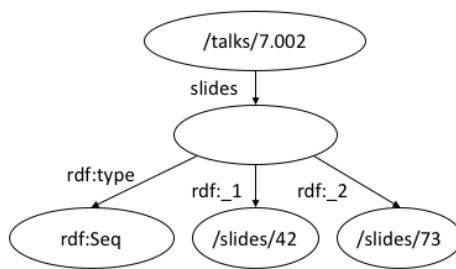
## RDF Containers

### Containers

- Bag (unordered)
- Seq (ordered)
- Alt (alternatives)

### Quantifiers

- about: John is author of the talk (consisting of many slides)
- aboutEach: John is author of each slide of the talk



```

<rdf:RDF>
  <rdf:Description about="/talks/7.002">
    <s:slides>
      <rdf:Seq>
        <rdf:_1 resource="/slides/42"/>
        <rdf:_2 resource="/slides/73"/>
      </rdf:Seq>
    </s:slides>
  </rdf:Description>
</rdf:RDF>
  
```

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Statements can be made not only using single resources, but as well using collections of resources. For that purpose RDF provides the container concept. Containers are special resources of one of three container types that are specified in the RDF standard. A container resource is then associated with a set of other resources. By creating a statement using the container object as "object", one can express statements made about the set of objects. More precisely, one can specify whether the statement is a statement of the set of objects "as a whole" or a statement that applies to each element of the set individually (what the consequences of this distinction are is not further specified in RDF, this is an example where the semantics of RDF is not clearly specified).

There exist three different types of containers: bags which are unordered multi-sets (= sets with multiple occurrences of the same resources), sequences which are ordered sets (i.e. lists) of resources and alternatives which is a single resource that is to be chosen out of a given set. The property labels can be used to impose an order on the elements of the set, by using labels `_1`,

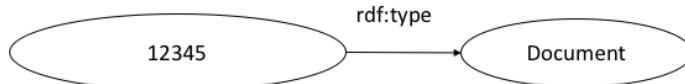
- previously we associate 1 object to 1 subject.
- now we want to associate a "statement / complex object" to a subject

`_2` etc. If the order is irrelevant one can use the alternative syntax `rdf:li` instead of `rdf:_1`, `rdf:_2` etc.

- Originally it was <Description rdf:about>
- With rdf:ID it now becomes <Description rdf:ID>
- And with typing resource <Document rdf:ID>

## Creating New Resources

New RDF resources are created by using **rdf:ID** (a special property)



dc>Title

Harry Potter

```

<rdf:RDF>
  <rdf:Description rdf:about="#12345">
    <rdf:type>Document</rdf:type>
    <dc:Title>Harry Potter</dc:Title>
  </rdf:Description>
</rdf:RDF>
  
```

Alternative syntax

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```

<rdf:RDF>
  <rdf:Description rdf:id="12345">
    <rdf:type>Document</rdf:type>
    <dc:Title>Harry Potter</dc:Title>
  </rdf:Description>
</rdf:RDF>
  
```

```

<rdf:RDF>
  <dc:Document rdf:id="12345">
    <dc:Title>Harry Potter</dc:Title>
  </dc:Document>
</rdf:RDF>
  
```

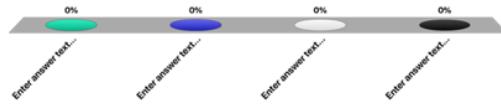
Abbreviated syntax

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RDF resources need not necessarily be pre-existing Web resources identified by URIs, but can also be instantiated within RDF statements, i.e., *new resources* can be defined as part of RDF statements. A resource is in general anything that can be *identified* on the Web. As a consequence also a new resource requires foremost an identifier. For this purpose RDF provides the rdf:ID attribute to introduce the identifier of the resource. This attribute replaces rdf:about attribute when the statement is about a new resource instead about an existing resource. Using the identifier, this new resource can then be referred to in other RDF statements.

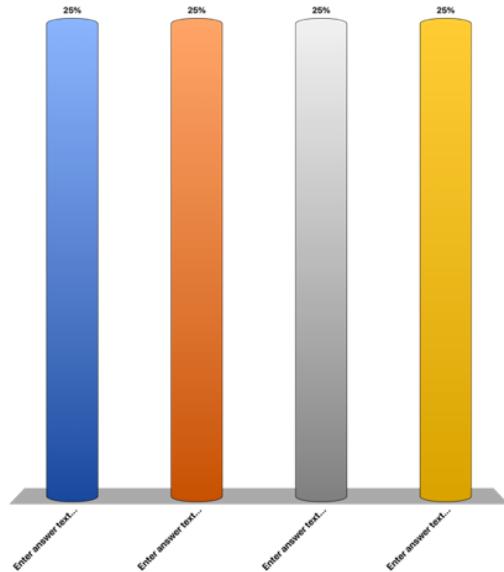
A basic statement in RDF would be expressed in the relational data model by a table ...

- A. with one attribute
- B. with two attributes
- C. with three attributes
- D. cannot be expressed in the relational data model



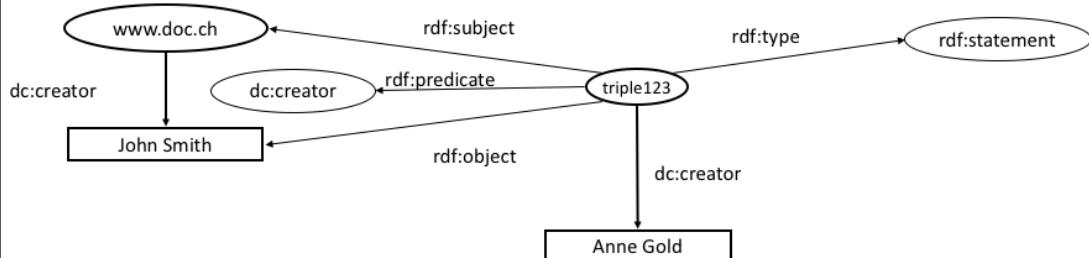
The type statement in RDF would be expressed in the relational data model by a table ...

- A. with one attribute
- B. with two attributes
- C. with three attributes
- D. cannot be expressed in the relational data model



# RDF Reification

Statements on RDF statements (commenting, disputing, ...)



anne gold created the statement in the orange box

Anne Gold created the statement

John Smith created <http://www.doc.ch/>

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Semantic Web - 37

In RDF everything is a resource. In particular, RDF statements are considered as resources and therefore it should be possible to make statements about them. From the viewpoint of the Semantic Web this is in fact extremely important. Since annotations do not express absolute truth but rather different interpretations of data, it is important to foresee the possibility of annotating annotations (such as illustrated in the simple example). This allows to comment on annotations, to agree or dispute them etc..

When considering the graph representation of RDF, it is not immediately clear of how to treat a statement as a resource, since a statement consists of three structural elements, the subject, the object, and the predicate. But we can apply the same "trick" as we did already for complex objects and collections. We introduce a new resource which serves as representative for the statement. This resource obtains as properties all the constituents that make up the statement it represents. This process is called **reification**. It is straightforward to connect the resource representing the statement it to its subject and object, as they are both resources themselves. Also the type of the object can be determined through a property `rdf:type` pointing to the special resource `rdf:statement` representing the category of statements. For the predicate a specific new resource representing the predicate is required. We will see later, when introducing RDF schema, that this new resource is indeed part of a schema for RDF statements, expressing that statements using this properties are possible in the given context. The reified RDF statement is connected to its constituents through the special RDF properties `rdf:object`, `rdf:subject` and `rdf:property`. By reifying a statement one creates a new resource, which can be anonymous, if no identifier is associated with it using `rdf:ID`, or can be referenced if it has such an identifier.

## RDF Reification - Syntax

The statement has an anonymous resource as subject, namely the reified statement which is fully characterized by its properties!

```
<rdf:RDF>
  <rdf:Description about="#triple123">
    <rdf:subject resource="http://www.doc.ch"/>
    <rdf:predicate resource="http://description.org/schema#Creator"/>
    <rdf:object>John Smith</rdf:object>
    <rdf:type resource="http://www.w3.org/TR/WD-rdf-syntax#Statement"/>
    <dc:Creator>Anne Gold</dc:Creator>
  </rdf:Description>
</rdf:RDF>
```

The XML encoding of reified statements follows the principles that have been introduced before. The reified statement is represented as a complex, anonymous object.

- anonymous object has no URI
- complex object has multiple values

- can be done with 5 lines instead if we dont encapsulate

## Which is true?

- A. Reification is used to produce a more compact representation of complex RDF statements
- B. Reification is needed to make a statement the subject of another statement
  - make a statement the OBJECT of another statement
- C. Reified statements always make a statement about another statement

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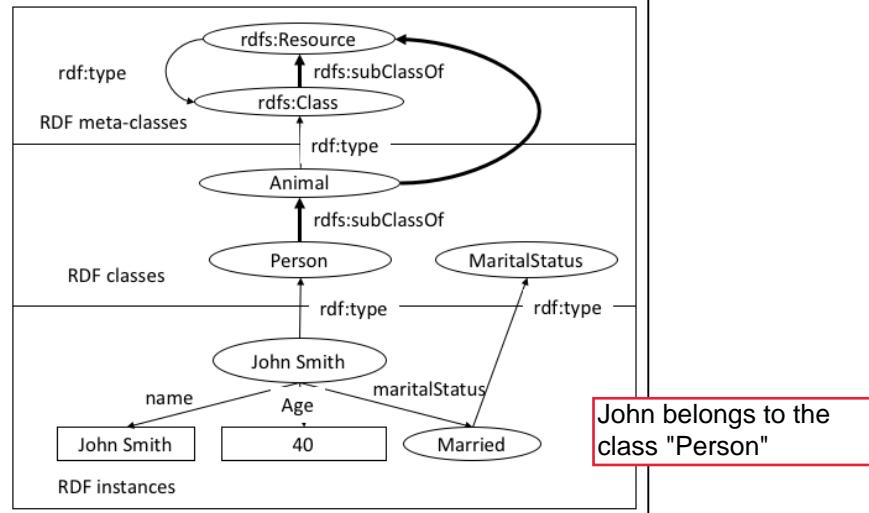
# RDF Schema - Classification

## RDF resources

- anything that can be described

## RDF classes

- Categories for subjects and objects
- Classes allow to associate a type with an RDF instance
- Different classes can be in a subClass relationship (be included in each other)
- Classes are themselves RDF instances



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We now introduce RDF Schema. RDF Schema provides two basic mechanisms.

1. Categorization RDF resources, into *classes*.
2. Constraints on the possible use of properties, in the form of constraints expressing which classes can participate as subjects and objects in statements using a specific property.

First we describe the classification mechanism. Classes are represented themselves as resources, which are of type `rdfs:Class`, a special class in the RDFS specification. The type property `rdf:type` is used (as in RDF) to indicate the type of a *class resource*. If an application resource is of a specific type then the resource is connected to the corresponding class resource via the `rdf:type` property. In the illustration two examples of this are included: the resource with ID „John Smith“ belongs to the class (or is of type) `Person` and the resource „Married“ is of type `MaritalStatus` (which is a resource representing a specific predicate type). Between different classes a subclass relationship can be specified, by using the attribute `rdfs:subClassOf`. The intended semantics is that any resource belonging to the subclass also belongs to the superclass (containment relationship).

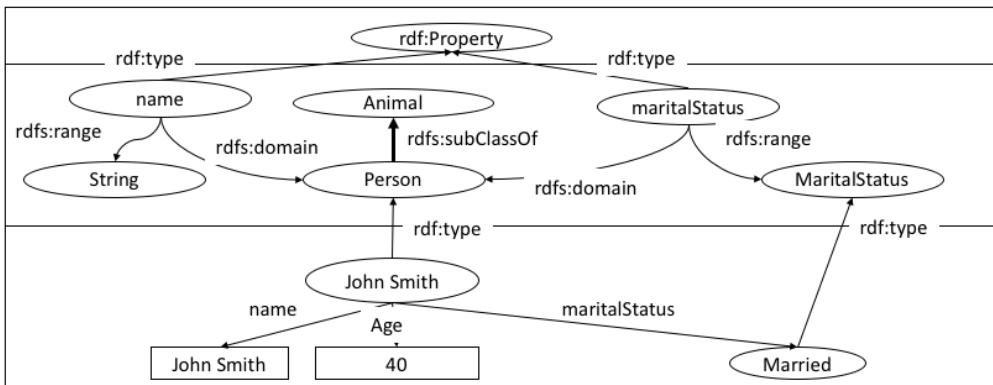
An interesting aspect of RDFS is the modeling of the RDF and RDFS concepts within RDFS itself. This is done by introducing a meta-class level that models the modeling constructs and reflects the paradigm that in RDF everything is a resource, including the concepts introduced by RDF and RDFS. In particular classes are sets of resources, and thus the `rdfs:Class` resource is a subclass of `rdfs:Resource`. Application classes, such as „Animal“, are sets of resources, and thus also subclass of `rdfs:Resource`. On the other hand, the type of a resource is indicated by the `rdf:type` property. Since `rdfs:Resource` is a class it is connected via the `rdf:type` property to the `rdfs:Class` resource. This produces the cyclic structure that we can observe within the RDF meta-class schema (in fact in the figure only a small fragment of the RDFS meta-class schema is shown).

- basically  
`rdf:type` always  
points to a  
class ?

# RDF Schema - Properties

RDF properties: connect resources

- The RDF instance must have the properties that are declared for the class
- rdfs:domain: classes of which the instances may have a property
- rdfs:range: classes of which the instances may be the value of a property



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The second important concept of RDFS is the possibility to constrain the usage of RDF properties that connect resources. As everything in RDF, RDF properties are resources themselves. Thus, they are represented in an RDF schema as resources. For example `maritalStatus` is a resource representing a property. In RDF schema it is now possible to constrain the usage of properties as follows: by connecting the property resource through the property `rdfs:domain` to a class resource, one specifies that the subject when using this property must originate from that class, i.e., be of the type of this class. Similarly for the object, the range can be constrained using `rdfs:range`. Ranges can also be of atomic type, in that case one connects the property resource to (predefined) resources representing the data type of the atomic type. In the example above this is the atomic type `STRING`.

- arrow is the property  
- set arrow to be of type rdfs:domain to constrain

- set type of object through the rdfs:range

The RDFS model bears a lot of similarity with object-oriented models (or type specifications in the context of OO programming languages). However a fundamental difference is that properties (attributes in OO terminology) are defined independently of

maritalStatus -- rdfs:domain ---> Person  
- Object using type maritalStatus must be of type Person

maritalStatus -- rdfs:Range ---> MaritalStatus  
- the object maritalStatus points to must be of type MaritalStatus

classes.

## RDF Schema - Syntax

```
<rdf:RDF xml:lang="en"
          xmlns:rdf="http://www.w3.org/1999/02/22-rdf-syntax-ns#"
          xmlns:rdfs="http://www.w3.org/2000/01/rdf-schema#">
<rdfs:Class rdf:ID="Person">
  <rdfs:subClassOf rdf:resource="http://www.w3.org/classes#Animal"/>
</rdfs:Class>
<rdf:Property ID="maritalStatus">
  <rdfs:range rdf:resource="#MaritalStatus"/>
  <rdfs:domain rdf:resource="#Person"/>
</rdf:Property>
<rdf:Property ID="name">
  <rdfs:range rdf:resource="http://www.w3.org/classes#String"/>
  <rdfs:domain rdf:resource="#Person"/>
</rdf:Property>
<rdf:Property ID="age">
  <rdfs:range rdf:resource="http://www.w3.org/classes#Integer"/>
  <rdfs:domain rdf:resource="#Person"/>
</rdf:Property>
<rdfs:Class rdf:ID="MaritalStatus"/>
<MaritalStatus rdf:ID="Married"/>
<MaritalStatus rdf:ID="Divorced"/>
<MaritalStatus rdf:ID="Single"/>
<MaritalStatus rdf:ID="Widowed"/>
</rdf:RDF>
```

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Since RDF schemas are expressed as RDF statements they can be encoded into XML along the same principles that we have introduced for RDF statements earlier. This example shows the complete encoding of the RDF schema we have used in our example before. Throughout the schema the abbreviated syntax for statements is used, replacing the element name "Description" by the corresponding class name of the subject of the description. Note of how using the ID attribute, in the RDF schema new resources are introduced. They can be referred to from other statements using the newly introduced identifier prefixed with #. The specification of the class with ID "MaritalStatus" includes the specification of the complete extension of the class, enumerating all possible values the members of this class can take, i.e., all possible predicate names that predicates of type MaritalStatus can take. Strictly speaking, the statements creating the instances of class are not part of the schema level but part of the instance level of RDF.

## Which of the following are part of the RDF schema language?

- A. The « type » statement for RDF resources?

- is it because type is a property not resource ?

- B. The « domain » statement for RDF properties?

- domain is a property

- C. The « subject » statement for RDF statements?

subject property object  
- subject is not part of the language  
- it is just part of the "format"

## **4. SEMANTIC WEB RESOURCES**

## **Examples of Popular Concrete Ontologies and Underlying Knowledge Bases**

WordNet

Schema.org

WikiData

Google Knowledge Graph

Linked Open Data

In the following we will show that ontologies and knowledge bases are today widely available and used.

# WordNet

English dictionary with semantic relationships

**Synonymy.** Words that have similar meanings, e.g. happy and glad.

**Antonymy.** The opposite of synonymy, e.g. happy and sad.

Nouns only

**Hypernymy.** Hierarchical relationship between words, e.g., furniture is a hypernym of chair since every chair is a piece of furniture.

**Hyponymy.** Opposite of hypernymy. Dog is a hyponym of canine since every dog is a canine.

**Meronymy.** Part-whole relationship. For example, paper is a meronym of book, since paper is a part of a book.

# WordNet Example

<http://wordnet.princeton.edu/>

The screenshot shows the WordNet Search - 3.1 interface. The search term 'information' is entered in the search bar. Below the search bar, there are display options: 'Display Options: (Select option to change) [Change]' and a key explaining 'S.' for Synset relations and 'W.' for Word relations. A note below states 'Display options for sense: (gloss) "an example sentence"'.

**Noun**

- S. (n) **information, info** (a message received and understood)
- S. (n) **information** (knowledge acquired through study or experience or instruction)
- S. (n) **information** (formal accusation of a crime)
- S. (n) **data, information** (a collection of facts from which conclusions may be drawn) "statistical data"
- S. (n) **information, selective information, entropy** ((communication theory) a numerical measure of the uncertainty of an outcome) "the signal contained thousands of bits of information"

The screenshot shows the WordNet Search - 3.1 interface with the search term 'information'. The results are displayed under the heading 'Noun'. The first result is expanded, showing its synsets and hyponyms. The expanded entry for 'information' includes:  
• S. (n) **information, info** (a message received and understood)  
◦ **direct hyponym / full hyponym**

- S. (n) **ammunition** (information that can be used to attack or defend a claim or argument or viewpoint) "his admission provided ammunition for his critics"
- S. (n) **factoid** (something resembling a fact; unverified (often invented) information that is given credibility because it appeared in print)
- S. (n) **misinformation** (information that is incorrect)
- S. (n) **material** (information (data or ideas or observations) that can be used or reworked into a finished form) "the archives provided rich material for a definitive biography"
- S. (n) **details, inside information** (true confidential information) "after the trial he gave us the real details"
- S. (n) **fact** (a statement or assertion of verified information about something that is the case or has happened) "he supported his argument with an impressive array of facts"
- S. (n) **format, formatting, data format, data formatting** (the organization of information according to preset specifications (usually for computer processing))
- S. (n) **gen** (informal term for information) "give me the gen on your new line of computers"
- S. (n) **database** (an organized body of related information)

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## Schema.org

Collaborative, community activity to create, maintain, and promote schemas for structured data on the Internet.

- Sponsoring companies: Google, Microsoft, Yahoo and Yandex
- Two type hierarchies: textual property values, things that they describe
- Core vocabulary currently consists of 642 Types, 992 Properties, and 219 Enumeration values
- Used by other knowledge bases, e.g. Google Knowledge Graph API, Dbpedia, etc.

# Example

## Core plus extension vocabularies

- [Thing](#)
  - [Action](#)
    - [AchieveAction](#)
      - [LoseAction](#)
      - [TieAction](#)
      - [WinAction](#)
    - [AssesAction](#)
      - [ChooseAction](#)
        - [VoteAction](#)
      - [IgnoreAction](#)
      - [ReactAction](#)
        - [AgreeAction](#)
        - [DisagreeAction](#)
        - [DislikeAction](#)
        - [EndorseAction](#)
        - [LikeAction](#)
        - [WantAction](#)
      - [ReviewAction](#)

## Action

Thing > Action  
An action performed by a direct agent and indirect participants upon a direct object. Optionally happens at a location with the help of an inanimate instrument. The execution of the action may produce a result. Specific action sub-type documentation specifies the exact expectation of each argument/role.

See also [Blog post](#) and [Actions overview document](#).

Usage: Between 100 and 1000 domains

[more...]

Property	Expected Type	Description
Properties from Action		
<a href="#">actionStatus</a>	ActionStatusType	Indicates the current disposition of the Action.
<a href="#">agent</a>	Organization or Person	The direct performer or driver of the action (animate or inanimate). e.g. "John" wrote a book.
<a href="#">endTime</a>	DateTime	The endTime of something. For a reserved event or service (e.g. FoodEstablishmentReservation), the time that it is expected to end. For actions that span a period of time, when the action was performed. e.g. John wrote a book from January to "December". Note that Event uses startDate/endDate instead of startTime/endTime, even when describing dates with times. This situation may be clarified in future revisions.
<a href="#">error</a>	Thing	For failed actions, more information on the cause of the failure.
<a href="#">instrument</a>	Thing	The object that helped the agent perform the action. e.g. John wrote a book with "a pen".
<a href="#">location</a>	Place or Text or PostalAddress	The location of for example where the event is happening, an organization is located, or where an action takes place.
<a href="#">object</a>	Thing	The object upon the action is carried out, whose state is kept intact or changed. Also known as the semantic roles patient, affected or undergoer (which change their state or theme which doesn't). e.g. John read "a book".
<a href="#">participant</a>	Organization or Person	Other co-agents that participated in the action indirectly. e.g. John wrote a book with "Steve".
<a href="#">result</a>	Thing	The result produced in the action. e.g. John wrote "a book".
<a href="#">startTime</a>	DateTime	The startTime of something. For a reserved event or service (e.g. FoodEstablishmentReservation), the time that it is expected to start. For actions that span a period of time, when the action was performed. e.g. John wrote a book from "January" to December. Note that Event uses startDate/endDate instead of startTime/endTime, even when describing dates with times. This situation may be clarified in future revisions.
<a href="#">target</a>	EntryPoint	Indicates a target EntryPoint for an Action.

# Encoding

Different encodings can be used, JSON, RDFa, Microdata

RDFa: microformat for embedding RDF into HTML

```
<div vocab="http://schema.org/" typeof="Person">
  <span property="name">Jane Doe</span>
  
  <span property="jobTitle">Professor</span>
  <div property="address" typeof="PostalAddress">
    <span property="streetAddress">
      20341 Whitworth Institute
      405 N. Whitworth
    </span>
    <span property="addressLocality">Seattle</span>,
    <span property="addressRegion">WA</span>
    <span property="postalCode">98052</span>
  </div>
  <span property="telephone">(425) 123-4567</span>
  <a href="mailto:jane-doe@xyz.edu" property="email">
    jane-doe@xyz.edu</a>
  Jane's home page:
  <a href="http://www.janedoe.com" property="url">janedoe.com</a>
  Graduate students:
  <a href="http://www.xyz.edu/students/alicejones.html" property="colleague">
    Alice Jones</a>
  <a href="http://www.xyz.edu/students/bobsmith.html" property="colleague">
    Bob Smith</a>
</div>
```

## WikiData

Community project to create an open database of structured data

- Data curation model like WikiMedia
- Intended to support Wikipedia (InfoBoxes)
- Currently 16.5+ million statements
- Multi-lingual
- Both API access and full databases dumps (JSON, RDF)

## Example WikiData

[www.wikidata.org](http://www.wikidata.org)

Barack Obama	(76)	44th President of the United States	Barack Hussein Obama II	Barack Hussein Obama I	Barry Obama	I Obama	Also known as	Wikipedia (215 entries)
+ in more languages	Cognac	Language	Label	Description				ab: Barack Obama
English	Barack Obama	44th President of the United States	Barack Hussein Obama II	Barack Hussein Obama I	Barry Obama	I Obama		ac: Barack Obama
German	Barack Obama	44. Präsident der Vereinigten Staaten	Barack Hussein Obama, Jr.	Barack Hussein Obama	Barack H. Obama	Barack Hussein Obama II		af: Barack Obama
Swiss German	Barack Obama	No description defined						ar: باراك أوباما
French	Barack Obama	44e président des États-Unis	Barack Hussein Obama	Barack Hussein Obama II	Barack Hussein Obama			av: Barack Obama
More languages								az: Barack Obama
Statements								ba: Barack Obama
instance of	Human	+ 2 references	Imported from	Belarusian Wikipedia				be: Barack Obama
stated in	datacite.n							bg: Barack Obama
retrieved		10 October 2015						bs: Barack Obama
reference URL		https://datacite.nntfrank.de/2148/cb1558	10000cf					ca: Barack Obama
sex or gender	male	+ 4 references	Imported from	Virtual International Authority File				cs: Barack Obama
stated in			Integrated Authority File					cy: Barack Obama
retrieved		9 April 2014						da: Barack Obama
stated in		Birth certificate of Barack Obama						de: Barack Obama
stated in	datacite.n		datacite.nntfrank.de/2148/cb1558	10000cf				el: Barack Obama
retrieved		10 October 2015						en: Barack Obama
reference URL		https://datacite.nntfrank.de/2148/cb1558	10000cf					es: Barack Obama
More languages								et: Barack Obama

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# Google Knowledge Graph

Google's internal knowledge base to support the search engine

- Populated from FreeBase and internal data
- Enriched with the support of schema.org
- Accessible through API



<https://www.google.com/intl/es419/insidesearch/features/search/knowledge.html>

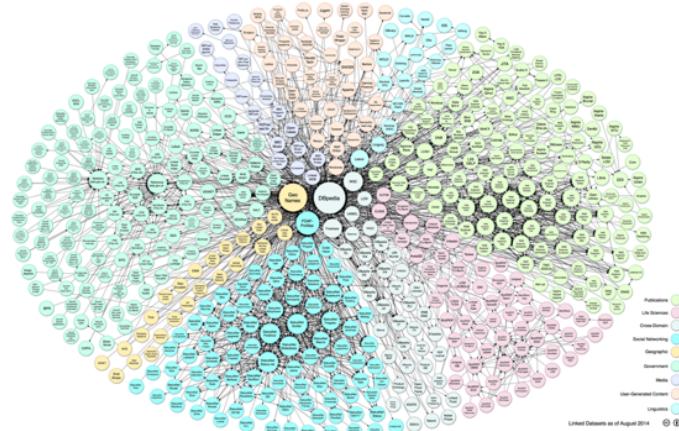
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# Linked Open Data

Repository of open data and knowledge bases and tools

<https://www.w3.org/wiki/DataSetRDFDumps>



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# Linked Open Data Example

## DataSetRDFDumps

### Linked Data Sets (i.e., with Dereferenceable URIs) available as RDF Dumps

- Please provide the URL for the directory containing the RDF dump files.
- Please try to have one directory or tarball per dump set -- such that we can retrieve and load the entire URL contents, to have a restored snapshot.
- Please include a Publisher/Maintainer URI, for use in constructing attribution triples.

Project	Date Exposed	Size of Dump and Data Set	Archive URL	Publisher / Maintainer URI
Addgene	Addgene catalog (tab delimited file)	1.1 MB	tab-delimited file	
Allen Brain Atlas	Science Commons extract from ABA Web site, on or shortly before 26 Feb 2007	51 MB	dump file	
Airport Data	SPARQL	754,585		Rob Styles
BAMS	BAMS	5.6 MB	bams-from-swanson-98-23-07.owl	
BBC John Peel sessions from DBtune.org	holding data released during Hackday, 2007	277,000 triples	peel.taz.gz	[URI?]
BBOP	All OBO ontologies	36 MB	obo-all.tgz	[URI]
BBOP	selected OBO ontologies, downloaded ~21 April 2007, augmented with inferred relations	2.6 MB	obo-in-owl.tgz	[URI]
Billion Triples Challenge Dataset 2008	various dumps	1 billion triples	download page	
Billion Triples Challenge Dataset 2009	crawled Web data	1.14 billion triples	download page	
Billion Triples Challenge Dataset 2010	crawled Web data	3.2 billion triples	download page	
Bio2RDF	various bio- and gene- related datasets	10+ billion triples	download page	
Bitzi	collaborative file describing service	330,026 discrete files, 270MB uncompressed	dump directory	
British Geological Survey (BGS) OpenGeoscience	1:625 000 Geology of the UK (DigimapGB), BGS geochronology and chronostratigraphy, BGS Lexicon of Named Rock Units	Approx 840,000 (19 MB compressed) N-Triples	data_bgs_ac_uk_ALL.zip	British Geological Survey (BGS)
Chef Moz		290344 restaurants - 104856 reviews - 59243 links to reviews - 2402 editors	size?	URL?
Data-gov Wiki	Datasets containing RDF data converted from datasets published at <a href="http://data.gov">http://data.gov</a> (and other sources). The datasets are clustered by dc:subject, e.g. government budget, environmental statistics, housing and population statistics, medical cost, energy consumption, public library statistics, and labor statistics.	5+ billion triples	dump directory	Tetherless World Constellation
DBpedia	Data set containing extracted data from Wikipedia. About 2.6 million concepts described by 247 million triples, including abstracts in 14 different languages	247 million triples	dump directory	

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Which of the following is NOT an  
(instance-level) ontology?

- A. Wordnet
- B. WikiData
- C. Schema.org
- D. Google Knowledge Graph

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# References

## Relevant articles

- Grigoris Antoniou, Frank van Harmelen, Semantic Web Primer, MIT Press, 2nd edition, 2004.
- [Jeen Broekstra](#), [Michel C. A. Klein](#), [Stefan Decker](#), Dieter Fensel, [Frank van Harmelen](#), [Ian Horrocks](#): Enabling knowledge representation on the Web by extending RDF schema. [WWW 2001](#): 467-478
- [Stefan Decker](#), [Sergey Melnik](#), [Frank van Harmelen](#), Dieter Fensel, [Michel C. A. Klein](#), [Jeen Broekstra](#), [Michael Erdmann](#), [Ian Horrocks](#): The Semantic Web: The Roles of XML and RDF. [IEEE Internet Computing](#) 4(5): 63-74 (2000)

## WebSites

- XML, XPath, Xquery, RDF: <http://www.w3.org/>
- OWL: <http://www.w3.org/TR/2004/REC-owl-features-20040210/#s1.1>