



SEMANTICS
Karlsruhe 2019

Fast Track to Knowledge Graphs and Semantic AI

How Semantic Knowledge Models and Machine
Learning Enable Semantic AI Applications



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Agenda



- ▶ **Module 1: Taxonomies and Ontologies - Theory and Practice**
 - ▶ Part 1: 09:00 - 10:30
 - Short break
 - ▶ Part 2: 11:00 - 12:30

- ▶ **Lunch Break**

- ▶ **Module 2: Knowledge graphs**
 - ▶ 13:30 - 15:30

- ▶ **Module 3: Semantic AI Applications**
 - ▶ 15:45 - 17:00

Fast Track to Knowledge Graphs and Semantic AI

Module 1: Taxonomies and Ontologies - Theory and Practice

**presented by
Heather Hedden**

About Heather Hedden

- Taxonomy consultant
 - Independent, through Hedden Information Management (since 2004)
 - Employed, through Project Performance Corporation, and contract
- Former staff taxonomist
 - At various companies: Gale/Cengage Learning, Viziant, First Wind
- Instructor of online and onsite taxonomy courses
 - Independently through Hedden Information Management
 - Previously at Simmons University - Library & Information Science School
- Author of *The Accidental Taxonomist* (2010, 2016, Information Today, Inc.)
- Former indexer of books and database content (articles, images, etc.)

Outline

1. Introduction to taxonomies and ontologies
2. Purposes and benefits
3. Types of knowledge organization systems
4. Creating concepts
5. Creating relationships
6. Taxonomy structural design: hierarchies and facets
7. Standards: SKOS, RDF, RDF Schema, and OWL
8. Creating ontologies
9. Implementation issues
10. Linked data and the Semantic Web

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Introduction

Taxonomy

- From ancient Greek "taxis," meaning **arrangement** + "nomia," meaning **method**.
- Originally meant the science and practice of naming and classifying.
- Originally in biology and then in any field.
- Aspect of "classification" is still important to the definition of taxonomies.

Ontology

- From ancient Greek "onto," meaning **being** + "logia," meaning **logical discourse**.
- Originally meant the philosophical study of being.
- In information science, the naming of concepts, categories, properties, entities, relations, etc. that make up a domain of knowledge.

Definitions are not rigid. Taxonomies may merge into ontologies.

Introduction

Taxonomies and Ontologies are types of Knowledge Organization Systems (KOS)

- Any system of terms, concepts, terminology, classification, etc. to organize and define knowledge.
- Comprises concepts, labels, relationships between them, *and* models of how information/knowledge can be managed and organized.
(specifications, policies, etc.)
- Sometimes called a “vocabulary” or “controlled vocabulary,” but is more than a simple list of terms.

KOS types:

authority files
categorization schemes
classification schemes
dictionaries
gazetteers
glossaries
ontologies
semantic networks
subject heading schemes
synonym rings
taxonomies
terminologies
thesauri

Outline

1. Introduction to taxonomies and ontologies
2. **Purposes and benefits**
3. Types of knowledge organization systems
4. Creating concepts
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6. Taxonomy structural design: hierarchies and facets
7. Standards: SKOS, RDF, RDF Schema, and OWL
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Purposes and Benefits

KOS uses

1. Management and retrieval/findability/discoverability of *internal* content by users within an organization
 - Intranet/SharePoint, content management system, document management system, digital asset management system, records management, linking structured and unstructured data, data warehouses, data lakes, etc.
2. Enabling retrieval/findability/discoverability of information by *external* users
 - Databases of published articles, information resource websites, products/services for sale, government website public information, business exchanges, search engine optimization (SEO), etc.

Purposes and Benefits

KOS uses and applications

1. Indexing/tagging support

- a) Manual indexing
- b) Automated indexing

2. Retrieval support

- a) In search
- b) In browse
 - Alphabetical browse
 - Hierarchical browse
 - Faceted browse (usually to limit search)

Purposes and Benefits

Indexing/tagging support

- For indexing documents, images, or other digital assets.
- For manual indexing/tagging, as an aid to indexers
- For automated indexing, as a basis for rules or examples (two different methods of auto-categorization)
- For ensuring consistent indexing across multiple content items of different sources/creators with different wording

Purposes and Benefits

Retrieval support: in search

Controlled list of terms and their synonyms/equivalents to aid online retrieval

- For website or intranet search engines, online databases, online directories, enterprise search
- Might be displayed as type-ahead auto-suggest terms, or might not be displayed at all.
- Does not matter how content was indexed (manual or automated)

Purposes and Benefits

Retrieval support: in search

CityName

- Santa Ana
- Santa Anna
- Santa Barbara
- Santa Clara
- Santa Clarita
- Santa Claus
- Santa Cruz
- Santa Elena
- Santa Fe
- Santa Fe Springs

Type-ahead

- Taxonomy (Biology)
- Animal taxonomy
- Plant taxonomy
- Taxonomists
- Numerical taxonomy
- Chemotaxonomy
- Bloom's taxonomy

Search-suggest

Purposes and Benefits

Retrieval support: in browse

a) Alphabetical browse

Display method for thesauri, name/proper noun lists, and book-style indexes

Example of an alphabetical browse thesaurus:

ERIC (Educational Resources Information Center) Thesaurus
Institute of Education Sciences

<https://eric.ed.gov/?ti=all>

[Browse Thesaurus](#) Include Synonyms Include Dead terms

Purpose and Scope

The ERIC Thesaurus is a list of terms representing research topics in the field of education. Descriptors from the ERIC Thesaurus are assigned to every document in the ERIC digital library to describe its subject content.

Terms in the ERIC Thesaurus represent the vocabulary used in the documents that comprise the ERIC digital library collection. Last updated in this [archived webinar](#).

The ERIC Thesaurus contains a total of 11,761 terms. There are 4,539 Descriptors and 7,089 Synonyms. There are also 133 Deleted Descriptors but remain in the Thesaurus to aid in searching older records. The ERIC Thesaurus was last updated in March 2019 with 13 new Descriptors, 19 new Synonyms, and changes to 184 existing terms. For more information, view the [full list of updates](#) and [download](#)

Terms in italics are variants/alternative labels redirecting to the preferred label of the concept.

Browse Alphabetically

A B C D E F G H I J K L M N O P Q R S T U V W X Y Z

[Abbreviations \(2004\)](#)[Ability](#)[Ability Grouping](#)[Ability Identification](#)[Able Students \(1966 1978\)](#)[Ableism \(2004\)](#)[Abnormal Psychology](#)[Aboriginal Australians \(2004\)](#)[African American Education](#)[African American Employment](#)[African American Family](#)[African American History](#)[African American Influences](#)[African American Institutions](#)[African American Leadership](#)[African American Literature](#)[Applied Reading \(1966 1980\)](#)[Applied Research](#)[Applied Sciences](#)[Appraisal](#)[Apprenticeships](#)[Appropriate Technology](#)[Appropriations \(Federal\)](#)[Appropriations \(State\)](#)

Purposes and Benefits

Retrieval support: in browse

b) Hierarchical browse

Categorization scheme for information organization, classification, guided search

- For web site structural design, online information services, intranet content organization, content management system “folders”

Purposes and Benefits

Retrieval Support

Hierarchical browse taxonomy

Example:
Craigslist Boston

<https://boston.craigslist.org>

community	
activities	lost+found
artists	missed
childcare	connections
classes	musicians
events	pets
general	politics
groups	rants & raves
local news	rideshare
	volunteers

services	
automotive	labor/move
beauty	legal
cell/mobile	lessons
computer	marine
creative	pet
cycle	real estate
event	skilled trade
farm+garden	sm biz ads
financial	travel/vac
household	write/ed/tran

discussion forums		
android	frugal	pets
apple	gaming	philos
arts	garden	photo

housing
apts / housing
housing swap
housing wanted
office / commercial
parking / storage
real estate for sale
rooms / shared
rooms wanted
sublets / temporary
vacation rentals

for sale	
antiques	farm+garden
appliances	free
arts+crafts	furniture
atv/utv/sno	garage sale
auto parts	general
aviation	heavy equip
baby+kid	household
barter	jewelry
beauty+hlth	materials
bike parts	motorcycle parts
bikes	motorcycles
boat parts	music instr
boats	photo+video
books	real estate

jobs
accounting+finance
admin / office
arch / engineering
art / media / design
biotech / science
business / mgmt
customer service
education
etc / misc
food / bev / hosp
general labor
government
human resources
legal / paralegal
manufacturing
marketing / pr / ad
medical / health
nonprofit sector
real estate
retail / wholesale
sales / biz dev
salon / spa / fitness
security
skilled trade / craft
software / qa / dba
systems / network

Purposes and Benefits

Retrieval Support: in Browse

a) Faceted browse/search

Multiple term lists of different types, also called facets/filters/refinements

- Browsed-for facet terms are often used in combination with entering something into a search field.

- Example of a faceted taxonomy

NCSU Libraries catalog (browse new titles) www.lib.ncsu.edu/catalog

The screenshot displays a library catalog search interface. At the top, the search term 'egypt' is entered in the 'Subject Heading' field. Below this, the 'Narrow Your Search' section offers filters for 'Currently available', 'Available online', and 'New titles'. The main navigation area is divided into three facets: 'Subject', 'Genre', and 'Format', each with a list of terms and their respective counts. The 'Subject' facet includes 'History (1111)', 'Antiquities (325)', 'Politics and government (278)', 'Civilization (249)', and 'Description and travel (168)'. The 'Genre' facet includes 'Biography (203)', 'Non-fiction (143)', 'Fiction (108)', 'Drama (100)', and 'Primary Sources (72)'. The 'Format' facet includes 'Book (3030)', 'Online (1138)', 'Videos and DVDs (152)', 'Journal, Magazine, or Serial (91)', and 'Microforms (68)'. To the right, the search results are listed, showing the first five items with their authors, publication years, and formats. The results are: 1. 'The politics of human rights in Egypt and Jordan' by Yefet, Bosmat, author, published in 2015, format Book. 2. 'The Egyptian myths : a guide to the ancient gods' by Shaw, Garry J., author, published in 2014, format Book. 3. 'Radiocarbon and the chronologies of ancient Egypt' published in c2013, format Book. 4. 'The material world of ancient Egypt' by Peck, William H., 1932-, format Book. 5. 'Egypt [electronic resource]' by Russell, Mona.

Your Current Search

in Subject Heading
'egypt'

Narrow Your Search

Currently available
 Available online
 New titles

Subject

History (1111)
Antiquities (325)
Politics and government (278)
Civilization (249)
Description and travel (168)
[Show more](#)

Genre

Biography (203)
Non-fiction (143)
Fiction (108)
Drama (100)
Primary Sources (72)
[Show more](#)

Format

Book (3030)
Online (1138)
Videos and DVDs (152)
Journal, Magazine, or Serial (91)
Microforms (68)
[Show more](#)

Call Number Location

Library

Results 1 - 10 of 3388
[Brief View](#) | [Full View](#)

- The politics of human rights in Egypt and Jordan**
Author: Yefet, Bosmat, author.
Published: 2015.
Format: Book
Books by Request
Books by Request JC599 .E3 Y44 2015
- The Egyptian myths : a guide to the ancient gods**
Author: Shaw, Garry J., author.
Published: 2014.
Format: Book
Books by Request
Books by Request BL2441.3 .S53 2014
- Radiocarbon and the chronologies of ancient Egypt**
Published: c2013.
Format: Book
Books by Request
Books by Request DT83 .R194 2013
- The material world of ancient Egypt**
Author: Peck, William H., 1932-
Format: Book
Books by Request
Books by Request DT61 .P43 2013
- Egypt [electronic resource]**
Author: Russell, Mona.

Purposes and Benefits

Benefits of knowledge organization systems

1. Controlled vocabulary aspect

Brings together different wordings (synonyms) for the same concept

- Helps people search for information by different names
- Content is not missed, due to varied names/labels

Disambiguates identical works with different meanings (homographs) into separate concepts

- Incorrect content is not retrieved merely because of matching words

2. Classification and structure aspect

Organizes information into a logical structure

- Helps people browse or navigate and find topics they did not know existed or how to describe or discover new related topics

Purposes and Benefits

What is the purpose of a taxonomy, ontology or other KOS in your organization or work?

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Types of Knowledge Organization Systems

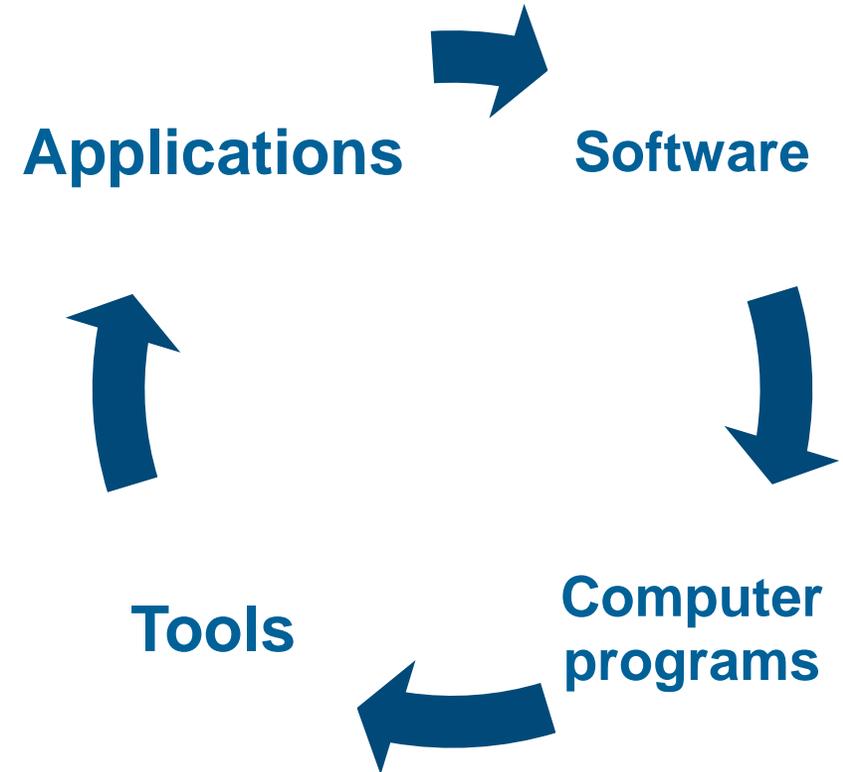
Common types of knowledge organization systems

- Synonym ring (search-support “thesaurus”)
- Name authority file
- Taxonomy
 - Hierarchical taxonomy
 - Faceted taxonomy
- Thesaurus
- Ontology

Types of Knowledge Organization Systems

Synonym ring / search thesaurus

- A controlled vocabulary with synonyms or near-synonyms for each concept
- No designated “preferred” label: All labels are equal and point to each other.
- Concepts/labels are not displayed to the end user.
- Used to support search, where there is no browsing the taxonomy.
- Sometimes called “search thesaurus.”



Types of Knowledge Organization Systems

Name authority file

- For named entities, proper nouns
- A controlled vocabulary with preferred names and variant/alternative names.
- Might not have hierarchical relationships between named concepts.
- Usually has additional information for each named concept.

The screenshot displays a Name Authority File (NAF) interface. On the left, a list of business people is shown, with 'Bezos, Jeff (0)' highlighted. On the right, the detailed view for 'Bezos, Jeff' is shown, including a URL, action buttons, and various tabs for details, notes, documents, linked data, triples, visualization, quality management, and history. The 'SKOS' section is active, showing broader concepts, narrower concepts, related concepts, and top concept of concept schemes. The 'Preferred Label' is 'Bezos, Jeff' (en). The 'Alternative Labels' include 'Bezos, Jeffrey' (en), 'Bezos, Jeffrey P.', and 'Bezos, Jeffrey Preston'. The 'Hidden Labels' section is empty. The 'Scope Notes' section contains the text: 'Founder, chairman, CEO, and president of Amazon.' (en).

Types of Knowledge Organization Systems

Taxonomy

- A KOS with broader/narrower (parent/child) relationships that include all concepts to create a hierarchical structure
 - Has focus on categorizing and organization concepts
 - May or may not have “synonyms” to point to the correct, preferred terms/labels
 - May comprise several hierarchies or facets
(A facet can be considered a hierarchy.)
- “Taxonomy” may refer to any controlled vocabulary (term lists, synonym rings, authority files, classification schemes, thesauri, etc.), but does not include ontologies

Types of Knowledge Organization Systems

Taxonomy Examples

- Leisure and culture
 - Arts and entertainment venues
 - Museums and galleries
 - Children's activities
 - Culture and creativity
 - Architecture
 - Crafts
 - Heritage
 - Literature
 - Music
 - Performing arts
 - Visual arts
 - Entertainment and events
 - Gambling and lotteries
 - Hobbies and interests
 - Parks and gardens
 - Sports and recreation
 - Team sports
 - Cricket
 - Football
 - Rugby
 - Water sports
 - Winter sports
 - Sports and recreation facilities
 - Tourism
 - Passports and visas
 - Young people's activities

Hierarchical Taxonomy Example

Career Level

- Student
- Entry Level
- Experienced
- Manager
- Director
- Executive

Function

- Customer Service & Support
- Delivery
- Engineering
- Finance
- General Management
- Legal & Regulatory Affairs
- Marketing & Advertising [more]

Industry

- Agriculture
- Apparel & Fashion
- Automotive
- Aviation & Aerospace
- Banking
- Biotechnology
- Broadcast Media
- Chemicals [more]

Faceted Taxonomy Example

Types of Knowledge Organization Systems

Hierarchical taxonomy

Concepts have broader concepts and narrower concepts.

The image displays a knowledge organization system interface. On the left, a hierarchical taxonomy is shown, starting with 'Food and Recipes' at the top. It branches into 'Recipes (2)', 'Dishes (12)', and 'Desserts (4)'. Under 'Dishes', there are 'Appetizers (2)', 'Baked goods (2)', and 'Desserts (4)'. Under 'Desserts', there is 'Cakes (3)', which further branches into 'Chocolate cakes (1)', 'Fruit cakes (1)', and 'Layer cakes (0)'. Other categories include 'Ice cream (0)', 'Pies (0)', ' pudding (0)', 'Dressings and sauces (2)', 'Egg dishes (2)', 'Meat and poultry (4)', 'Pasta, rice, potatoes (3)', 'Pizza and savory baking (2)', and 'Salads (4)'. On the right, the 'Cakes' concept is detailed. It includes a URL (<http://advanced.poolparty.biz/FoodandRecipes/99>), action buttons for '+ Add to Collection', 'Add to Blacklist', and 'Delete Concept', and tabs for 'Details', 'Notes', 'Documents', 'Linked Data', 'Triples', 'Visualization', 'Quality Management', and 'History'. The 'SKOS' section shows 'Broader Concepts' (Desserts) and 'Narrower Concepts' (Chocolate cakes, Fruit cakes, Layer cakes). The 'Preferred Label' is 'Cakes' in English, and there are sections for 'Alternative Labels' and 'Hidden Labels'.

Types of Knowledge Organization Systems

Thesaurus

- A KOS that has standard structured relationships between terms/concepts
 - Hierarchical: broader term/narrower term (BT/NT)
 - Associative: related terms (RT)
 - Preferred terms and nonpreferred terms (as equivalence relationship USE/UF) or preferred labels and alternative labels.
- Created in accordance with standards:
 - ISO 25964-1 Part 1, *Thesauri and interoperability with other vocabularies*
 - ANSI/NISO Z39.19 *Guidelines for Construction, Format, and Management of Monolingual Controlled Vocabularies*
- The kind of KOS most used in indexing articles for library/academic research
- Have existed, originally in print, since²⁹ 1960s

Types of Knowledge Organization Systems

Ontology

- A more abstract layer in describing a KOS.
- A formal naming and definition of the types, properties and interrelationships of entities in a particular domain.
- A set of precise descriptive statements about some part of the world.
- A form of “knowledge representation.”
- If created according to W3C guidelines (OWL: Web Ontology Language) can enable knowledge linking on the web/Semantic Web.

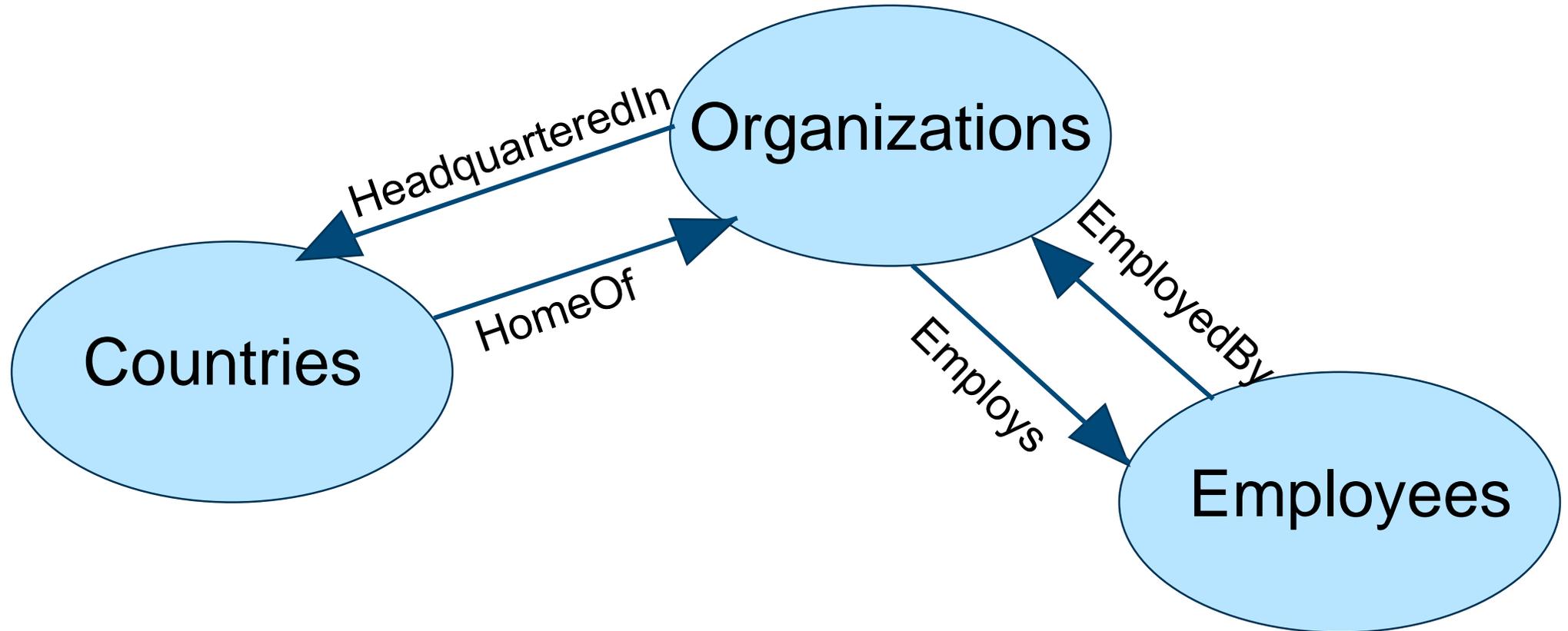
Types of Knowledge Organization Systems

Ontology Types

- Upper or core ontologies (top-level ontology, upper model, foundation ontology)
 - A generic, standard framework to serve as a model for a domain ontology, taxonomy, or other KOS
 - Examples: [Basic Formal Ontology \(BFO\)](#), [gist](#), [SUMO \(Suggested Upper Merged Ontology\)](#), SKOS, BIBFRAME, FOAF
- Domain or custom ontologies
 - Concepts belong to a specific subject domain
 - Examples: [Systems Biology Ontology](#), [Gene Ontology](#), [BBC Ontology](#), [Financial Industry Business Ontology \(FIBO\)](#)
- “Ontology” may also refer to a combination of a taxonomy with a custom ontology layer.

Types of Knowledge Organization Systems

Domain ontology excerpt example



Types of Knowledge Organization Systems

Summary of common KOS Types



Synonym Ring	Authority File	Taxonomy	Thesaurus	Ontology
Synonym control	Ambiguity control Synonym control	Ambiguity control (Synonym control) Hierarchical relationships	Ambiguity control Synonym control Hierarchical relationship Associative relationships	Ambiguity control (Synonym control) Semantic relationships Classes Linked data

Types of Knowledge Organization Systems

Quiz

What kind of KOS is most suitable for:

- An ecommerce website
- A database of scholarly articles
- Enterprise search (search box)
- A digital asset management system
- An internal repository of researchers and projects
- A government agency public website
- Data for pharmaceutical product development

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Creating Concepts

Concepts in a taxonomy or ontology

- A concept is a unique, unambiguous entity in a KOS/knowledge model, with its own definition and usage.
- The same concept may have multiple names, and the same name/word may refer to multiple concepts, so the focus should be on concepts, not names/words/terms.
- Concepts are tagged/indexed/assigned to content items.
- It should be clear to both those tagging/indexing and those browsing and searching for content what the concept means.
- Concepts are grouped into sets or hierarchies, called Concept Schemes.

Creating Concepts

A concept has:

- **Labels**

- A single **preferred label** (in each language, if in a multilingual KOS)
 - The displayed label, when concepts are displayed for browsing in hierarchies or other visualizations
- Any number of **alternative labels**
 - The labels that support searching by other names

- **Metadata**

- A unique identifier number; often a URI
- Optional notes and other attributes: definition, notes, etc.
- Other: creation date, last update date, creator, approval status, etc.

- **Relationships** (of various types) with other concepts

Creating Concepts

A concept, its labels, relationships, and notes, as maintained in taxonomy/ontology management software, PoolParty

The screenshot shows the PoolParty interface for creating a concept. At the top, the concept name "Appetizers" is displayed, along with a URL "http://advanced.poolparty.biz/FoodandRecipes/2" and two action buttons: "Add to Collection" and "Delete Concept". Below this, a navigation bar contains tabs for "Details", "Notes", "Documents", "Linked Data", "Triples", "Visualization", "Quality Report", and "History". The "Details" tab is active, showing a "SKOS" section with a "+" button. The main content area is divided into two columns. The left column contains three sections: "Broader Concepts" with a link to "Dishes", "Narrower Concepts" with links to "Dips" and "Bruschetta", and "Related Concepts". The right column contains five sections: "Preferred Label" with the label "Appetizers", "Alternative Labels" with "Starters", "Pupus", and "Hors d'ouvres", "Hidden Labels", "Scope Notes" with the note "Dishes usually served as appetizers", and "Definitions". At the top of the main content area, there are three icons: "Relations", "Add to Blacklist", and "Linguistics".

Creating Concepts

Label format and style

- Consistent capitalization
- Single words or multi-word phrases
- Nouns or noun phrases
- Adjectives alone can be concepts only in small navigational taxonomies, where the noun is obvious from context, or in facets (such as colors).
- Countable nouns are usually plural.
- Parenthetical qualifiers may be used for disambiguation, not modification.
- Avoid inversions with commas (e.g. noun, adjective).

Creating Concepts

Alternative Labels

- **Defined:** Approximately synonymous words or phrases to refer to an equivalent concept, for the *context* of the KOS and content (knowledge model)
- **Purpose:** To capture different wordings of how different people might describe or look up the same concept or idea.
 - Differences between that of the author and the end-user
 - Differences between that of the indexers and the end-users
 - Differences between different indexers, people doing tagging
 - Differences among different end-users
- Serving as “multiple entry points” to look up and retrieve the desired content.
- Enabling consistent indexing/tagging

Creating Concepts: Alternative Labels

Guidelines for using alternative labels

- A concept may have any number of (multiple) alternative labels, or it may have no alternative labels.
- An alternative label is associated with only a single concept.
 - Alternative labels cannot be re-used in different concepts (unless there is some weighting scheme, and they are not displayed)
- Alternative labels may be displayed to the end-user or they may not be.
- Alternative labels, may redirect the end-user to the concept with the preferred label (before getting to the content), or they can link directly to the content.

Creating Concepts: Alternative Labels

Displayed vs. non-displayed alternative labels

Even when alternative labels are displayed, some may be specially designated for *not* displaying:

- Common misspellings, slang, or deprecated, or potentially offensive terms not displayed to users but can match searches.
- Auto-categorization support but not intended for manual indexing.
- Search support but not intended for type-ahead display.

SKOS model has **Hidden Label** (skos:hiddenLabel) for these uses.

Creating Concepts

Concept metadata: notes/documentation

- Concepts may have notes.
- If utilized, not all concepts need notes.
- Free text field associated with the concept in the taxonomy/thesaurus management system.
- May have multiple types/purposes of notes: for end-user, indexer, or both

Types:

- Standard thesaurus note: **Scope Note**
- SKOS-supported notes: **Scope Note, Editorial Note, Change Note, History Note**
- Other SKOS-supported documentation: **Definition, Example**

Creating Concepts

Concept metadata: additional attributes

- A KOS management system can store additional attribute data about a concept.
- Not part of the SKOS model, but is a standard feature of ontologies
- Typically used for named entities, not so much for subjects

Examples:

- *For Companies*: address, industry code, private/public status
- *For Person names*: title/occupation, birth date, nationality
- *For Products*: part number, price, introduction date
- *For Places*: latitude and longitude

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Creating Relationships

Types of relationships between concepts

1. Hierarchical: Broader concept / Narrower concept
2. Associative: Related concept
3. Specific, customized relationships

Relationships are reciprocal between concepts.

Best practices for creating hierarchical and associative relationships are in the thesaurus standards:

ISO 25964-1 Part 1, Thesauri and interoperability with other vocabularies

www.iso.org/standard/53657.html, or

ANSI/NISO Z39.19-2005 Guidelines for the Construction, Format, and Management of Monolingual Controlled Vocabularies

www.niso.org/publications/ansiniso-z3919-2005-r2010

Good to follow even for taxonomies (not merely thesauri).

Creating Relationships

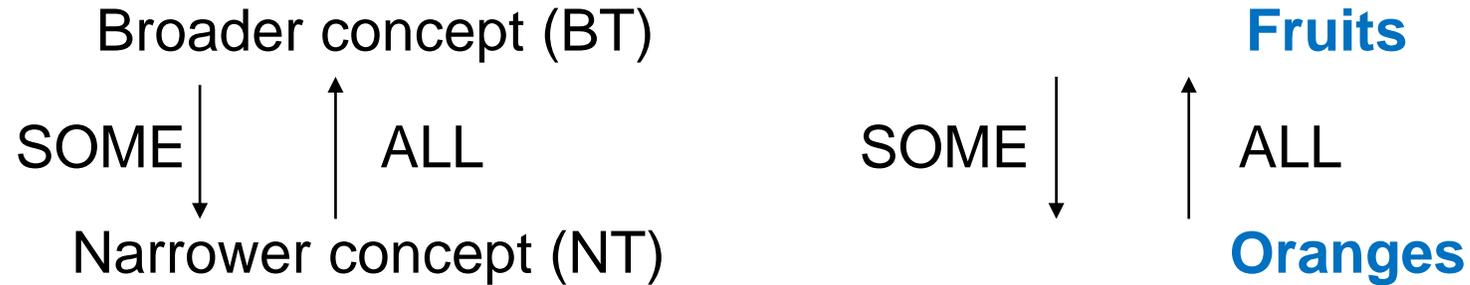
Hierarchical relationships

- Broader-narrower / Topic-subtopic / Parent-child / Superordinate-Subordinate
- Required feature of both thesauri and taxonomies
- Thesaurus designation of BT / NT (broader term / narrower term)
- SKOS designation: Broader concept / Narrower concept
- Concepts usually have more than one narrower concept, unless they are the most specific concept in the vocabulary.
(More so in taxonomies than thesauri.)
- On occasion, a concept may have more than one broader concept, referred to as polyhierarchy.

Creating Relationships

Hierarchical relationships

Reciprocal (bi-directional) relationships, but asymmetrical



Fruits NT **Oranges** **Oranges** BT **Fruits**

Three types:

1. Generic – Specific
2. Generic – Named entity instance: Common noun – Proper noun
3. Whole – Part

Creating Relationships

Associative relationships between concepts in different hierarchies:

Process and agent: **Skiing** related **Skiers**

Process and instrument: **Ventilation** related **Fans (Equipment)**

Process and counter-agent: **Bacterial infections** related **Antibiotics**

Action and property: **Environmental protection** related **Pollution**

Action and product: **Glassblowing** related **Glass containers**

Action and target: **Appliance repair** related **Appliances**

Cause and effect: **Hurricanes** related **Storm surges**

Object and property: **Plastics** related **Elasticity**

Object and origins: **Petroleum** related **Oil wells**

Raw material and product: **Timber** related **Wood products**

Discipline and practitioner: **Chemistry** related **Chemists**

Discipline and object: **Literature** related **Books**

Creating Relationships

Specific/customized relationships

- Relationships containing meaning: “semantic”
- Variations on hierarchical or associative relationships, but usually associative.
- Reciprocal, but asymmetrical or directional.
- Specific enough to convey the necessary meaning, but not uniquely specific.
- Relationships are between concepts of different types, across different designated *categories* or *classes*, or concept schemes.
- Taxonomist defines the relationships and the categories or classes.
- A required characteristic of ontologies.

Creating Relationships

Specific/customized relationships

Sample variations on the associative relationship (RT):

Has produced the work (WRK) / Created by (CRE)

Twain, Mark WRK **The Adventures of Tom Sawyer**
The Adventures of Tom Sawyer CRE **Twain, Mark**

Produces the product (PRD) / Is manufactured by (MAN)

Apple Inc. PRD **iPod**
iPod MAN **Apple Inc.**

Has member affiliation with (AFF) / Has members (MEM)

Saudi Arabia AFF **OPEC**
OPEC MEM **Saudi Arabia**

For treating (TRE) / Can be treated with the drug (DRUG)

ACE inhibitors TRE **Hypertension**
Hypertension DRUG **ACE inhibitors**

Creating Relationships

Demonstration of creating concepts and relationships in PoolParty

Outline

1. Introduction to taxonomies and ontologies
2. Purposes and benefits
3. Types of knowledge organization systems
4. Creating concepts
5. Creating relationships
6. **Taxonomy structural design: hierarchies and facets**
7. Standards: SKOS, RDF, RDF Schema, and OWL
8. Creating ontologies
9. Implementation issues
10. Linked data and the Semantic Web

Structural Design: Hierarchies

Hierarchies

- The extension of hierarchical relationships to include all concepts
- More important for taxonomies than other KOS types
- Emphasizes categorization, classification, sorting
- Users navigate from the top down
- Also known as “tree” structures

A single taxonomy may have one or more top-term hierarchies

Hierarchies should be designed to reflect the scope of the content and the view of the users

Structural Des

Examples of hierarchies

Higher education disciplines in the United States

Cengage Learning

www.cengage.com/all-disciplines

Humanities & Social Sciences

Anthropology

Art & Humanities

College Success and Study Skills

Communication Studies

Counseling

Criminal Justice

Developmental English

Early Childhood Education

Education

English

History

Human Services

Mass Communication

Music

Philosophy

Political Science

Psychology

Radio Television & Film

Religion

Social Work

Sociology

Theatre

World Languages

Science, Technology & Mathematics

Agriculture

Astronomy

Biology

Chemistry

Computing & Information Technology

Developmental Math

Earth Sciences

Engineering

Environmental Science

Forensic Science

Geography

Health

Mathematics

Nutrition

Physics

Statistics

Veterinary Technology

Business & Economics

Accounting

Business Communication

Business Law

Career Success

Decision Sciences

Economics

Finance

General Business

Introduction to Business

Keyboarding

Keyboard/Computer Education

Management

Marketing

Office Technology

Taxation

Professional & Career

Automotive & Trucking

Beauty & Wellness

Career Education

Culinary, Hospitality, Travel & Tourism

Emergency Services

General Interests & Hobbies

Health Care

Media Arts & Design

Paralegal

Trades

Structural Design: Hierarchies

Depth vs. breadth of hierarchy levels: decision factors

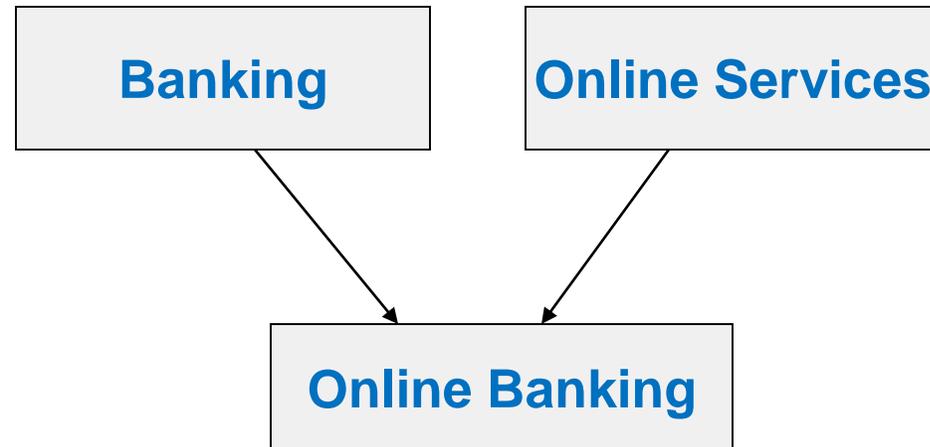
- Display interface horizontal and vertical space
- Multiple clicks to deeper levels on public websites
- More levels lead to less consistency across levels.
- User needs, and expectations
Industry experts, internal employees, general public, students, etc.

Structural Design: Hierarchies

Polyhierarchies

Sometimes a concept can have two or more broader concepts.

- Polyhierarchy is permitted if the hierarchical relationship is valid in both/all cases
- Remember “All-and-Some” test for each generic hierarchical relationship
- Systems may or may not support it.



Structural Design: Facets

Facets

- For serving faceted classification, which allows the assignment of multiple classifications to an object
- A “dimension” of a query; a type of concept; an attribute of a thing; an aspect
- Intended for searching with multiple concepts in combination (post-coordination), one from each facet
- A refinement, filter, limit by, narrow by
- Can be for topics or for named entities
- Reflect the domain of content

- Facets are dynamic and involve user interaction.
Example: <http://vocabulary.semantic-web.at/GraphSearch/>

Structural Design: Facets

Examples of ecommerce facets for different kinds of products

Narrow Selection By:

Size Range
Show All
(Reg, Plus, Slim, Big & Tall, etc.)

Specific Size
Show All

Color
Show All

Sleeve Length
Show All

Fabric
Show All

Style
Show All

Show All

All Others (56)

Tailored (11)

Buttontdown (6)

Split Neck (3)

For clothes

Format

- Paperback (386,973)
- Hardcover (240,008)
- Kindle Edition (17,788)
- Audible Audio Edition (151)
- HTML (15,520)
- PDF (13,078)
- Audio CD (529)
- Board Book (296)
- Audio Cassette (413)
- Calendar (1,823)
- School Binding (481)
- MP3 CD (27)

Author

Any Author

- David S. Moore (525)
- Ron Larson (518)
- Charles Darwin (464)
- Margaret L. Lial (388)
- David Halliday (295)
- Deborah Hughes-Hallett (221)
- E. John Hornsby (219)
- > See more...

Series

Any Series

- Unleashed (94)
- Sams Teach Yourself (81)
- Apogee Books Space (56)
- Demystified (42)
- > See more...

Shipping Option (What's this?)

Any Shipping Option

For books

Format see all

- CD
- DVD
- E-Mail

Platform see all

- Mac
- Universal
- Windows

Language see all

- Arabic
- English
- Multilingual
- Russian
- Spanish

Brand see all

- Adobe Systems
- Corel
- Intuit
- McAfee
- Microsoft
- Nero
- Unbranded

Operating Systems see all

- Microsoft Windows 10
- Microsoft Windows 7

For software

Category

Select category(s) Clear

- Banquet Tables (4)
- Bistro Table (2)
- Bistro Tables (5)
- Counter-Height Table (1)
- Counter-Height Tables (6)
- Dining Table (10)
- Dining Tables (52)
- Folding Table (8)
- Folding Tables (12)
- Kitchen Table (1)
- Kitchen Tables (1)
- Nook Table (1)
- Nook Tables (1)
- Pub Table (7)
- Pub Tables (29)

Material

Select material(s) Clear

- Hardwood (29)
- MDF Composite (1)
- Metal (28)
- Plastic (1)
- Wood (48)
- Wood Composite (35)

Finish

Select finish(s) Clear

- Cherry (4)
- Dark Cherry (1)
- Ebony (1)
- Espresso (44)
- Oak (7)
- Painted (8)
- Unfinished (1)
- Walnut (8)

Color

For furniture

Structural Design: Facets

Examples of internal content facets

Department

- Research
- Sales
- Finance
- Marketing
- Exec Office
- SHOW MORE

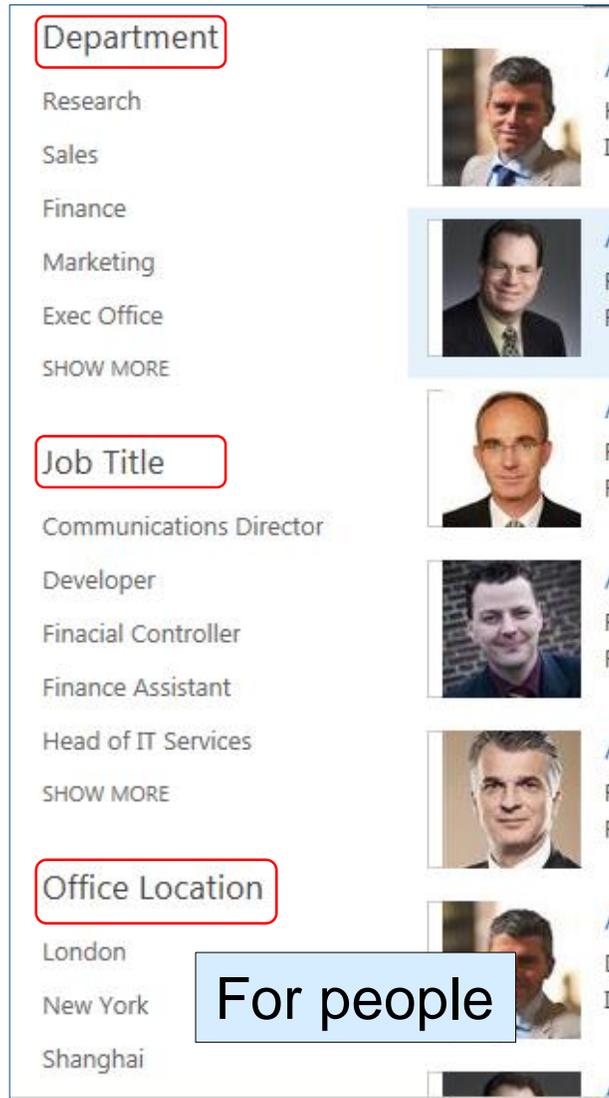
Job Title

- Communications Director
- Developer
- Financial Controller
- Finance Assistant
- Head of IT Services
- SHOW MORE

Office Location

- London
- New York
- Shanghai

For people



File Type

- Word

Document Type

- Feature Overview
- Technical Specifications

Item Type

- Project Document

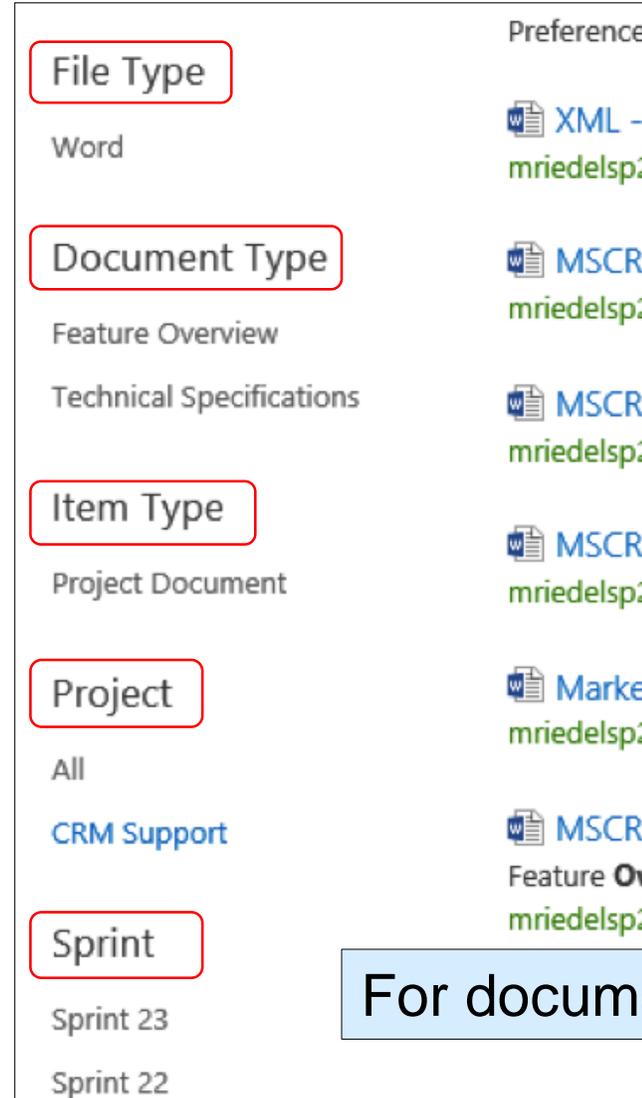
Project

- All
- CRM Support

Sprint

- Sprint 23
- Sprint 22

For documents



Result type

- Word

Author

- User1
- System Account
- AATISH AGARWAL
- SHOW MORE

Modified date



All

Community

- Technical
- Recreational
- Other Value
- Apply | Clear

Language

- English
- German



Content Manager

- Content Manager (7)
- Content Manager (9)
- Content Manager (1)
- Content Manager (1)
- Other Value
- Apply | Clear

Distribution Channel

- TechNet Library (7)
- OfficeOnlineVNext (2)
- MSDN Code Gallery (1)
- MSDN Library (1)
- MSN Video (1)
- Other Value
- Apply | Clear

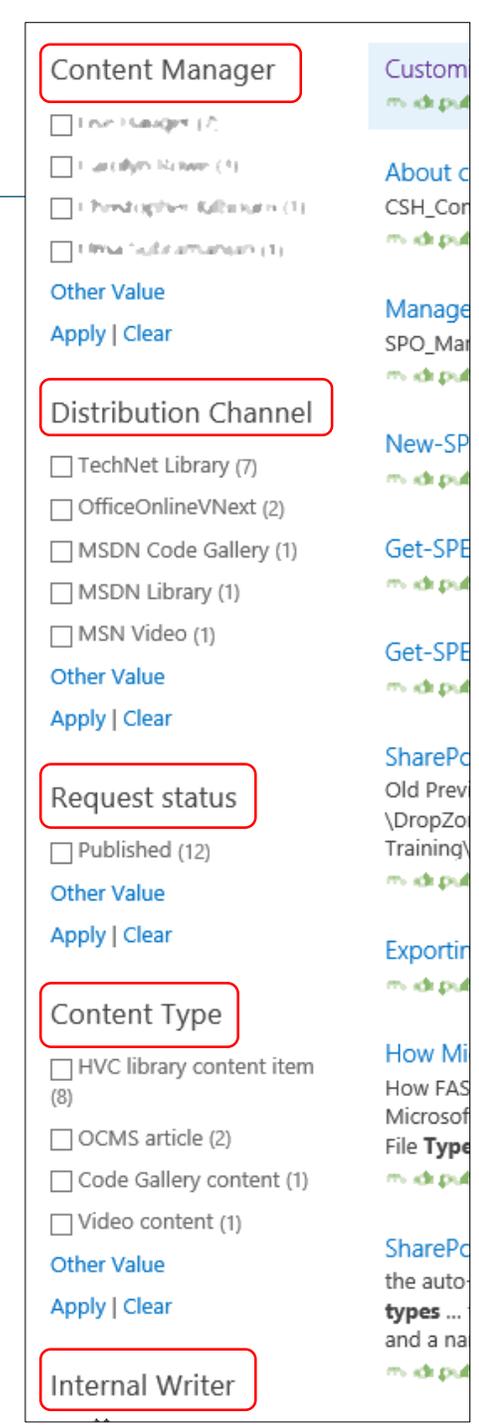
Request status

- Published (12)
- Other Value
- Apply | Clear

Content Type

- HVC library content item (8)
- OCMS article (2)
- Code Gallery content (1)
- Video content (1)
- Other Value
- Apply | Clear

Internal Writer



Structural Design: Facets

Facet advantages

- Supports more complex search queries by users
- Allows users to control the search refinement, narrowing or broadening in any manner or order
- Familiar to novice users; suitable for expert users

Facet disadvantages

- Only suitable for somewhat structured, unified type of content that all share the same multiple facets
- Not practical for extremely large topical taxonomies
- Requires investment of thorough indexing/tagging

Structural Design

Demonstration of the comparison of hierarchies and facets in PoolParty

Outline

1. Introduction to taxonomies and ontologies
2. Purposes and benefits
3. Types of knowledge organization systems
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9. Implementation issues
10. Linked data and the Semantic Web



SKOS (Simple Knowledge Organization System)

- A data model to representation knowledge organization systems
- A World Wide Web (W3C) recommendation.
- Released in 2005 as a working draft and in 2009 as a recommendation.
- “A common data model for sharing and linking knowledge organization systems via the Web” <https://www.w3.org/TR/skos-reference/>
- Encoded using XML and RDF (Resource Description Framework).
- To enable easy publication and use of such vocabularies as linked data.
- A KOS built on SKOS is machine-readable and interchangeable.

Standards: SKOS

SKOS principles

- A KOS is a group of **Concepts** identified with URIs and grouped into a **Concept scheme**.
- Concepts can be **labeled** with any number of lexical strings (labels) in any natural language, such as `prefLabel` and `altLabel`.
- Concepts can be **documented** with notes of various types: scope notes, definitions, editorial notes, etc.
- Concepts can be linked to each other using hierarchical and associative **semantic relations**.
- Concepts can be grouped into **Collections**, which can be labeled and/or ordered.
- Concepts of different concept schemes can be mapped using four basic types of **mapping links**.

Standards: SKOS

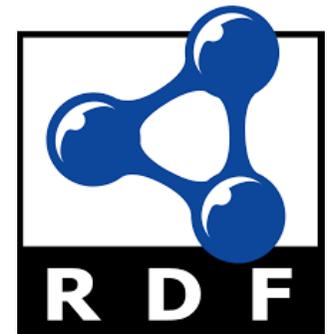
SKOS Elements

Concepts	Labels & Notation	Documentation	Semantic Relations	Collections	Mapping Properties
Concept	prefLabel	note	broader	Collection	broadMatch
ConceptScheme	altLabel	changeNote	narrower	orderedCollection	narrowMatch
inScheme	hiddenLabel	definition	related	member	relatedMatch
hasTopConcept	notation	editorialNote	broaderTransitive	memberList	closeMatch
topConceptOf		example	narrowerTransitive		exactMatch
		historyNote	semanticRelation		mappingRelation
		scopeNote			

Example URI: [skos:prefLabel](#)

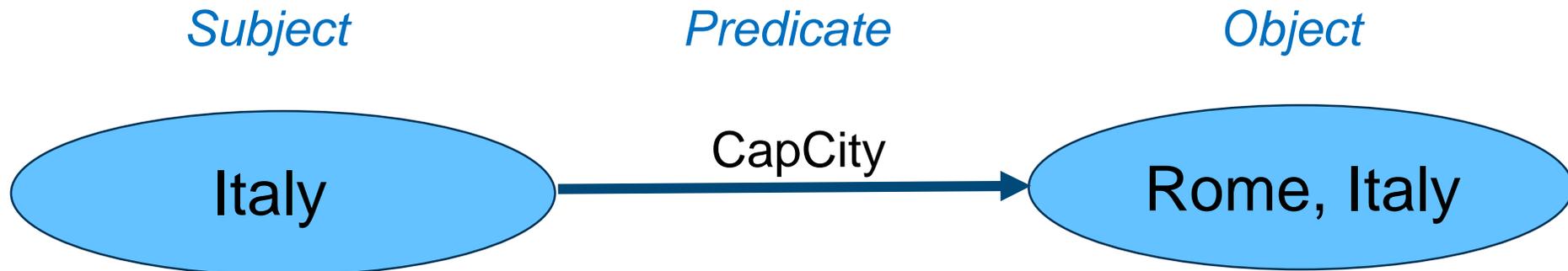
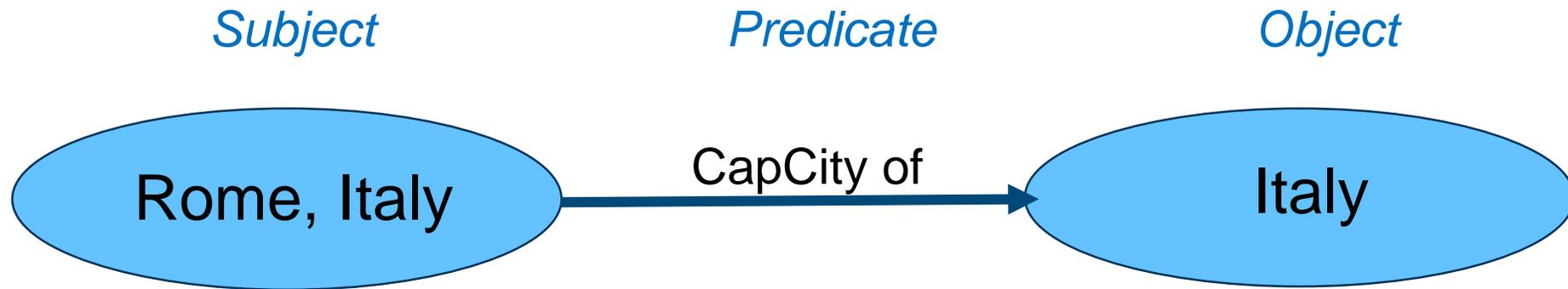
RDF (Resource Description Framework)

- A World Wide Web (W3C) recommendation
<https://www.w3.org/TR/rdf11-concepts>
- Started in 1997, adopted by the W3C as a recommendation in 1999, RDF 1.1 specification in 2014
- “A standard model for data interchange on the Web”
- Facilitates data merging even if the underlying schemas differ.
- Requires the use of URIs (Uniform Resource Identifiers) to specify **things** and to specify **relationships**.
- Models information as **subject – predicate – object** triples.
- Models information on a graph-based model.
- More fundamental, basic, and generic than SKOS or OWL.



Standards: RDF

RDF triple: (1) Subject – (2) Predicate – (3) Object
Example



Standards: RDF

RDF is an abstract framework.

As a standard format for exchange/interoperability of data, there are various *serialization formats*:

- **RDF/XML** – XML-based syntax, the first standard format for serializing RDF
- **Turtle** – compact, human-friendly format
- **N-Triples** – very simple, easy-to-parse, line-based format, not as compact as Turtle
- **N-Quads** – superset of N-Triples, for serializing multiple RDF graphs
- **JSON-LD** – JSON-based serialization
- **RDF/JSON** – alternative syntax for expressing RDF triples using a simple JSON notation
- **N3 (Notation3)** – non-standard serialization similar to Turtle, but has additional features

Standards: RDF Schema

RDF Schema - RDFS or RDF/S or RDF(S)

- Also called: RDF Vocabulary Description Language 1.0
- A World Wide Web (W3C) recommendation
<https://www.w3.org/2001/sw/wiki/RDFS>
- Published as part of the RDF Specification Suite Recommendations in 2004
- “A general-purpose language for representing simple RDF vocabularies on the Web”
- A flexible data model adaptable to specific needs
- Goes beyond RDF to designate **classes** and **properties**
- A vocabulary for describing properties and classes of RDF resources.

Standards: RDF Schema

RDF Schema (RDFS) define classes and properties

Class:

- A type or category of resources or things.
- RDFS also describes subclasses and instances.

Property:

- Used to describe characteristics of things.
- Properties are also resources, so can be subjects of RDF triples.

Classes and properties are features of ontologies.

RDFS serves as a standard for ontologies.

OWL – Web Ontology Language

- A World Wide Web (W3C) specification <https://www.w3.org/OWL>
- First published in 2004; OWL 2 (with extended features), published in 2009 <https://www.w3.org/TR/owl2-overview>
- “A Semantic Web language designed to represent rich and complex knowledge about things, groups of things, and relations between things”
- To provide a common way to process the content of web Information.
- A computer-readable language, usually written in XML, a declarative language (not a programming or schema language)
- Enables knowledge linking on the web/Semantic Web
- Based on RDF and RDFS. OWL is W3Cs attempt to extend RDFS.



Standards: OWL

OWL basic components

- **Classes** – *subjects or objects (domains and ranges) of RDF triples*
 - May contain individuals (instances of the class) and other subclasses
 - Sets of concepts that share characteristics and relationships
 - In SKOS: Concept schemes, top concept in a scheme, or concepts with narrower concepts
- **Individuals** – *subjects or objects (domains and ranges) of RDF triples*
 - Members or instances of a class.
 - In SKOS: Concepts
- **Properties** – *predicates of RDF triples*
 - Relations between instances or classes (2-way)
 - Attributes of instances or of classes (1-way)
 - In SKOS: Relationships *or* Attributes

Standards: OWL

- Names in OWL are international resource identifiers (IRIs)
- Syntaxes used in OWL: RDF/XML, OWL XML, Manchester syntax
- OWL modeling features also include:
 - Class hierarchies
 - Class disjointness
 - Property hierarchies
 - Domain (subject) and range (object) restrictions
 - Equality and inequality of individuals
 - Datatypes
 - Complex classes
 - Property restrictions, Property cardinality restrictions
 - Enumeration of individuals
 - Property characteristics

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9. Implementation issues
10. Linked data and the Semantic Web

Creating Ontologies

Creating a domain ontology, as a KOS

- Use a tool (such as PoolParty) that builds ontologies in SKOS, RDFS and OWL, so it's interoperable with other SKOS vocabularies and the Semantic Web.
- Consider starting with a core (upper) ontology as a model.
- Knowledge modeling is the initial task:
 - Define the scope
 - Identify the various classes (e.g. people, places, organizations, products)
 - Identify the relationships between classes
 - Identify the attributes for classes
- Create specific instances within the classes and apply the relationships
 - As combining an ontology with the specifics of a taxonomy
 - The taxonomy can already exist and be made more expressive, or be created along with the ontology as an integrated project.

Creating Ontologies

Knowledge modeling for a domain ontology example

Language services business: match contractors to projects

Identify classes (groupings):

Contractor

Service type

Language

etc.

Creating Ontologies

Demonstration of creating an ontology in PoolParty

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Implementation Issues

Stumbling block to taxonomy and ontology implementation

- Lack of user-focused or use-case-focused design; failure to test
- Lack of maintenance and governance
- Lack of support and for manual tagging
- Inappropriate integration with end-user search

Implementation Issues: Testing

Taxonomy/ontology testing overview

- Taxonomies serve a purpose, and that purpose should be tested.
- All taxonomies, regardless of who created them, should be tested.
- Testing can be simple or complex, depending on time and budget.
- Testing involves participants, as sample or representative users.
- Different types of tests are appropriate for different stages of taxonomy development.
- An inappropriate test or inappropriately timed test can be a waste of time and money.

Implementation Issues: Maintenance & Governance

A taxonomy/ontology is never finished; it needs to be maintained and updated.

- New content, bringing up new concepts
- Content that gets dropped
- New requirements, users, needs, trends, markets, etc.
- New concepts or changes in terminology
- User feedback suggesting improvements

Implementation Issues: Maintenance & Governance

Taxonomy/ontology governance comprises:

- Maintenance (updating): responsibility, roles, processes, procedures
 - KOS descriptive documentation (purpose, type, scope, users, indexing method, history/sources)
 - KOS editorial policy/guidelines for maintenance
 - Indexing or tagging policy/guidelines
 - Instructional/how-to documents (system-specific)
- Governance process starts with the start of creating the taxonomy/ontology. As issues come and get resolved, they get documented as policy.
- Taxonomy governance may be part of a larger metadata specification.

Implementation Issues: Manual Tagging

A KOS is only useful if correctly and comprehensively tagged to content.

Choice of auto-categorization or manual tagging depends on volume of content and content management workflows

- Auto-categorization software (or add-ons to KOS management software) provides a good solution for tagging.
- Good software for manual tagging does not exist. It's just a feature of some other software or custom-programmed.
- Manual tagging interfaces may lack usability features
 - Ease of and speed of use
 - Both hierarchical and alphabetical (with alternative labels) lookups
- Manual tagging interfaces should be customizable to support indexing policy rules or required fields, cardinality, etc.

Implementation Issues: Integration with Search

How the KOS is utilized in search impacts KOS design

Problems

- A KOS that is not displayed to end-users in any way (type-ahead display based on popular search keywords not the taxonomy)
 - Lack of utilization of alternative labels in search
 - Faceted taxonomy design without separate dynamic facets in the user interface
 - A default keyword search and use of concepts in post-search filters
- Use of taxonomies in search that is desired and expected, but perhaps not supported in 3rd-party systems

Implementation Issues: Integration with Search

Type-ahead search display based on a combination of popular search keywords and controlled KOS concepts (with initial upper case)

The screenshot shows a search interface with a dark blue header. Below the header, there are two tabs: 'Basic Search' (selected) and 'Advanced Search'. The search input field contains the text 'opioid'. A dropdown menu is open, displaying a list of suggestions: 'opioid', 'opioid epidemic', 'opioid crisis', 'opioid use', 'opioid addiction', 'opioid receptor', 'opioid overdose', 'Opioid abuse', 'opioid dependence', 'opioid analgesics', and 'Opioids'. The suggestions 'Opioid abuse' and 'Opioids' are highlighted with red rounded rectangular boxes. Below the search input, there is a section titled 'BROWSE BY DIS' with a red underline. Underneath, it says 'Explore over 500 t'. There are two buttons: 'Biology' and 'Chem'. The background is light gray.

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Linked Data and the Semantic Web

A KOS can take advantage of linked data and Semantic Web technologies.

Linked Data

- Structured data which is interlinked with other data so that become more useful through semantic queries
- Collection of interrelated datasets on the Web, available in a standard format, reachable and manageable by Semantic Web tools
- Web sources based on the RDF scheme

The Semantic Web

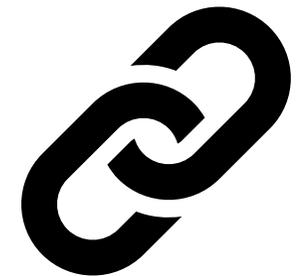
- Large scale integration of, and reasoning on, data on the Web
- W3C's vision of the Web of linked data
- A technology stack to support a “Web of data,” the sort of data you find in databases
- A common framework that allows data to be shared and reused across application, enterprise, and community boundaries



Linked Data and the Semantic Web

Linked Data Principles (on the web or in the enterprise)

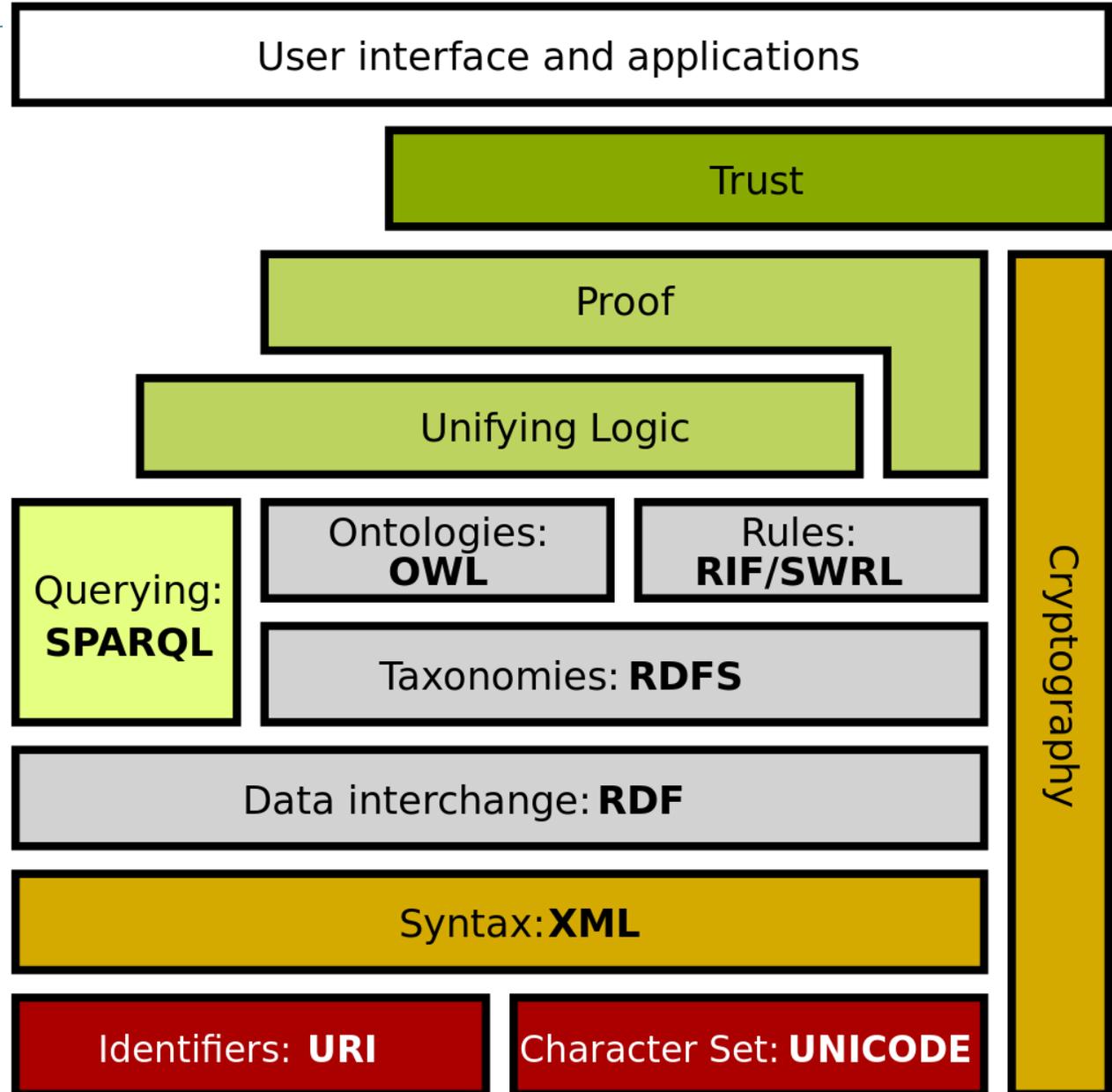
- Things are named with URIs - to identify and reference resources unambiguously.
- URIs are dereferenceable - looking up a URI on the Web in order to get information about the referenced resource.
- RDF is used to represent information.
- Links to other things are included.



Linked Data and the Semantic Web

Semantic Web Stack or Semantic Web Layer Cake

Illustration originally created by
Tim Berners-Lee, since revised.
https://en.wikipedia.org/wiki/Semantic_Web_Stack



Linked Data and the Semantic Web

Taxonomies and ontologies relate to linked data and the Semantic Web

Have links going out

- Link out to add metadata to a concept (definitions, images, etc.).
- Link to equivalent concepts in linked vocabularies to obtain alternative labels.
- Link to equivalent concepts in linked open vocabularies to expand the set of linked content per concept.



Have URLs for others to access your KOS

- Publish a taxonomy or ontology available for external reuse (with or without tagged content).
- Share the taxonomy or ontology and linked content with restricted access to external partners.



Utilize a taxonomy or ontology on the web on which to base yours.

Linked Data and the Semantic Web

A KOS can take advantage of linked data and Semantic Web technologies. Part of the Semantic Web set of technologies is a query language:

SPARQL

- **SPARQL Protocol And RDF Query Language**
- The query language of the Semantic Web and knowledge graphs, or any data that follows the RDF specification, where data is stored as RDF triples
- Became a standard in of the W3C in 2008
- Allows for a query to consist of triple patterns, conjunctions, disjunctions, and optional patterns.
- Query types are: SELECT, ASK, CONSTRUCT, DESCRIBE

Questions/Contact

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