




An Introduction to Knowledge Graphs

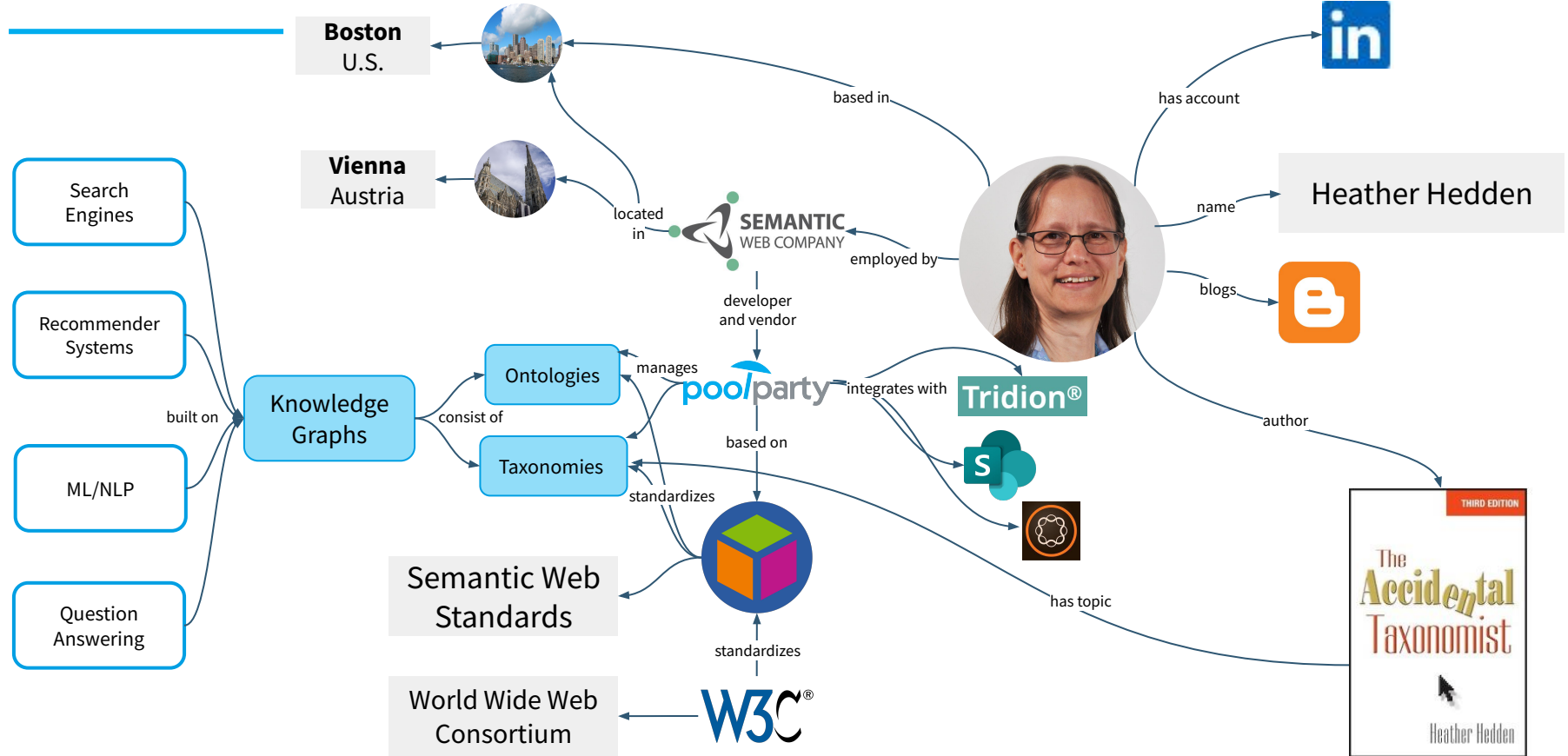
for Information Architects

Information Architecture Conference
March 30, 2023

The background of the slide is a light blue-grey color. It features a top-down view of a person's hands working at a desk. One hand is holding a pen over a tablet displaying a video conference grid. Another hand is holding a pen over a tablet displaying a colorful Venn diagram. A network diagram with various icons (globe, gear, bar chart, etc.) is overlaid on the right side of the image.

Heather Hedden
Semantic Web Company

About - Click the Graph and get in contact!



- ▶ Knowledge Graph Background
 - ▷ Information architecture domain relevance
 - ▷ Problems & solutions for connecting information
 - ▷ Knowledge graphs defined and history
- ▶ Knowledge Graph Components
 - ▷ Data stored in a graph database
 - ▷ Taxonomies
 - ▷ Ontologies
- ▶ Knowledge Graph Building and Applications
 - ▷ Building knowledge graphs
 - ▷ Applications based on knowledge graphs

A blue rectangular box containing the text 'Knowledge Graph Background'. A thin white vertical line is positioned to the left of the text. The background of the slide is a light grey gradient with a network graph pattern of white circles and lines.

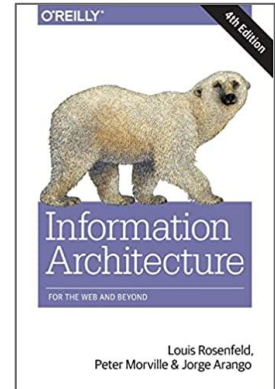
Evolving the Practice of IA

As we consider change and resilience, we'd like to consider:

What can adjacent and complementary fields... teach IAs? And what can we learn from our sibling domains ...

IA Definitions

- ➔ 1. The structural design of shared information environments.
- 2. The synthesis of organization, labeling, search, and navigation systems within digital, physical, and cross-channel ecosystems.
- 3. The art and science of shaping information products and experiences to support usability, findability, and understanding.
- 4. Organizing and labeling web sites, intranets, online communities, and software to support findability and usability.
- 5. An emerging discipline and community of practice focused on bringing principles of design and architecture to the digital landscape.

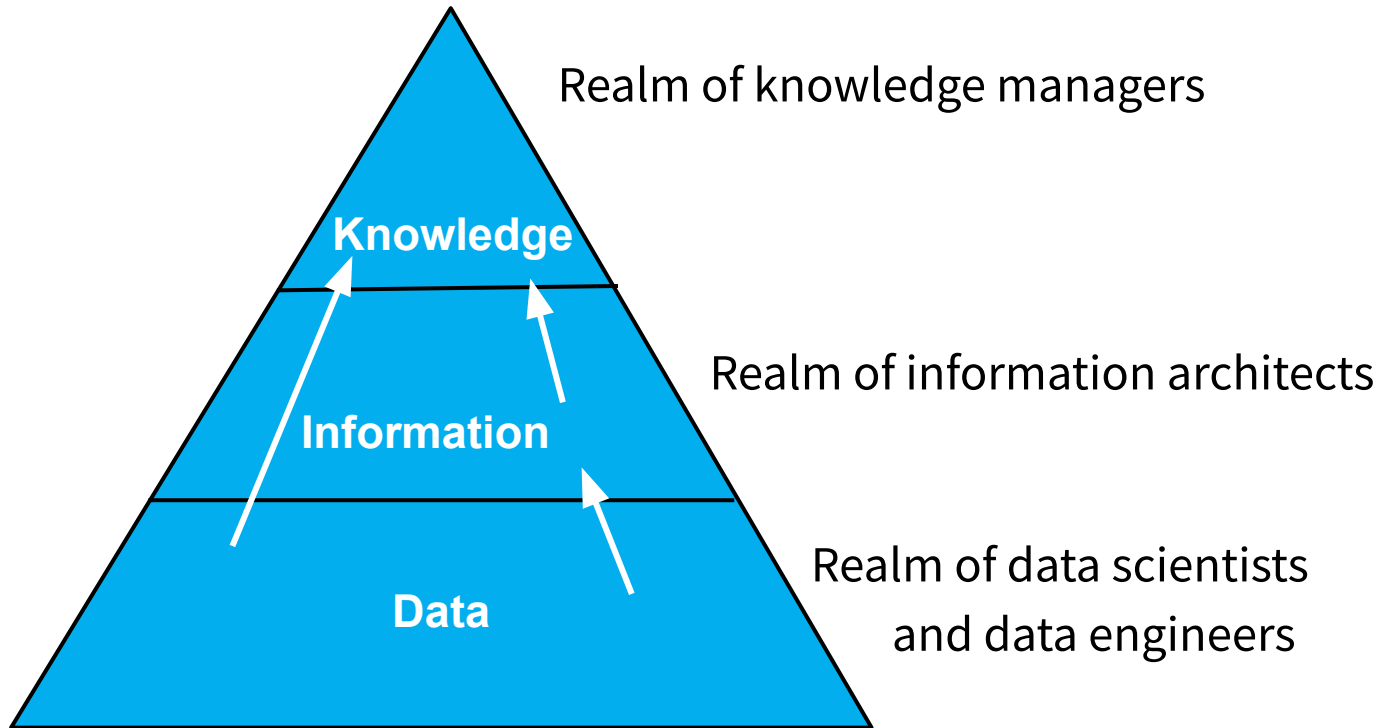


-- *Louis Rosenfeld, Peter Morville, and Jorge Arango, Information Architecture, 4th ed. , O'Reilly, 2015, p. 24*

“Information Environments”

- ▶ Not limited to a single web site, intranet, application, or online community
- ▶ Within an organization/enterprise environment, information that should be shared, pooled, linked, related, is often scattered in different applications and sources:
 - ▶ multiple content management systems
 - ▶ document management systems
 - ▶ digital asset management systems
 - ▶ employee experience platforms
 - ▶ internal collaboration software
 - ▶ external/partner collaboration spaces
 - ▶ policies, procedures, guidelines
 - ▶ customer information
 - ▶ Product info/technical documentation
 - ▶ marketing content/collateral
 - ▶ internal research information
 - ▶ external/market research information
 - ▶ people/experts
- ▶ Users want to access disparate information together.
- ▶ Users prefer a single user interface and experience.

Information Architecture Domain



Information architects need to consider **data** and **knowledge**, too, not just **information**, because they are all connected.

Problems

- ▶ Data and content silos
- ▶ Heterogeneous sources
- ▶ Mix of unstructured and structured data
- ▶ Mix of data and content
- ▶ Same things with different names
- ▶ Localized meanings
- ▶ Change

Causing

- ▶ Inefficiencies
- ▶ Missed opportunities
- ▶ Poor decisions
- ▶ Poor user experience

Provided by

- ▶ Data-centric architecture
- ▶ Ontologies
- ▶ **Knowledge graphs**

Solutions

- ▶ Sharing data
- ▶ Reusing data
- ▶ Linking data
- ▶ Linking content
- ▶ Semantic links
- ▶ Unified views

Results in

- ▶ Knowledge discovery
- ▶ Better decisions
- ▶ User/customer satisfaction

Content/data silos need not (or cannot) be fully broken down

- ▶ Content is in systems/applications with specific features.
- ▶ Content is owned and managed by their subject matter experts.
- ▶ Content is for specific users and delivery systems.

But silos can be bridged

- ▶ Extracting and transforming data into standard linked data formats
- ▶ Linking content with metadata, taxonomies, ontologies



What knowledge graphs can do

- ▶ Integrate knowledge
- ▶ Serve data governance
- ▶ Provide semantic enrichment
- ▶ Bring structured and unstructured data together
- ▶ Provide unified view of different kinds of unconnected data sources
- ▶ Provide a semantic layer on top of the metadata layer
- ▶ Improve search results beyond machine learning and algorithms
- ▶ Answer complex user questions instead of merely returning documents on a topic
- ▶ Combine with deep text analytics, semantic AI, and machine learning

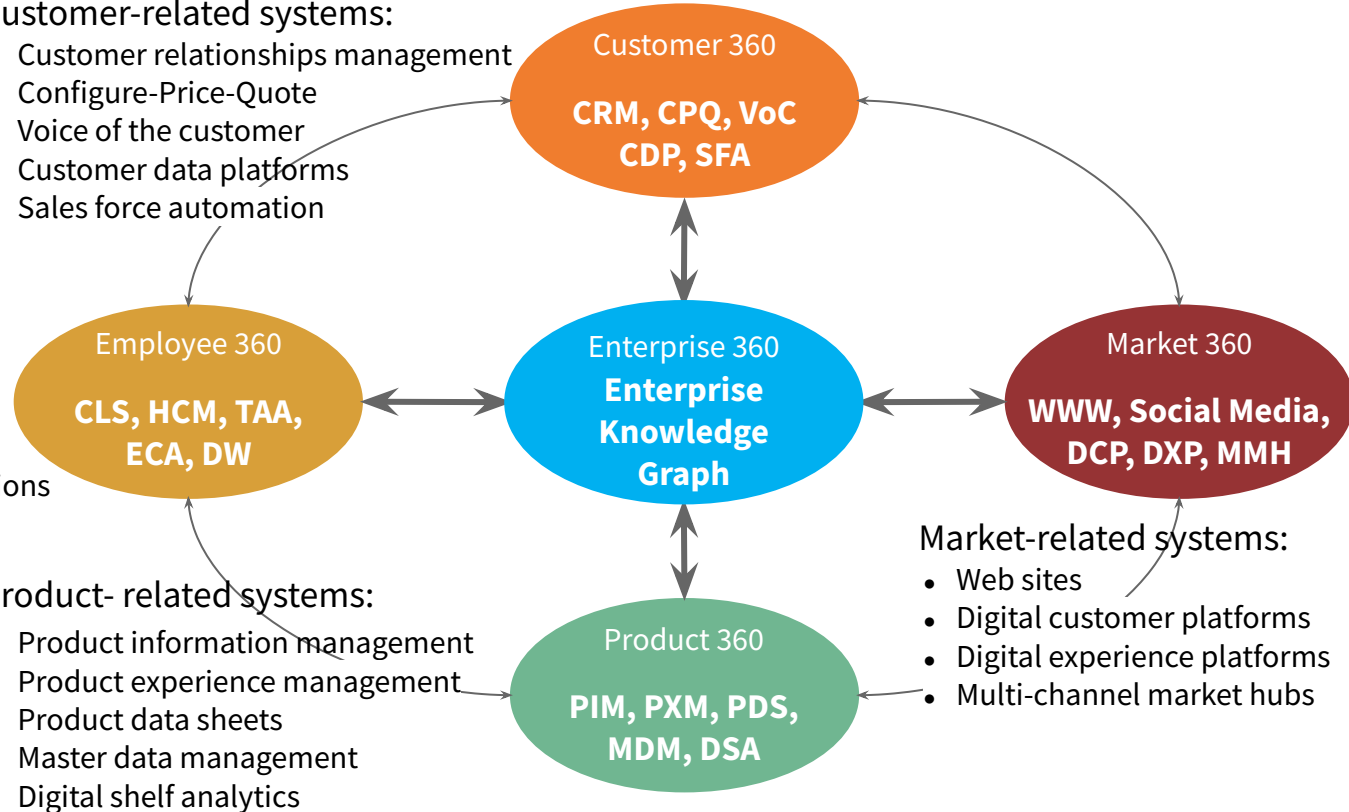


Problems & Solutions for Connecting Information

Siloed information in different systems and departments

Customer-related systems:

- Customer relationships management
- Configure-Price-Quote
- Voice of the customer
- Customer data platforms
- Sales force automation



Employee-related systems:

- Corporate learning systems
- Human capital management
- Talent acquisition applications
- Employee communication applications
- Data warehouses

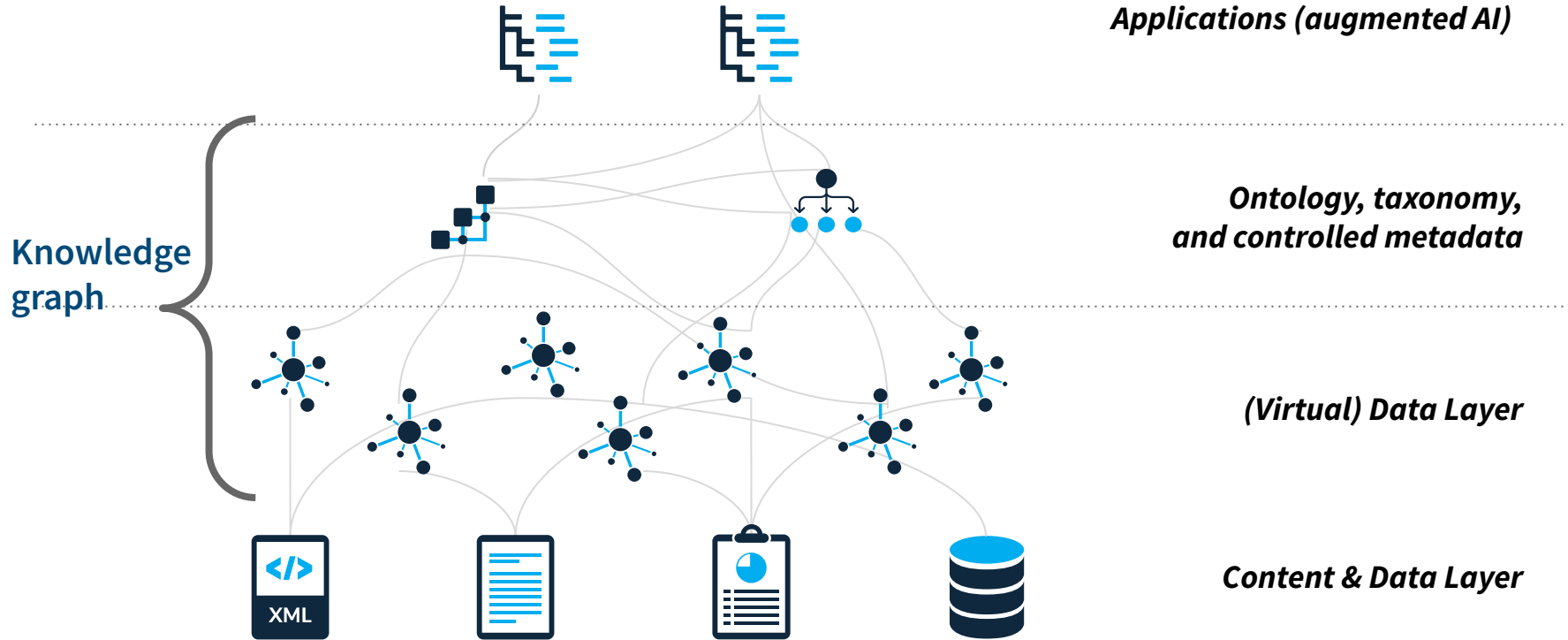
Product-related systems:

- Product information management
- Product experience management
- Product data sheets
- Master data management
- Digital shelf analytics

Market-related systems:

- Web sites
- Digital customer platforms
- Digital experience platforms
- Multi-channel market hubs

Knowledge Graphs Defined



What is a knowledge graph?

- ▶ A model of a knowledge domain combined with instance data
- ▶ Represents **unified information** across a domain or an organization, enriched with context and semantics.
- ▶ Contains business objects and topics that are closely **linked**, classified, and connected to existing data and documents.
- ▶ A **layer** between the actual content and the querying layer.
- ▶ Both **machine-readable** and **human-readable** through some form of display.
- ▶ Gets its name from **knowledge** base + **graph** database and optional **graph** visualizations.

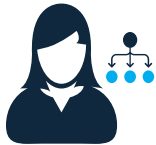


Knowledge Graphs Defined

“Knowledge graphs” have different meanings from different perspectives.

From a **Knowledge Engineer’s** perspective

A Knowledge Graph is a **model of a knowledge domain** created by subject-matter experts with the help of intelligent machine learning algorithms.



From a **Data Architect’s** perspective

Structured as an additional virtual data layer, the KG lies on top of existing databases or data sets to **link all your data together at scale**.



From a **Data Engineer’s** perspective

It provides a **structure and common interface** for all of your data and enables the creation of smart multilateral relations throughout your databases.



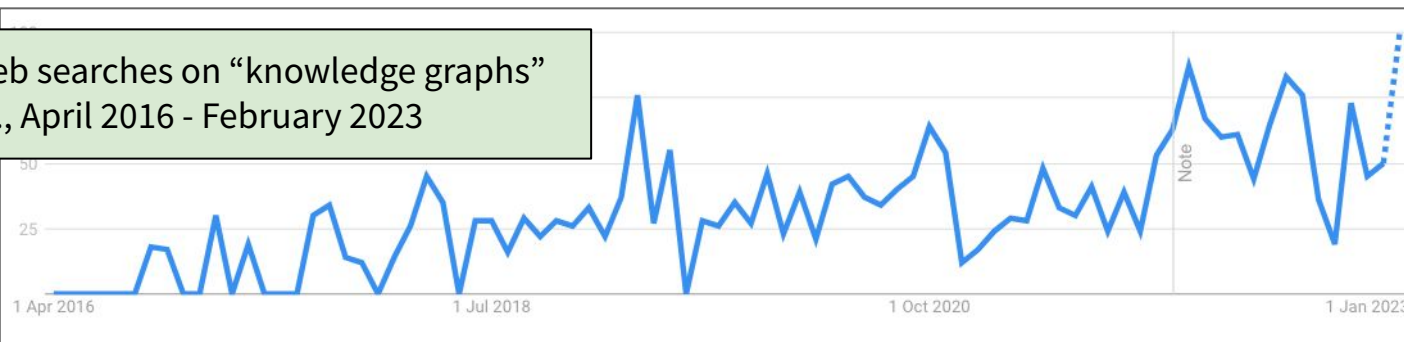
“A knowledge base that uses a graph-structured data model or topology to integrate data.”

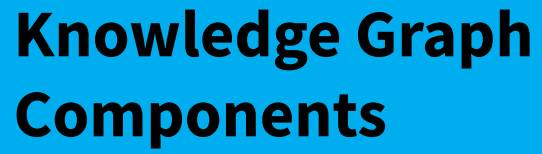
Knowledge base: “A technology used to store complex structured and unstructured information used by a computer system.” - *Wikipedia*

Knowledge Graphs History

- ▶ “Knowledge Graphs” project for mathematics by researchers of the University of Groningen and University of Twente , Netherlands, 1982
- ▶ Rise of topic-specific knowledge bases: e.g. [Wordnet](#) in 1985; [Geonames](#) in 2005
- ▶ General graph-based knowledge repositories, [DBpedia](#) (based on linked data) in 2006, [Freebase](#) in 2007
- ▶ Google introduced its [Knowledge Graph](#) (based on Freebase) to improve search results value in 2012.
- ▶ Large data-heavy companies adopted knowledge graphs: Airbnb, Amazon, Apple, Bank of America, Bloomberg, Facebook, Genentech, Goldman Sachs, JPMorgan Chase, LinkedIn, Microsoft, Uber, Wells Fargo
- ▶ Knowledge graphs became a topic at various conferences by 2019.
- ▶ Enterprise knowledge graphs become the focus.

Google web searches on “knowledge graphs” in the U.S., April 2016 - February 2023



A blue rectangular box containing the title "Knowledge Graph Components" in bold black text, with a vertical white line to the left of the text.

Knowledge Graph Components

Knowledge graph components

- ▶ Extracted **data**, stored in either
 - ▶ A **graph database**, of either
 - ▶ RDF-based triple store
 - ▶ Labeled property graph
 - ▶ A search index (if not large)
 - ▶ RDF-based triple store
- ▶ which are tagged/linked with metadata or concepts in **controlled vocabularies** (especially **taxonomies**) to label and organize the data,
- ▶ which in turn are semantically linked to represent conceptual relationships and enriched with additional metadata attributes in an **ontology**.

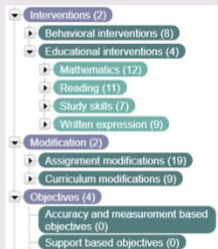


Scope issue/question: What kind of data is included or not? Data vs. content

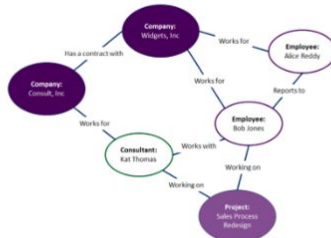
Knowledge Graph Components



Business Taxonomy



Business Ontology



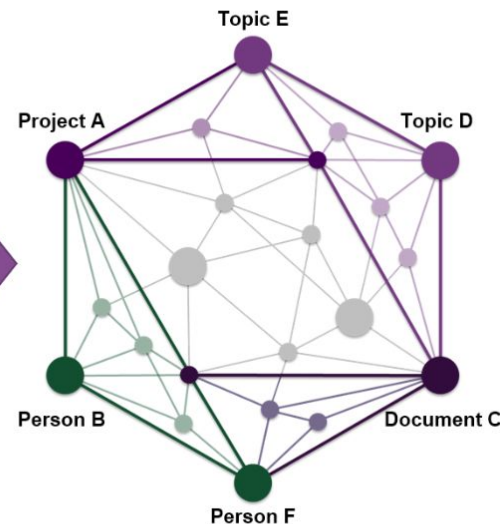
Content Sources



Graph Database

Subject	Predicate	Object
Project A	hasTitle	Title A
Person B	isPMOn	Project A
Document C	isAbout	Topic D
Document C	isAbout	Topic F
Person B	IsExpertIn	Topic D
...

Enterprise Knowledge Graph

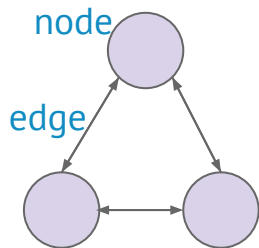


Source: Enterprise Knowledge, <https://enterprise-knowledge.com/what-is-an-enterprise-knowledge-graph-and-why-do-i-want-one>

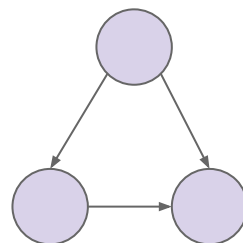
KG Components: Data in a Graph Database



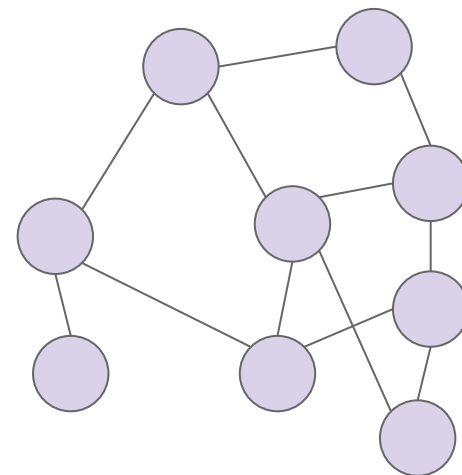
Graph databases structure data in the form of graphs, comprising **nodes** (points, vertices) and **edges** (lines, links), *not* as tables of rows and columns, as relational database are.



Undirected graph




Directed graph



Two kinds of graph databases: **RDF Triple Stores**, and **Labeled Property Graphs (LPGs)**

KG Components: Data in a Graph Database



	RDF Triple Store 	Labeled Property Graph
Standardization	World Wide Web Consortium (W3C)	Different vendors
Designed for	Linked Open Data, publishing and linking data with formal semantics and no central control	Graph representation for analytics
Processing strengths	Set analysis operations	Graph traversal
Data management strengths	Interoperability via global identifiers and a standard. Data validation, data type support.	Compact serialization, shorter learning curve.
Main use cases	Data-driven architecture, data integration, metadata management, knowledge representation	Graph analytics, path search, network analysis
Additional options	Inferencing	Shortest path calculations
Formal semantics	Yes	No



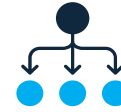
RDF Triple Store Graph Databases

- ▶ Store data
- ▶ Store links to content
- ▶ Store metadata, controlled vocabularies, taxonomies, ontologies

Based on RDF: Resource Description Framework

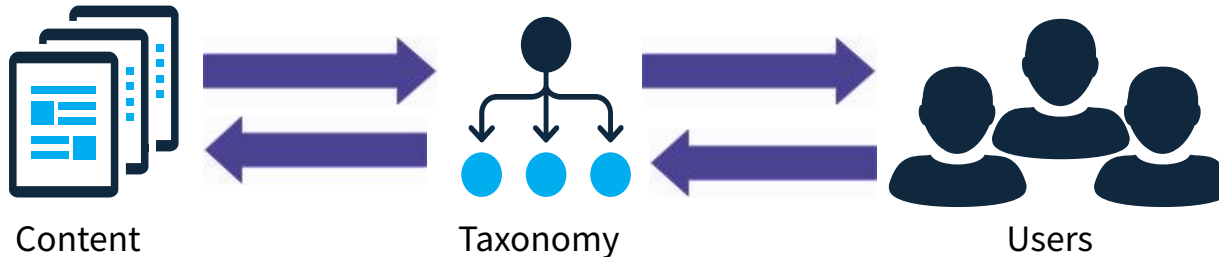
- ▶ A World Wide Web (W3C) recommendation www.w3.org/TR/rdf11-concepts
- ▶ “A standard model for data interchange on the Web”
- ▶ Requires the use of URIs to specify things and to specify relations.
- ▶ Models information as **subject – predicate – object** triples.



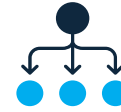


What and why taxonomies?

- ▶ A taxonomy is a controlled vocabulary organized into a hierarchical structure.
- ▶ Concepts/terms are used to tag/index/categorize content to make it easier to be found and retrieved
 - ▷ supporting better findability than search alone
- ▶ The taxonomy is an intermediary that links the user to the desired content.

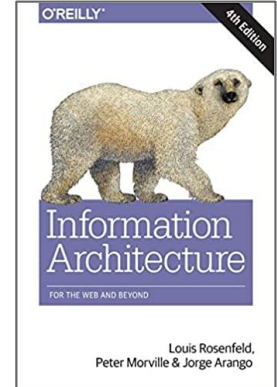


KG Components: Taxonomies



IA Definitions Related to Taxonomies

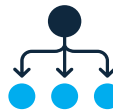
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- 2. The synthesis of organization, labeling, search, and navigation systems within digital, physical, and cross-channel ecosystems.
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- 4. Organizing and labeling web sites, intranets, online communities, and software to support findability and usability.
5. An emerging discipline and community of practice focused on bringing principles of design and architecture to the digital landscape.



-- Louis Rosenfeld, Peter Morville, and Jorge Arango, *Information Architecture, 4th ed.*, O'Reilly, 2015, p. 24

KG Components: Taxonomies

controlled



organized

What is a taxonomy?

Controlled and organized

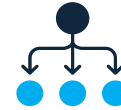
1. Controlled:

A kind of controlled vocabulary or knowledge organization system, based on unambiguous concepts, not just words:
things, not strings

2. Organized:

Concepts are arranged in a structure of hierarchies, categories, or facets to organize them.

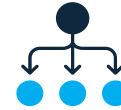
Preferred Label <input type="radio"/> Vorspeisen de <input type="radio"/> Appetizers en	 <ul style="list-style-type: none">Recipes<ul style="list-style-type: none">Cooking methods (5)Dishes (10)<ul style="list-style-type: none">Appetizers (3)<ul style="list-style-type: none">Bruschetta (0)Dips (3)<ul style="list-style-type: none">Guacamole (0)Hummus (0)Spinach dip (0)Quesadillas (0)Breads and muffins (2)Breakfast dishes (3)Desserts (4)Egg dishes (2)Meat & poultry (4)Pasta, rice, potatoes (3)Salads (4)Seafood (3)Soups and stews (2)Ingredients (5)Occasions (3)
Alternative Labels <input type="radio"/> Hors d'oeuvres en <input type="radio"/> Starters <input data-bbox="927 502 956 518" type="button" value="+"/>	
Hidden Labels <input type="radio"/> Appetisers en <input type="radio"/> Horderves <input data-bbox="927 704 956 720" type="button" value="+"/>	
Scope Notes <input type="radio"/> Dishes usually served as appetizers en <input data-bbox="927 868 956 884" type="button" value="+"/>	
Definitions <input type="radio"/> A small dish of food or a drink taken before a meal or the main course of a meal to stimulate one's appetite en	



SKOS (Simple Knowledge Organization System)



- ▶ A data model (“standard”) to represent knowledge Organization systems.
- ▶ A World Wide Web (W3C) recommendation (initial version 2004 - revised 2009)
- ▶ “A common data model for sharing and linking knowledge organization systems via the Web”
www.w3.org/TR/skos-reference
- ▶ To enable easy publication and use of such vocabularies as linked data.
- ▶ Based on RDF (Resource Description Framework), and encoded in XML, JSON, JSON-LD, etc.
- ▶ Concepts and relations are resources with URIs.
- ▶ A KOS built on SKOS is machine-readable and interchangeable.
- ▶ Different KOS types (name authority, glossary, classification scheme, thesaurus, taxonomy) can all be built in SKOS.

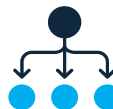


SKOS principles and elements



- ▶ A KOS is a group of **concepts** identified with URIs and
- ▶ Concepts can be grouped hierarchically into **concept schemes**.
- ▶ Concept can be labeled with any number of lexical strings (**labels**) in any natural language.
 - ▶ Concepts have one **preferred label** in any natural language, and any number of **alternative labels** and **hidden labels**.
- ▶ Concepts can be linked to each other using hierarchical and associative semantic **relations**:
 - ▶ **broader/narrower** and **related**.
- ▶ Concepts of different concept schemes can be linked using various **mapping relations**.
- ▶ Concepts can be documented with **notes**:
 - ▶ **scope note**, **definition**, **editorial note**, **history note**
- ▶ Concepts can additionally be members of **collections**, which can be labeled or ordered.

KG Components: Taxonomies

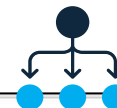


SKOS elements



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

KG Components: Taxonomies



Budgeting

+ Add to Collection Add to Blacklist Add to ExactMatch

<https://hidden-information.poolparty.biz/Examples/26>



Details Notes Documents Linked Data Triples Visualization Quality Management

SKOS Business +

Broader Concepts

[Finance](#)



Narrower Concepts

[Budget analysis](#)



Related Concepts

[Accounting](#)



Top Concept of Concept Schemes



Preferred Label

Budgeting

Alternative Labels

Budget management

Budget planning

Budgets



Hidden Labels



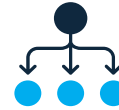
Scope Notes



Definitions



Basic SKOS view for
taxonomy editing

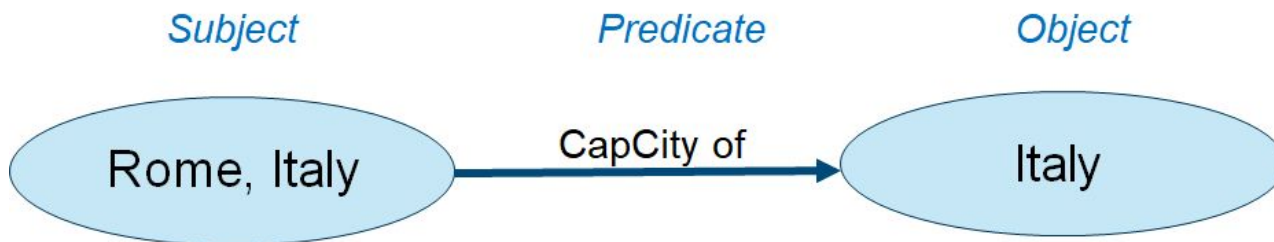


- ▶ Centrally managed taxonomies (not a taxonomy built in a siloed application), now tend to be built on the SKOS data-exchange model.
- ▶ Since SKOS is based on RDF, SKOS taxonomies are easily managed in RDF graph databases, and connect to the data, other taxonomies, and ontologies, in addition to linking to content.



Ontology

- ▶ A model of a knowledge domain
- ▶ Similar to (most of) a knowledge graph, but excludes the actual instance data
- ▶ A formal naming and definition of the types, properties and interrelationships of entities in a particular domain.
 - ▷ Relations contain meaning, are “semantic.”
 - ▷ Properties are customized attributes of entities.
- ▶ Common standards provided by W3C: Web Ontology Language (OWL) and RDF-Schema.
- ▶ Comprises classes, relations, and attributes, which are linked in triples.

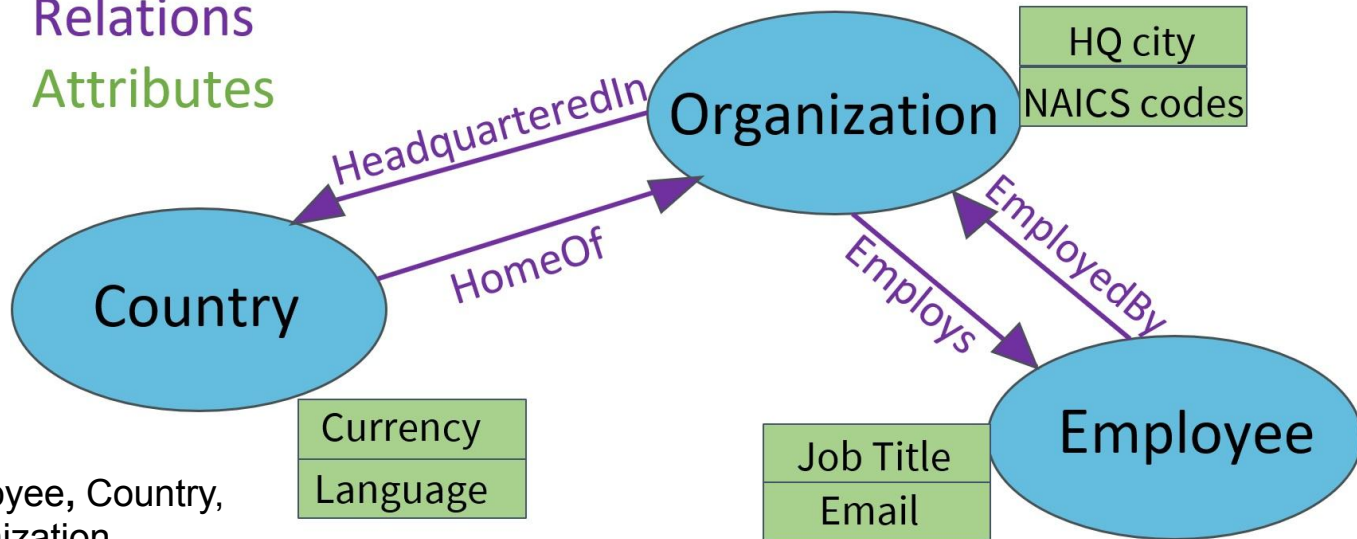


KG Components: Ontologies



Ontology

Classes
Relations
Attributes



Classes

Employee, Country,
Organization

Relations: HeadquarteredIn < > HomeOf
EmployedBy < > Employs

Attributes: Email address, Job title, HQ city, NAICS codes, Currency, Language

KG Components: Ontologies



W3C Standards and Guidelines for Ontologies

RDF (Resource Description Framework)

www.w3.org/TR/rdf11-concepts

“A standard model for data interchange on the Web” modeling triples



RDFS (RDF-Schema)

www.w3.org/2001/sw/wiki/RDFS

“A general-purpose language for representing simple RDF vocabularies on the Web”

Goes beyond RDF to designate **classes** and **properties** of RDF resources, as ontology basics

OWL (Web Ontology Language)

www.w3.org/OWL

“A Semantic Web language designed to represent rich and complex knowledge about things, groups of things, and relations between things”

Based on RDF and RDFS; OWL is an extension of RDFS.



SPARQL (SPARQL Protocol and RDF Query Language)

www.w3.org/TR/2008/REC-rdf-sparql-query-20080115

Language to query and update RDF data



KG Components: Ontologies



OWL-Specified Ontology Components

Entities – subjects or objects of triples (domains and ranges)

- ▶ **Classes**
 - ▷ Named sets of concepts that share characteristics and relations
 - ▷ May group subclasses or individuals (instances of the class)
- ▶ **Individuals**
 - ▷ Members or instances of a class. (Could be managed in a separate, linked taxonomy)



Properties – predicates of triples, about individuals

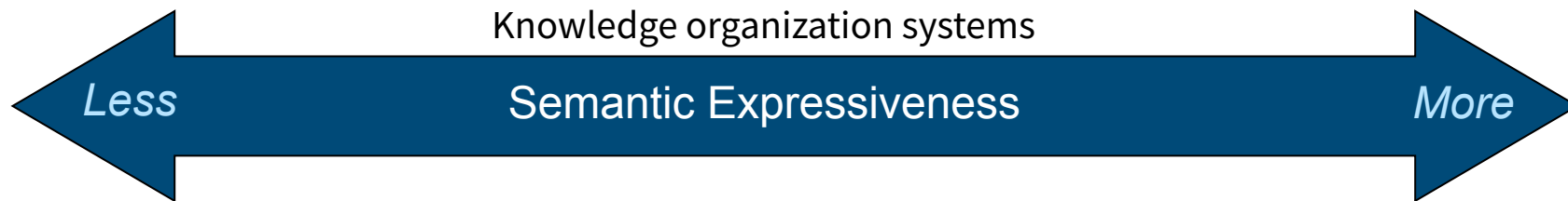
- ▶ **Object properties**
 - ▷ **Relations** between individuals
 - ▷ May be directed (single direction), symmetric, or with an inverse (different in each direction)
- ▶ **Datatype properties**
 - ▷ **Attributes** or characteristics of individuals
 - ▷ The object of a datatype property is a *value*.



Literals – values of attributes (metadata values)

<https://www.w3.org/TR/2012/REC-owl2-primer-20121211>

KG Components: Ontologies

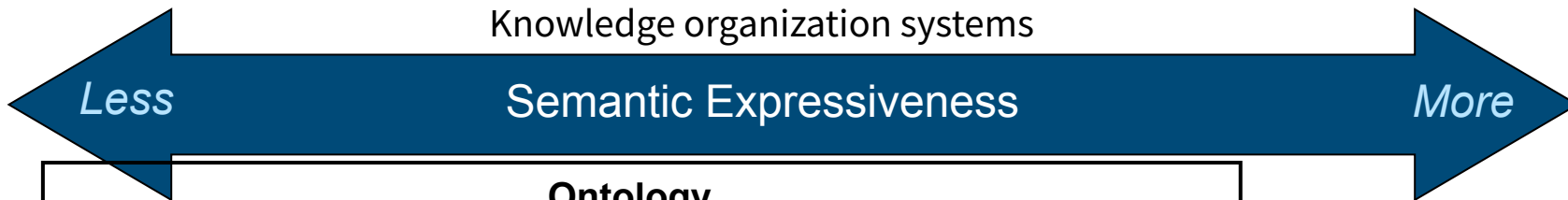


Term List	Name Authority	Taxonomy	Thesaurus	Ontology
Ambiguity control	Ambiguity control Synonym control (Attributes)	Ambiguity control (Synonym control) Hierarchical relationships	Ambiguity control Synonym control Hierarchical relationship Associative relationships	Semantic relationships Classes Attributes

KG Components: Ontologies



Knowledge organization systems

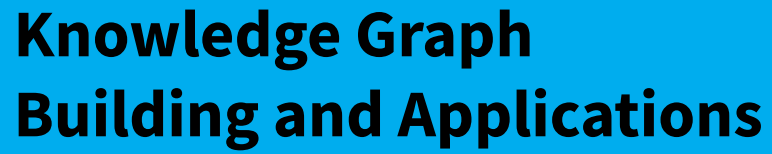


Ontology			
Term List	Name Authority	Taxonomy	Thesaurus
Ambiguity control	Ambiguity control Synonym control (Attributes)	Ambiguity control (Synonym control) Hierarchical relationships	Ambiguity control Synonym control Hierarchical relationship Associative relationships



What you can do with ontologies, that you cannot do with taxonomies alone

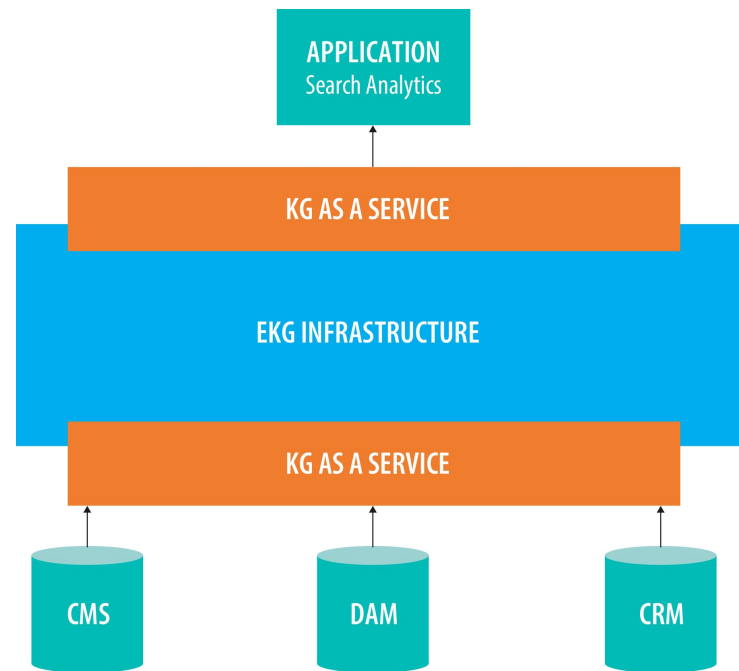
- ▶ Modeling complex interrelationships, such as those in processes, regulatory compliance, etc.
- ▶ Complex multi-part searches from different aspects
- ▶ Exploring explicit relationships between concepts beyond merely broader/narrower and generic related
- ▶ Searching across datasets as well as content
- ▶ Searching using more specific criteria that vary based on a category (class), such as ecommerce product attributes
- ▶ Merging information from multiple sources, internal and on the Web
- ▶ Rules-based auto-classification driven by specific classes and relationships
- ▶ Visualizing concepts and semantic relationships
- ▶ Reasoning based on statements (axioms) and inferencing

A blue rectangular box with a white vertical line on its left side. Inside the box, the text 'Knowledge Graph Building and Applications' is written in a bold, black, sans-serif font, arranged in two lines. The background of the slide is a light grey color with a faint, abstract network graph pattern consisting of white circles of varying sizes connected by thin white lines.

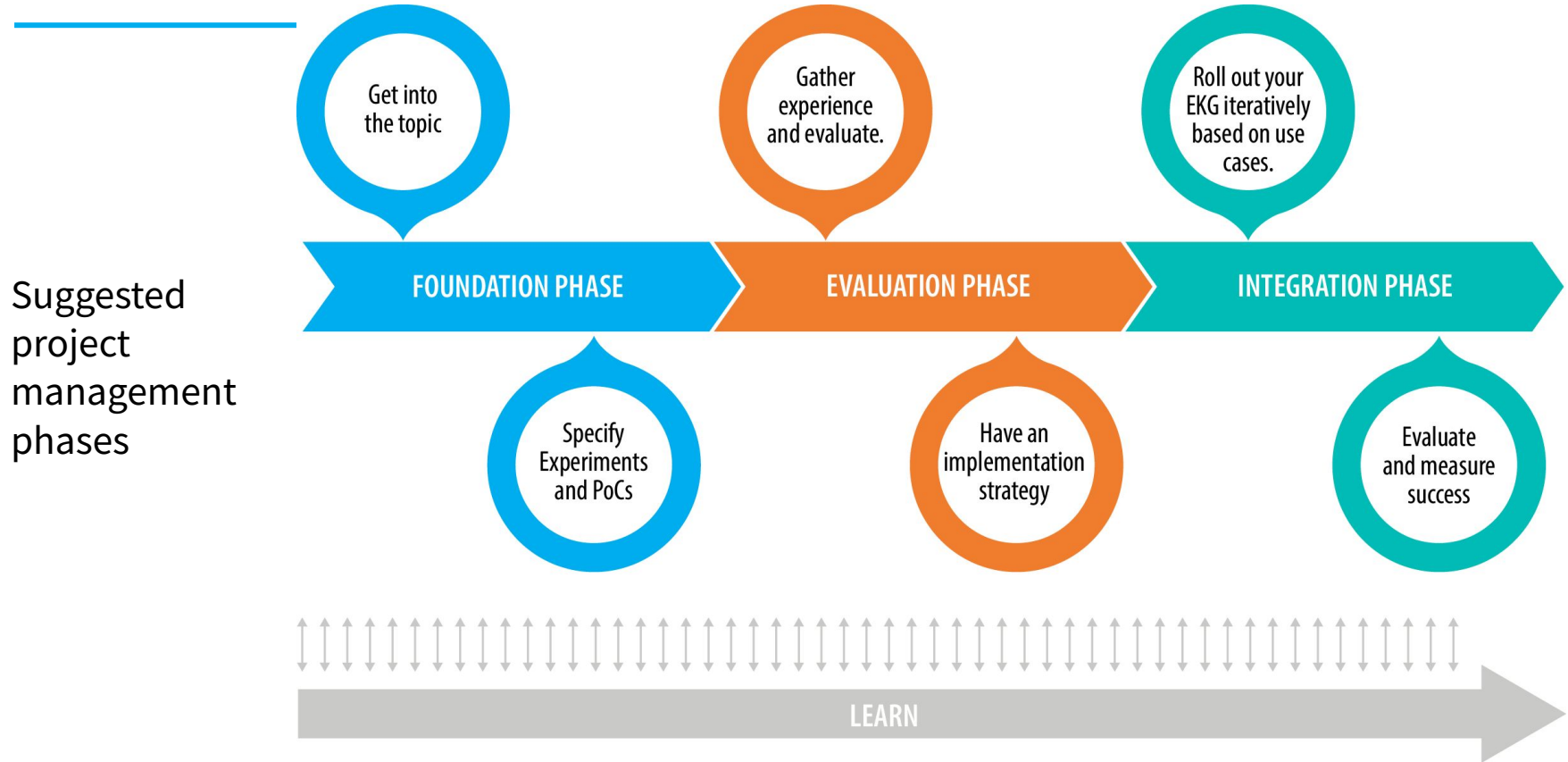
Building Knowledge Graphs

Steps to build a knowledge graph

- ▶ Identify use cases, problems to be solve
- ▶ Inventory and organize relevant data and content
- ▶ Identify relationships across data: design ontologies
- ▶ Incorporate sample data in a graph database connected to the ontology/taxonomy, as a test proof of concept.
- ▶ Connect to or build user applications and interfaces.
- ▶ Automate and scale with data pipelines, auto-tagging, and AI.



Building Knowledge Graphs



Building Knowledge Graphs

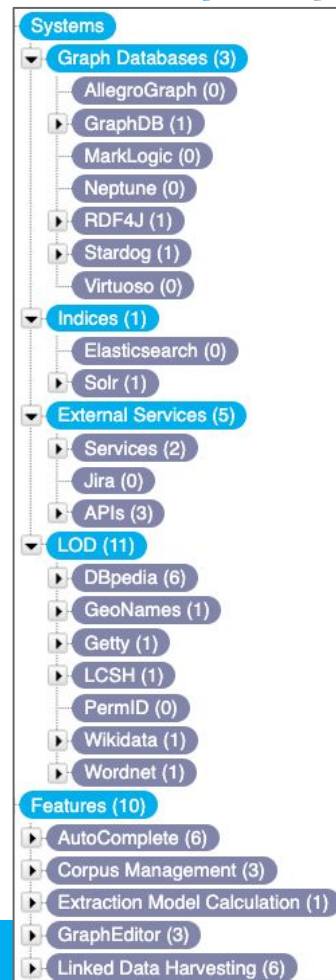
Software and technology needed

- ▶ Graph database management software
- ▶ Taxonomy/ontology management software based on W3C standards
- ▶ Search software (such as Solr or Elasticsearch)
- ▶ Front-end (web) application
 - ▷ whether commercial software or custom web developed user interface based on an API connection

Optional:

- ▶ Data catalog software
- ▶ Text mining/natural language processing/entity extraction tool
- ▶ Machine-learning auto-classification tool
- ▶ Capabilities (such as algorithms for weighting/scoring relations) specified in SPARQL query language for RDF

Often these are combined, but there is no single “knowledge graph software.”



Collaboration of people:

- ▶ Data engineers
- ▶ Data scientists
- ▶ Data analysts
- ▶ Data architects
- ▶ Knowledge engineers
- ▶ Taxonomists
- ▶ Ontologists
- ▶ Content strategists
- ▶ Solutions architects
- ▶ Software engineers
- ▶ Web developers
- ▶ Information architects

Challenges/Requirements:

- ▶ A specific business/use case, not just curiosity to try new technologies
- ▶ Implementation expertise with software tools and guidance from consultants
- ▶ Commitment from all stakeholders
- ▶ Sufficient time, effort, and expertise to deal with a very complex project
- ▶ Data quality

Knowledge Graph Applications

Applications



Semantic search



Recommendation



Intent

Personalization and insight engines



Question-answering engines / natural language search across data



Compliance and risk prediction



Chatbots and voice assistants



Expert finder



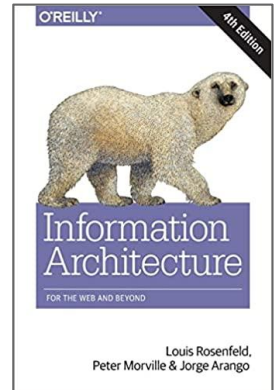
Customer 360 – view of everything known about customers

- ▶ An organization typically builds its own web-browser-based knowledge graph application.
- ▶ The application UI and UX also utilize information architecture.



IA Definitions

1. The structural design of shared information environments.
2. The synthesis of organization, labeling, search, and navigation systems within digital, physical, and cross-channel ecosystems.
- 3. The art and science of **shaping information products and experiences** to support usability, findability, and understanding.
4. Organizing and labeling web sites, intranets, online communities, and software to support findability and usability.
5. An emerging discipline and community of practice focused on bringing principles of design and architecture to the digital landscape.



-- Louis Rosenfeld, Peter Morville, and Jorge Arango, *Information Architecture, 4th ed.* , O'Reilly, 2015, p. 24

Knowledge Graph Applications

Knowledge Panels delivery of information from the Google Knowledge Graph



About



Sir Timothy John Berners-Lee, OM, KBE, FRS, FEng, FRSA, DFBCS, RDI, also known as TimBL, is an English computer scientist best known as the inventor of the World Wide Web. He is a professorial research fellow at the University of Oxford and a professor emeritus at the Massachusetts Institute of Technology. [Wikipedia](#)

Born: June 8, 1955 (age 67 years), London, United Kingdom

Spouse: [Rosemary Leith](#) (m. 2014), [Nancy Carlson](#) (m. 1990–2011)

Siblings: [Mike Berners-Lee](#)

Dates knighted: 1997, 2004

Parents: [Conway Berners-Lee](#), [Mary Lee Woods](#)

Organizations founded: [World Wide Web Consortium](#), [MORE](#)

Education: [The Queen's College \(1973–1976\)](#), [Emanuel School \(1969–1973\)](#), [Sheen Mount Primary School](#)



Feedback

Profiles



Twitter

Feedback



Boston

City in Massachusetts

Boston, officially the City of Boston, is the capital and largest city of the Commonwealth of Massachusetts and the cultural and financial center of the New England region of the Northeastern United States. The city boundaries encompass an area of about 48.4 sq mi and a population of 675,647 as of 2020. [Wikipedia](#)

Area: 89.63 mi²

Weather: 56°F (13°C), Wind W at 11 mph (18 km/h), 77% Humidity [More on weather.com](#)

Population: 654,776 (2021)

Local time: Thursday 10:25 PM

Neighborhoods: [South Boston](#), [East Boston](#), [North End](#), [Downtown](#), [MORE](#)

Clubs and Teams: [Boston Celtics](#), [Boston Bruins](#), [Boston Red Sox](#), [MORE](#)

Colleges and Universities

View 30+ more



Northeast...
University



Boston
University



UMass
Boston



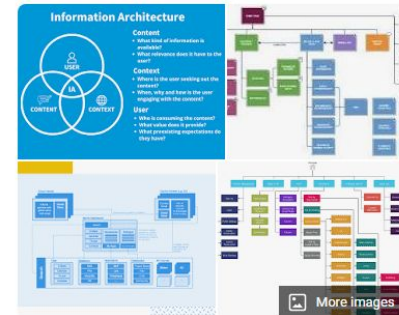
Suffolk
University

Events

Fri, Mar 24
8:30 AM

Open Game Room
Cohasset

Information architecture



Information architecture is the structural design of shared information environments; the art and science of organizing and labelling websites, intranets, online communities and software to support ... [Wikipedia](#)

4 types

4 types of information architecture

Examples

What is information architecture examples

8 principles

What are the 8 principles of information architecture

How to

How to do a information architecture

More

Information Architecture Books



Information



How to Make



Information

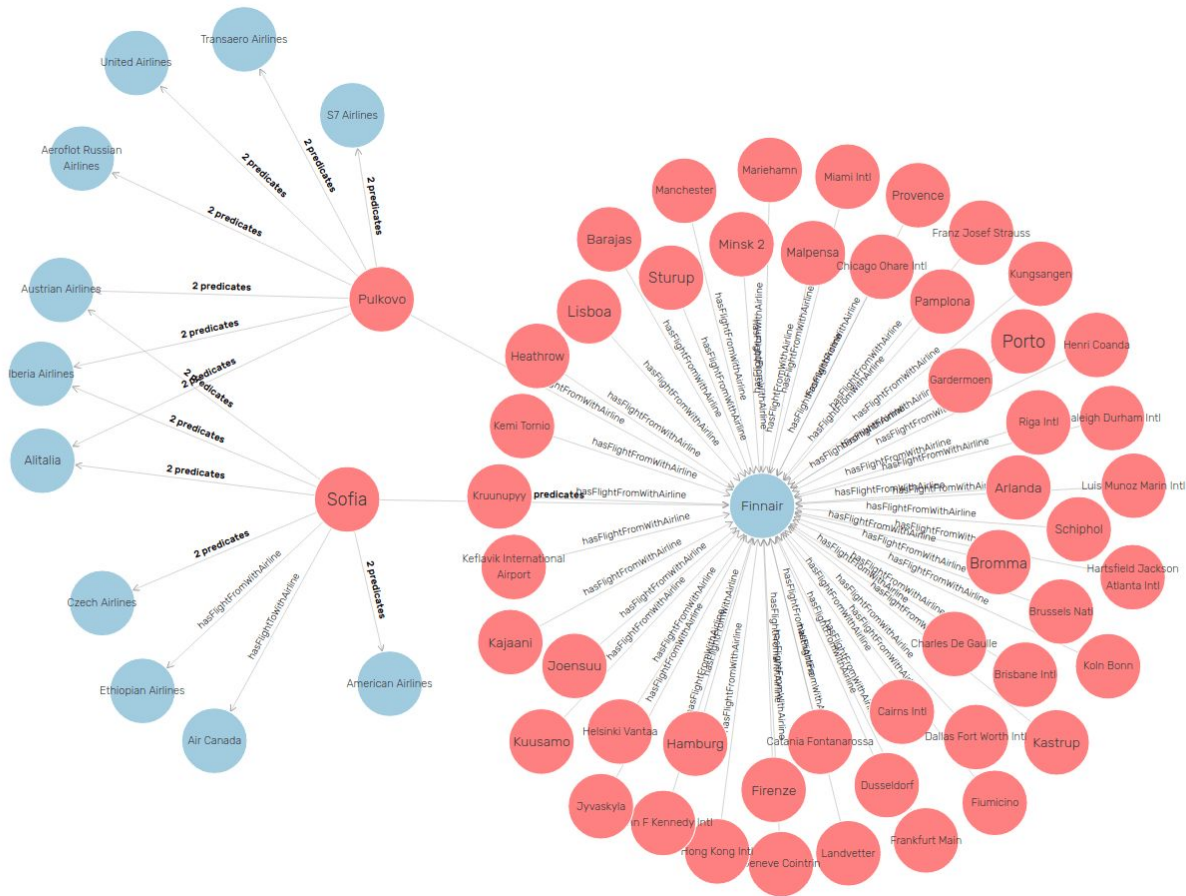


Understandin

Knowledge Graph Applications

Graph visualizations

Airlines and destinations from GraphDB, a triple store graph database



Sample Applications

- ▶ Healthdirect Australia - public website health symptom checker
<https://www.healthdirect.gov.au/symptom-checker>
- ▶ Semantic Web Company's HR Recommender proto-type
<https://hr-recommender.poolparty.biz/hr-recommender/overview>
- ▶ Semantic Web Company's Wine & Cheese Harmonizer
<https://ppil-dev.semantic-web.at/PPIL>
- ▶ QAnswer
<https://www.qanswer.eu>

Meet these Employees

Move the sliders to see the coworkers that best match your strengths

[RESET SLIDERS](#)
 + bootstrapping

 + computer science

 + CSS

 + development






 + Frontend developer

 + HTML

 + JavaScript

 + React

 + style sheet languages

Employee	Strengths	
 Matthew Walker	JavaScript, HTML, C++, C#, PHP, web programming, Prolog, AJAX, Pascal, C	get in contact
 Florian Bernard	JavaScript, CSS, style sheet languages, Python, Jboss, ASP.NET, Prolog, AJAX, C	get in contact
 Richard Vestnes	HTML, CSS, style sheet languages, Python, Jboss, ASP.NET, PHP, MATLAB	get in contact
 Sophie White	JavaScript, CSS, style sheet languages, Java, C#, Scratch, JavaScript Framework, Perl	get in contact
 Maria Sanz	Frontend developer, Python, C#, PHP, Delphi, AJAX, Perl, Objective-C	get in

Demo HR Recommender: Recommendations for matches of employees, projects, and open positions, based on profiles and taxonomy/ontology links

HR Recommender - Employees

These are the people you should be talking to! Here you find coworkers that match your strengths and interests. The recommendation is based on your footprint and may be fine-tuned by using the sliders to boost or weaken a strength.

Filter documents

Wines



Cheeses



Cheese descriptors



- Semi-hard cheese (26)
- Creamy (23)
- Higher fat (21)
- Salty (12)
- Mild (11)
- Mature (10)
- Nutty (9)
- Hard cheese (7)
- Young mature (7)
- Lower fat (6)

Wine descriptors



Entity types



Add concept manually | Full text search



Selected Filters:



Generate URL

114 results

2017-07-04 - 14:25:25

Allram Grüner Veltliner Eiswein 2015

Brilliant golden yellow, very typical varietal character on the nose; dense with notes of caramel and spice; dainty wooden nuances reveal traces of spice, clove cinnamon. Gorgeously focused and...

Wine Sweet Undergrowth aroma Clove Caramelized Pepper Low alc Cinnamon Austrian wine Grüner Veltliner Sweet wine

SIMILAR DOCUMENTS



2017-09-11 - 13:34:58

Baumgartner Blauer Zweigelt

Wine Dry High alc Low tannin Strawberry Pepper Medium acidity Plum Blauer Zweigelt

SIMILAR DOCUMENTS



2017-07-04 - 15:51:51

Beemster Classic Aged

Beemster Classic Aged Cheese is really something to enjoy. The cheese is aged in Beemster it enough time to fully ripen and to create a unique and full flavor with lovely...

Creamy Higher fat Mature Salty Hard cheese Beemster cheese Cow's milk cheese Cheese

SIMILAR DOCUMENTS



Demo Recommender:
Wine & Cheese
Harmonizer
Starts as familiar
faceted search, but
then recommends
wines to go with
cheese, or cheese to
go with wine.



bank of america



Bank of America
 Founded: 1998
 HQ: Charlotte, North Carolina
 Sector: Financials
 Subsector: Diversified Banks
 Stock ticker: BAC

Key Executives

- Mr. Aditya Bhasin (Chief Technology & Information Officer)
- Mr. Matthew M. Koder (Pres of Global Corporation & Investment Banking)
- Mr. Rudolf A. Bless (Chief Accounting Officer)
- Mr. Christopher M. Hyzy (Chief Investment Officer)
- Mr. Thomas M. Scrivener (Chief Operations Executive)
- Mr. Alastair M. Borthwick (Chief Financial Officer and Vice Chair of Global Diversity & Inclusion Council)
- Mr. Geoffrey S. Greener (Chief Risk Officer)
- Mr. Paul M. Donofrio (Vice Chairman)
- Mr. Dean C. Athanasia (Pres of Regional Banking)

Personalized insight engine demo from Squirro.
 "Impersonate" roles for tailored results.



Bank of America



International Paper



Amgen



Cboe Glo

Bank of America Declares Preferred Stock Dividends

Dateline City: Charlotte Bank of America Corporation today announced the Board of Directors has authorized regular cash dividends on the outstanding shares or depository shares of the following series of preferred stock: Series of Preferred Stock Dividend per Share or...

3 years ago · newsroom.bankofamerica.com

Bank of America Sets Company Record for Patents Filed and Granted During First Half of 2020

Dateline City: Charlotte Bank of America today announced it has recorded the most patents filed and granted in the first half of any year in the history of the company. The bank achieved that mark during a time in which the company also aligned more than 85% of employees to work...

3 years ago · newsroom.bankofamerica.com

Bank of America Expands Support of Boys & Girls Clubs of America With \$1 Million Grant to Support Educational Programs

Dateline City: Charlotte The Bank of America Charitable Foundation has awarded a \$1 million grant over two years to support a Boys & Girls Clubs of America tutoring program for youth ages 6 to 18 in 10 communities across the country. The initiative is an extension of Project...

3 years ago · newsroom.bankofamerica.com

International Paper CEO to Speak at Bank of America Merrill Lynch 2021 Global Agriculture and Materials Conference



Impersonate

- Impersonate
- Chief Technology Officer
- ESG investor
- Investment banker

Rockwell Automation

Henry Schein Lumen Technologies

Trane Technologies Positive Sales Outlook

Booking Holdings Goldman Sachs

New Debt carbon CME Group ResMed Walmart Discover Financial Sales Outlook ESG

Public Storage accounting Duke Energy ESG

Bank of America

Johnson & Johnson Ball Corporation Extra Space Storage

Origo Plan to Finance

Debt IBM

Dividend

M&A Equinox MetLife

Regulatory impact

Cboe Global Markets

AMD Lincoln Financial

Completed Financial Investment

Intuit SBA Communications

DaVita Inc. Boston Scientific

Phillips 66

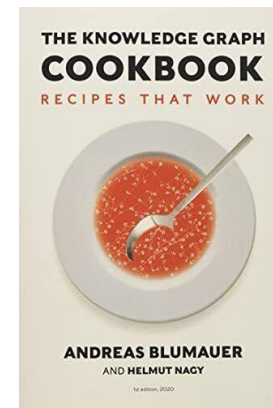
LyondellBasell

Envyout

- ▶ Information architects who work on taxonomies:
 - ▷ should understand that a growing use of taxonomies is in knowledge graphs
 - ▷ may expect to work on taxonomies used in knowledge graphs
 - ▷ may have the opportunity and interest in designing ontologies
- ▶ Information architects who work on search/browse/faceted navigation user interfaces:
 - ▷ may contribute to the UIs of knowledge graph applications
- ▶ Information architects can raise awareness of the benefits of knowledge graphs within their organizations.

Knowledge Graph Resources

- ▶ [The Knowledge Graph Conference](#), New York, NY, and hybrid virtual, May 8-12, 2023
- ▶ [The Knowledge Graph Conference Slack Channel community](#) and other resources
- ▶ “[Unlocking Digital Transformation with Knowledge Graphs](#),” webinar recording, Andreas Blumauer (Semantic Web Company) and Bram Wessel (Factor), April 7, 2022
- ▶ “[How to Build a Knowledge Graph in Four Steps: The Roadmap From Metadata to AI](#)” by Lulit Tesfaye, September 9, 2019, Enterprise Knowledge Blog.
- ▶ [The Knowledge Graph Cookbook](#), by Andreas Blumauer and Helmut Nagy, 2020, paperback or free as ebook.
www.poolparty.biz/the-knowledge-graph-cookbook



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Semantic Web Company www.semantic-web.com

PoolParty software www.poolparty.biz