# From Google Knowledge Graphs to Google Knowledge Vault:

# Applications of Ontology

#### Introduction

The future semantic web pictures a web of data represented by entities and relations using ontology, rather than data referenced in databases, or data represented by text content of web pages. Google Knowledge Graph is a step towards building a entity-relation graph database, and Google Knowledge Vault is an enhanced version of knowledge graph using automatic crawling to gather information and machine learning to assign probability to facts.

## **Build Semantic Web with Ontology**

Semantic web is a vision brought up in the article "The Semantic Web" (Berners-Lee et al.) in May 2001. The current World Wide Web (WWW) is a web of documents that are linked in various ways including via hyperlinks. But from the data point of view, the data are not independent of the of documents' contents, and needs to be extracted from the documents by human before being used by automatic information processing methods on the web.

The Semantic Web is an extension of the World Wide Web that will develop a set of protocols, formalisms and standards to transform the Web of pages into a Web of Data. So the links will be between data rather than pages, and the data will be able to accessed independently of the pages and applications contain them. The web of data enables the sharing and integration of data in different formats from different sources.

In data curation, ontologies provide a way to abstract away from data structures such as tables and trees, and focus on facts about real world, things, attributes, and relationships in the domain. Ontologies often include very abstract concepts such as physical object, set, event, time interval, property, number, and etc, and are usually intended to be relatively stable and multi-purpose. So it's also called a conceptual level schema.

ER(Entity-relationship) model is an early form of ontological perspective on data in old days. Today, ontologies are most often expressed formally In RDFS or OWL. They are powerful logic based languages that are designed to be read and processed by computer software, including inferencing systems. They're used more generally to implement any ontology for computer processing, and are the foundation for the semantic web.

RDFS and OWL provide the conceptual model for RDF triples( Subject, Predicate and Object), which Google Knowledge Vault uses to build graph databases.

## Apply Ontology to Knowledge Graph

In May 2012, Google launched Knowledge Graph. Google Knowledge Graph is not an individual product to use, but rather appears as a card to the right of the links to the top ranked search results, and contains popular facts about the queried entity (people, places, things, and etc) extracted from high-ranking sites to provide the direct answers. So the users don't have to browse through the returned links to find the answers. Knowledge Graph appears in the search results only when Google deems it relevant according to the type of entity being queried.

Knowledge graph is usually useful providing direct answers to searched question, but it may prevent searchers from visiting the sites at the top of the Search Engine Results Pages (SERPs). Knowledge Graph Optimizers and techniques emerged in addition to the traditional Search Engine Optimizers to improve rank of pages.

On the other hand, Knowledge Graph is also a database of facts and entities used by Google to enhance its search engine behind the scenes. It's algorithm is engaged to gather information from different trustworthy archives like Wikipedia, Freebase and CIA World Factbook.

Google acquired Metaweb in 2010, and used MetaWeb's in-house structured database: Freebase to construct Knowledge Graph. Freebase uses a graph model that defines its data structure as a set of nodes and a set of links that establishes relationships between the nodes. It's an intuitive implementation of ontology that deeply understand the meanings of words and represent data as data, instead of using tables and keys to reference the data as matched patterns of letters as in relational databases.

Freebase's algorithm understands facts about people, places and things and how these entities are all connected to construct the graphs. Now Google Knowledge graph continues to detect almost everything like noun, persons and object. These things are technically known as "entity" and this process of detection is popularly known as "entity recognition".

Entity recognition and knowledge graphs database allow Google to move toward a new way of searching: not for pages that match query terms, but for "entities" or concepts that the words describe, and present the entities as a Knowledge Graph boxes within its search results to provide direct answers.

Freebase contained data harvested from sources such as Wikipedia, NNDB, Fashion Model Directory and MusicBrainz, as well as data contributed by its users. Google Knowledge Graph contains data gathered from Wikipedia, Freebase and CIA World Factbook.

By May 2020, the information covered by Google Knowledge Graph had grown to 500 billion facts on 5 billion entities.

#### Add Automatic Crawling and Probability Assignment to Google

## **Knowledge Vault**

In 2014, Google raised the concept of Knowledge Vault, an upgraded version of Knowledge Graph that scales and can identify whether something is true or not by checking a "knowledge base of content" in the research paper "Knowledge Vault: A Web-Scale Approach to Probabilistic Knowledge Fusion". A knowledge base is a system that stores information so that machines as well as people can read it. However, a knowledge base deals with facts rather than textual data.

Knowledge Vault is aimed being the "the largest store of knowledge in human history," by using an algorithm to autonomously gather and merge information all over the web(text, tabular data, page structure, human annotations, and etc), and turn the raw data into usable pieces of facts and relationships based on all existing knowledge using machine learning without human editorial involvement.

Knowledge Vault resort to existing knowledge bases such as Freebase to validate facts and assign confidence scores to the truthfulness of facts during its "link prediction in a graph" process. The process uses either "path ranking algorithm (PRA)" method or "neural network model (MLP)" method. It also uses a "quiz crowdsourcing approach" to find knowledgeable people who might answer questions that add to the Knowledge Vault, according to the article "titled Quizz: Targeted Crowdsourcing with a Billion (Potential) Users".

The main components of Knowledge Vault include extractors, graph-based priors, and knowledge fusion. The extractors extracts triples (subject, predicate, object) from Google's Knowledge Graph or other large data sets and assign confidence scores. The graph-based priors can learn from existing knowledge bases. The knowledge fusion reaches a final score on factual probability.

By cross-referencing new facts with what it already knows, Google Knowledge Vault has extracted 271 million "confident facts", facts that are considered more than 90 per cent chance of being true, from 1.6 billion pulled facts, 4469 relation types and 1100 kinds of entities in 2016.

Knowledge Graph is already being used by systems to help robots and smartphones to understand what people ask them, and hence to provide answers. Looking forward, Knowledge Vault, if assembled in the future, could make possible all sorts of new applications and computing scenarios, such as future artificial intelligence applications, machine-to-machine communication, augmented reality, predictive models and virtual assistant use cases. In addition, Google may implement Knowledge Vault as a separate searching service like Microsoft's "Bing Entity Search API", or it may choose to integrate Knowledge Vault as part of the automated knowledge gathering component of its current search engine, and continue present it as the enhanced Knowledge Graph.

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