



Give your Ontology The Cognitive Diet It Deserves

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Session Topics

- Building taxonomies and ontology has been for years a current practice for data modelling to power information applications
- For an ontology, the biggest focus can be on creating its data schema (classes, attributes of classes and relationships between the classes) and then on *manually* populating it with instances of classes, properties and relationships
- Using a cognitive technology to automate the feeding of the ontology with facts derived from the content can help address this challenge



Ontologies, Taxonomies and Knowledge Bases Some definitions

- **Ontology** : a conceptual model representing a specific field of information
 - Classes (e.g. "person", "organization", "dog")
 - Attributes of classes ("age", "birth date", "foundation date")
 - Relationships between classes ("marry", "own", "hire")
- **Taxonomy :** is the science of classification according to a predetermined system
 - Taxonomy is the process of naming and classifying things such as animals and plants into groups within a larger system, according to their similarities and differences.
- Knowledge Base (KB) : contains the ontology model plus the instances of
 - Classes ("John Smith", "Expert System", "Buddy"),
 - Properties ("John Smith is 25 years old")
 - Relationships ("Expert System hired John Smith")
 - Adding instances to an ontology model = "populating" the ontology
- Ontologies and KBs use RDF/RDFS as the representation language
- OWL enables more complex definitions of classes and relationships
- An OWL ontology can include axioms to leverage automated reasoning over the model

Your Ontology before its diet Empty ontology model





Your Movie Ontology before its diet





Populating an Ontology A challenging task

- Transforming an ontology into a rich and accurate KB is quite challenging
 - Requires access to (and validation of) a large amount of information
 - NLP helps automate this process, extracting valuable information from documents and framing it in an ontology model





The Diet for your Ontology is NLP What features?

- <u>https://www.youtube.com/watch?v=Kzt7pd-YfMU</u>
- Part of Speech recognition
- Tokenization, Lemmatization, Morphologic Analysis
- Syntactic Processing
- Full Sentence and inter-sentence parsing
- Co-reference and anaphora resolution
- Entity extraction and disambiguation
- Entity linking using Linked Open Data
- Rule-based extraction and categorization
- Machine learning
- Ontology and taxonomy management
- Automatic enhancement for ontology and taxonomy



The Diet for your Ontology is NLP

Disambiguation based on understanding the context

Which "gas" means "gasoline" ?





The Diet for your Ontology is NLP

Disambiguation based on context and external properties (LODs)

Which "Paul Smith" am I talking about ?

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The Diet for your Ontology is NLP

Disambiguation based on context and external properties

Which "Paul Smith" am I talking about ?

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Preparing Your Ontology's Diet Ingredients for your ontology

- NLP that enables advanced cognitive rule writing
 - Supports effective extraction of class instances, properties & relationships

Template COMPANY_EMPLOYS_PERS NAME_OF_COMPANY NAME_OF_PERSON RELATE COMPANY_LOCATED_PLACE NAME_OF_COMPANY PLACE COMPANY_NAME COMPANY_NAME	Type Rules 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2 2	Google Inc. just fired Mike Holson without any notice. Since our founding in 1998, Google has grown by leaps and bounds. Google is located in Mountain View, California, Mike Holson was hired by IBM in 2015. Mike is the child of David Holson. Mike was born in 9/12/1981. From offering search in a single language we now offer dozens of products and services - including various forms of advertising and web applications for all kinds of tasks - in scores of languages. And starting from two computer science students in a university dorm room, we now have thousands of employees and offices around the world. A lot has changed since the first Google search engine appeared. IBM's headquarters are in NYC. David Holson is a very rich man, mentioned in the list of Forbes 2014.
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Rules	Inst	Inces NAME_OF_PARENT David Holson



Start feeding Your Ontology

The diet turns the ontology in a Knowledge Base

Mike Holson is 30 years old and lives in New York. He's the child of David Holson, founder of a real estate company. Mike was born on September 12, 1981.





It's Served Hot !

Well-fed ontology leverages information applications

- On top of the Triple Store, an information application allows end users to interact with the well-fed ontology and content by asking questions in natural language
- A Natural Language-to-SPARQL module translates the query to SPARQL and runs the query against the Triple store endpoint, retrieving the results in RDF
- The answer to the question is displayed to the end user

In which city are the headquarters of the company which hired David Holson's son?	
Ask	
SPARQL Query:	
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It's Served Hot ! Well-fed ontology leverages information applications

Query result:	
New York	Show / Hide documents
Label: Mike Holson	
Google Inc. just fired Mike Hols Mike Holson was hired by IBM products and services including science students in a university	on without any notice. Since our founding in 1998, Google has grown by leaps and bounds. Google is located in Mountain View, California. in 2015. Mike is the child of David Holson. Mike was born in 9/12/1981. From offering search in a single language we now offer dozens of a various forms of advertising and web applications for all kinds of tasks in scores of languages. And starting from two computer dorm room, we now have thousands of employees and offices around the world. A lot has changed since the first Google search engine
Label: IBM	
Google Inc. just fired Mike Hols Mike Holson was hired by IBM products and services including science students in a university	on without any notice. Since our founding in 1998, Google has grown by leaps and bounds. Google is located in Mountain View, California. in 2015. Mike is the child of David Holson. Mike was born in 9/12/1981. From offering search in a single language we now offer dozens of g various forms of advertising and web applications for all kinds of tasks in scores of languages. And starting from two computer dorm room, we now have thousands of employees and offices around the world. A lot has changed since the first Google search engine
Label: New York	
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Wrap-up

- Feeding your ontology w/ instances & relationships is essential
- Al/Cognitive technology leverages semantic reasoning to :
 - Automatically feed your ontology based on your content
 - Resolve ambiguity for a comprehensive view of each entity
 - Maintain up-to date knowledge
- The result ? A well-fed ontology
 - Provides end-users with relevant insights based on semantic triples extracted from your content







- Largest pure-play vendor of Al/Cognitive Computing & Text Analytics solutions
- 7 Countries / 250+ employees

COGITO

Award-winning, patented technology Text Analytics/NLP & Ontology Management Gartner, Forrester

- Diversified Business
 - Publishing & Media
 - Finance & Insurance
 - Life Sciences
 - Federal



References







Thank You

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