

# Ontology Learning from Linked Data

TP\_JAN2021\_slide

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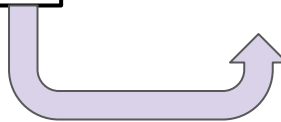
## Q1. How to discover knowledge from text?

Google was founded in September 1998 by Larry Page and Sergey Brin while they were Ph.D. students at Stanford University in California.

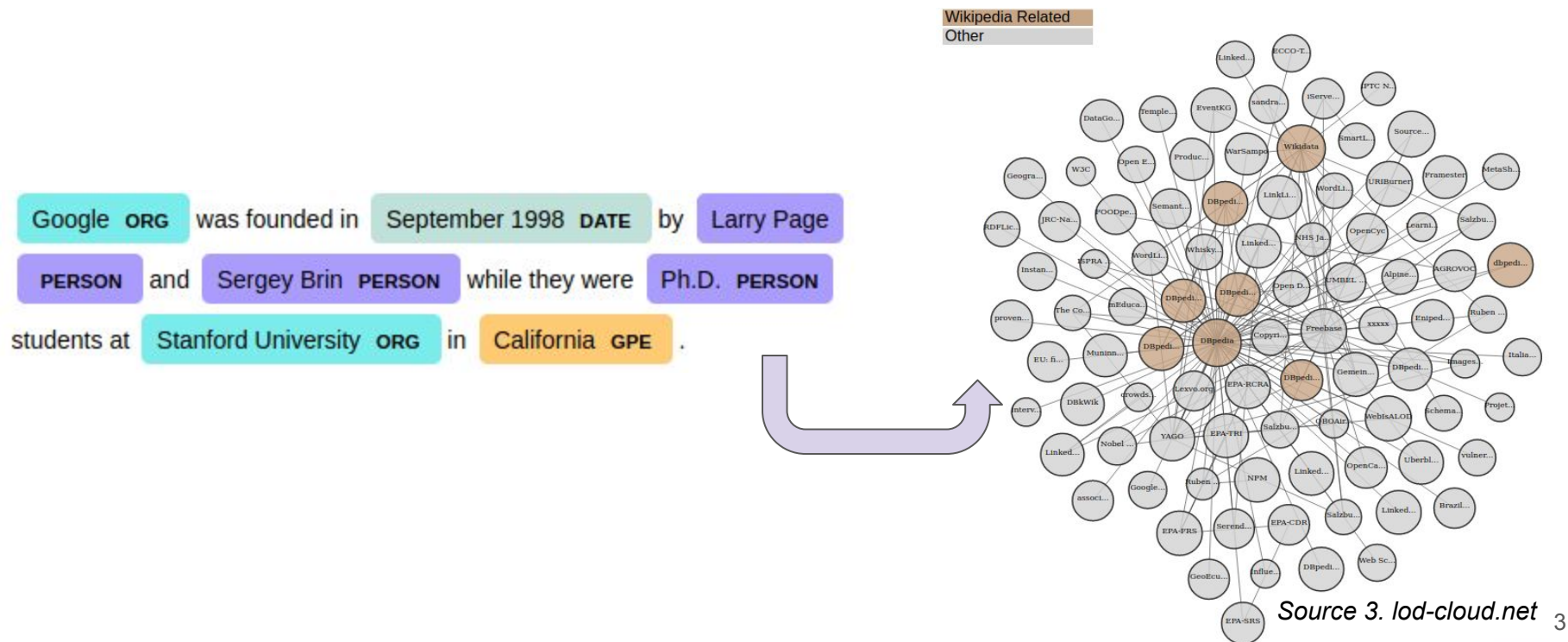
Source 1. Wikipedia Google

Google **ORG** was founded in September 1998 **DATE** by Larry Page **PERSON** and Sergey Brin **PERSON** while they were Ph.D. **PERSON** students at Stanford University **ORG** in California **GPE**.

Source 2. Entity Visualizer

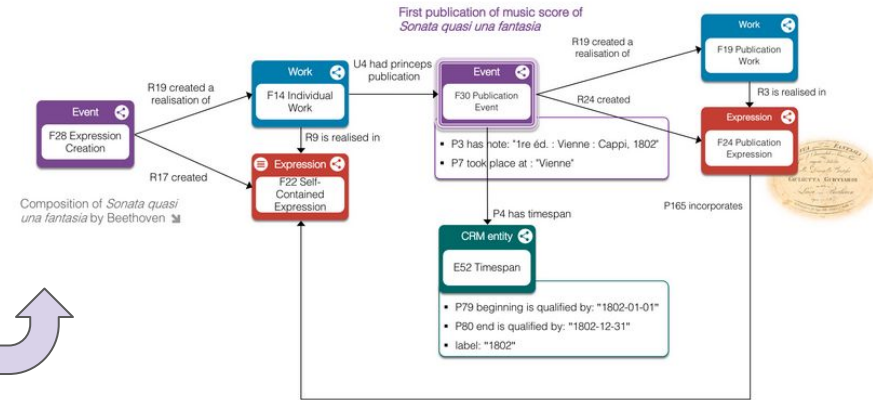
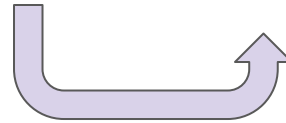
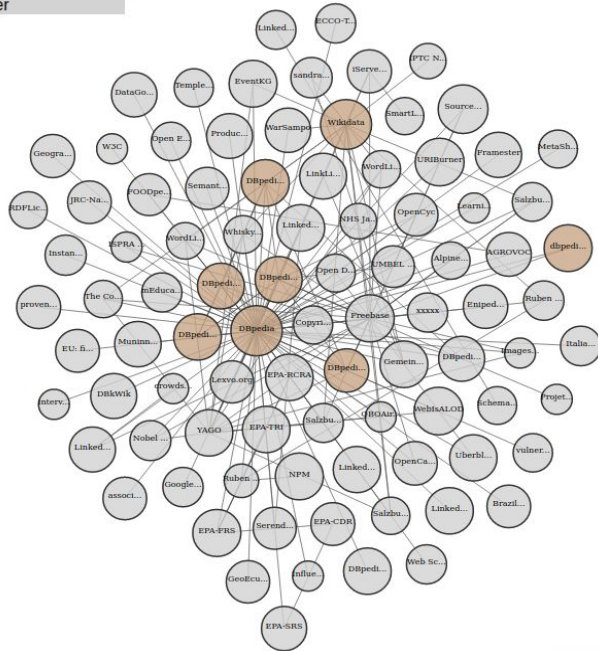


## Q2. How to link the knowledge from text with the knowledge of web?



# Q3. How to build domain ontology from them?

Wikipedia Related  
Other



Source 4. [data.doremus.org](http://data.doremus.org)

# The Goal of this TP

Q1. How to discover knowledge from text?

- Learn about ontology building steps

Q2. How to link the knowledge from text with the knowledge of web?

- Practice with SPARQL queries to prepare for ontology building

Q3. How to build domain ontology from them?

- Experiment with machine learning techniques for knowledge discovery

# The Introduction of Web Ontologies

## DBpedia

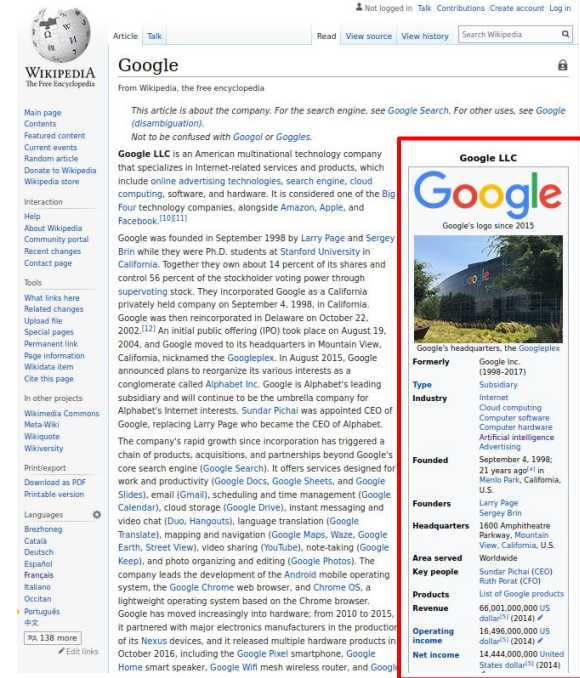
Background: DBpedia is the most popular and prominent web ontology. Since the first public release in 2007, DBpedia is up-dated roughly each year.

Knowledge Acquisition Method: DBpedia is created from **automatically-extracted** structured information contained in Wikipedia, such as from **infobox tables**, categorization information, geo-coordinates, and external links.



Utilities: DBpedia is used extensively for research, but is also relevant in commercial settings: companies use it to organize their content, such as the BBC and the New York Times.

Hint: A classes visualizer of DBpedia:

<<http://mappings.dbpedia.org/server/ontology/classes> >



The image shows a screenshot of the Wikipedia article for Google. The infobox on the right is highlighted with a red box and contains the following information:

Google LLC	
	Google's logo since 2015
	Google's headquarters, the Googleplex
<b>Formerly</b>	Google Inc. (1998–2017)
<b>Type</b>	Subsidiary
<b>Industry</b>	Internet Cloud computing Computer software Computer hardware Artificial intelligence Advertising
<b>Founded</b>	September 4, 1998; 21 years ago <sup>(H)</sup> in Mountain View, California, U.S.
<b>Founders</b>	Larry Page Sergey Brin
<b>Headquarters</b>	1600 Amphitheatre Parkway, Mountain View, California, U.S.
<b>Area served</b>	Worldwide
<b>Key people</b>	Sundar Pichai (CEO) Ruth Porat (CFO) List of Google products
<b>Products</b>	List of Google products
<b>Revenue</b>	66,001,000,000 US dollar <sup>(N)</sup> (2014) <span>↗</span>
<b>Operating income</b>	16,496,000,000 US dollar <sup>(N)</sup> (2014) <span>↗</span>
<b>Net income</b>	14,444,000,000 United States dollar <sup>(N)</sup> (2014) <span>↗</span>

Source 1. Wikipedia Google

# The Introduction of Web Ontologies

## Freebase

Background: Freebase is announced in 2007 and was acquired by Google in 2010 and shut down its services in 2015.

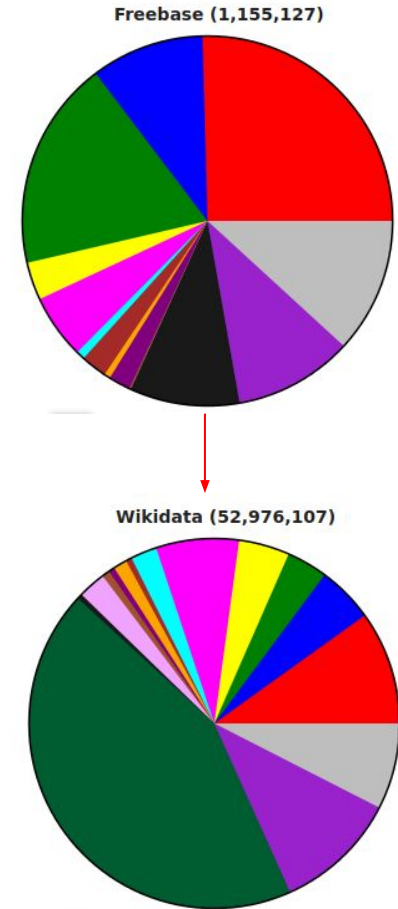
Knowledge Acquisition Method: In contrast to DBpedia, Freebase had provided an interface that **allowed end-users to contribute** by editing structured data.

Utilities: “Freebase is closed source.” Their data was integrated into Wikidata step by step.

## WikiData

Background: Wikidata is a free, **collaborative**, multilingual, secondary database, collecting structured data.

Utilities: It can be the connection of many web ontologies.



Source 5. WikiProject Freebase

# The Introduction of Web Ontologies

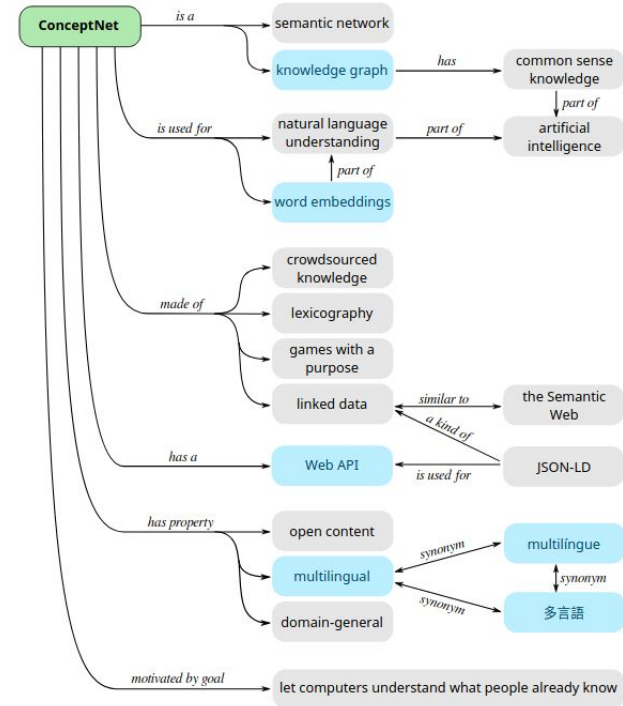
## ConceptNet

Background: user-friendly knowledge base

Knowledge Acquisition Method: Initially built on top of commonsense sentences, but not from the wikipedia sentences

Utilities: use by API or their search engine interface

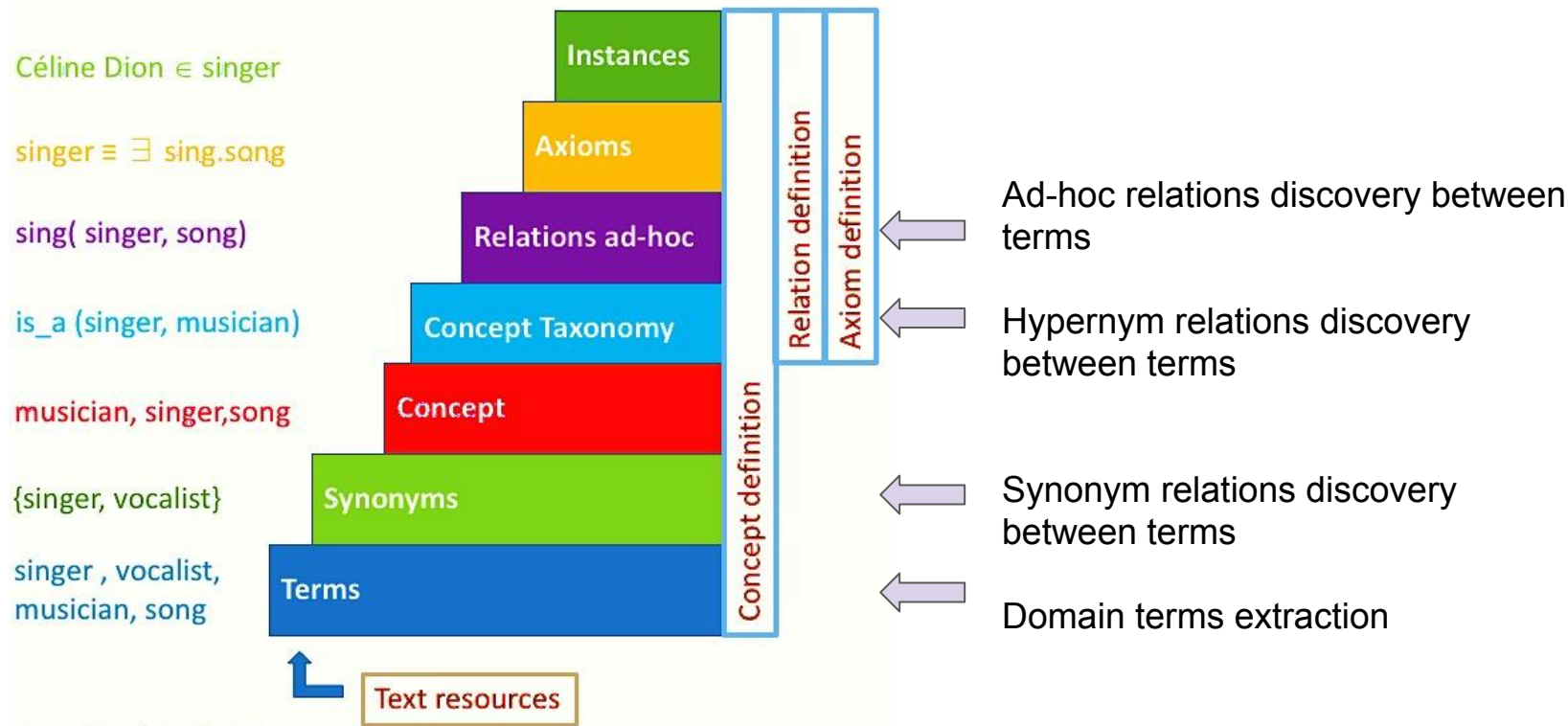
Hints: <<http://www.conceptnet.io/>>



Source 6. Conceptnet.io



# I. Learning the Ontology Building Steps



Ontology learning layer cake (Buitelar et al. 2005)

## II. Practice with SPARQL queries

### Practice 1

#1.1 (review) Please find all the resources of synonyms of 'violin' in DBpedia.

#### Hints

- DBpedia SPARQL servicer: <http://dbpedia.org/sparql>
- use property <owl:sameAs>

## II. Practice with SPARQL queries

### The SPARQL of Practice #1.1

```
PREFIX dbr: <http://dbpedia.org/resource/>  
PREFIX owl: <http://www.w3.org/2002/07/owl#>
```

```
SELECT ?y where {  
  dbr:Violin owl:sameAs ?y .}
```

OR

```
PREFIX dbr: <http://dbpedia.org/resource/>  
PREFIX dbp: <http://dbpedia.org/property/>  
SELECT ?y where {  
  dbr:Violin dbp:names ?y .}
```

y
<a href="http://cs.dbpedia.org/resource/Housle">http://cs.dbpedia.org/resource/Housle</a>
<a href="http://de.dbpedia.org/resource/Violine">http://de.dbpedia.org/resource/Violine</a>
<a href="http://es.dbpedia.org/resource/Violín">http://es.dbpedia.org/resource/Violín</a>
<a href="http://eu.dbpedia.org/resource/Biolin">http://eu.dbpedia.org/resource/Biolin</a>
<a href="http://fr.dbpedia.org/resource/Violon">http://fr.dbpedia.org/resource/Volon</a>
<a href="http://id.dbpedia.org/resource/Biola">http://id.dbpedia.org/resource/Biola</a>
<a href="http://it.dbpedia.org/resource/Violino">http://it.dbpedia.org/resource/Violino</a>
<a href="http://ja.dbpedia.org/resource/ヴァイオリン">http://ja.dbpedia.org/resource/ヴァイオリン</a>
<a href="http://ko.dbpedia.org/resource/바이올린">http://ko.dbpedia.org/resource/바이올린</a>
<a href="http://nl.dbpedia.org/resource/Viool">http://nl.dbpedia.org/resource/Viool</a>
<a href="http://pl.dbpedia.org/resource/Skrzypce">http://pl.dbpedia.org/resource/Skrzypce</a>
<a href="http://pt.dbpedia.org/resource/Violino">http://pt.dbpedia.org/resource/Violino</a>
<a href="http://wikidata.dbpedia.org/resource/Q8355">http://wikidata.dbpedia.org/resource/Q8355</a>
<a href="http://el.dbpedia.org/resource/Βιολί">http://el.dbpedia.org/resource/Βιολί</a>
<a href="http://www.wikidata.org/entity/Q8355">http://www.wikidata.org/entity/Q8355</a>
<a href="http://rdf.freebase.com/ns/m.07y_7">http://rdf.freebase.com/ns/m.07y_7</a>
<a href="http://d-nb.info/gnd/4019791-8">http://d-nb.info/gnd/4019791-8</a>

y
<a href="http://dbpedia.org/resource/Fiddle">http://dbpedia.org/resource/Fiddle</a>

## II. Practice with SPARQL queries

### Practice 1

#1.2 Please find the super class(hypernym) of 'violin' in WikiData.  
How can we improve the results ?

#### Hints:

- WikiData SPARQL servicer: <https://query.wikidata.org/>
- WikiData Id Search Engine: <https://www.wikidata.org/wiki/Special:Search>
- The subject 'violin' and the property 'subClassOf'
- For more info: [https://www.wikidata.org/wiki/Wikidata:SPARQL\\_tutorial](https://www.wikidata.org/wiki/Wikidata:SPARQL_tutorial)

## II. Practice with SPARQL queries

### The SPARQL of Practice #1.2

```
#subclass of (P279)
#violin (Q8355)
SELECT ?hyper
WHERE
{ wd:Q8355 wdt:P279 ?hyper. }
```

hyper

[Q wd:Q57050725](#)

OR

```
SELECT ?hyper ?hyperLabel
WHERE
{ wd:Q8355 wdt:P279 ?hyper.
  SERVICE wikibase:label { bd:serviceParam
    wikibase:language "[AUTO_LANGUAGE]". } }
```

hyper	hyperLabel
<a href="#">Q wd:Q57050725</a>	necked box lutes played with a bow

## II. Practice with SPARQL queries

### The SPARQL of Practice #1.2

```
SELECT ?hyper ?hyperLabel
WHERE
{ wd:Q8355 wdt:P279+ ?hyper.
  SERVICE wikibase:label { bd:serviceParam
    wikibase:language "[AUTO_LANGUAGE]". } }
```

hyper	hyperLabel
<a href="#">Q wd:Q57050725</a>	necked box lutes played with a bow
<a href="#">Q wd:Q192096</a>	bowed string instrument
<a href="#">Q wd:Q55724840</a>	necked box lutes
<a href="#">Q wd:Q1051772</a>	chordophone
<a href="#">Q wd:Q1798603</a>	string instrument
<a href="#">Q wd:Q55724833</a>	necked lutes
<a href="#">Q wd:Q34379</a>	musical instrument
<a href="#">Q wd:Q30038759</a>	handle lutes
<a href="#">Q wd:Q39546</a>	tool
<a href="#">Q wd:Q267228</a>	sound generator
<a href="#">Q wd:Q1808578</a>	lutes
<a href="#">Q wd:Q2424752</a>	product

## II. Practice with SPARQL queries

### Practice 1

#1.3 Please find all the relations between 'violin' and 'violinist' defined in WikiData.

#### Hints:

- WikiData SPARQL servicer: <https://query.wikidata.org/>
- WikiData Id Search Engine: <https://www.wikidata.org/wiki/Special:Search>
- For more info: [https://www.wikidata.org/wiki/Wikidata:SPARQL\\_tutorial](https://www.wikidata.org/wiki/Wikidata:SPARQL_tutorial)

## II. Practice with SPARQL queries

### The SPARQL of Practice #1.3

```
#violin (Q8355)  
#violinist (Q1259917)  
SELECT ?property  
WHERE  
{ wd:Q8355 ?property wd:Q1259917. }
```

---

property

---

[wdt:P1535](#)

---

[wdt:P3095](#)

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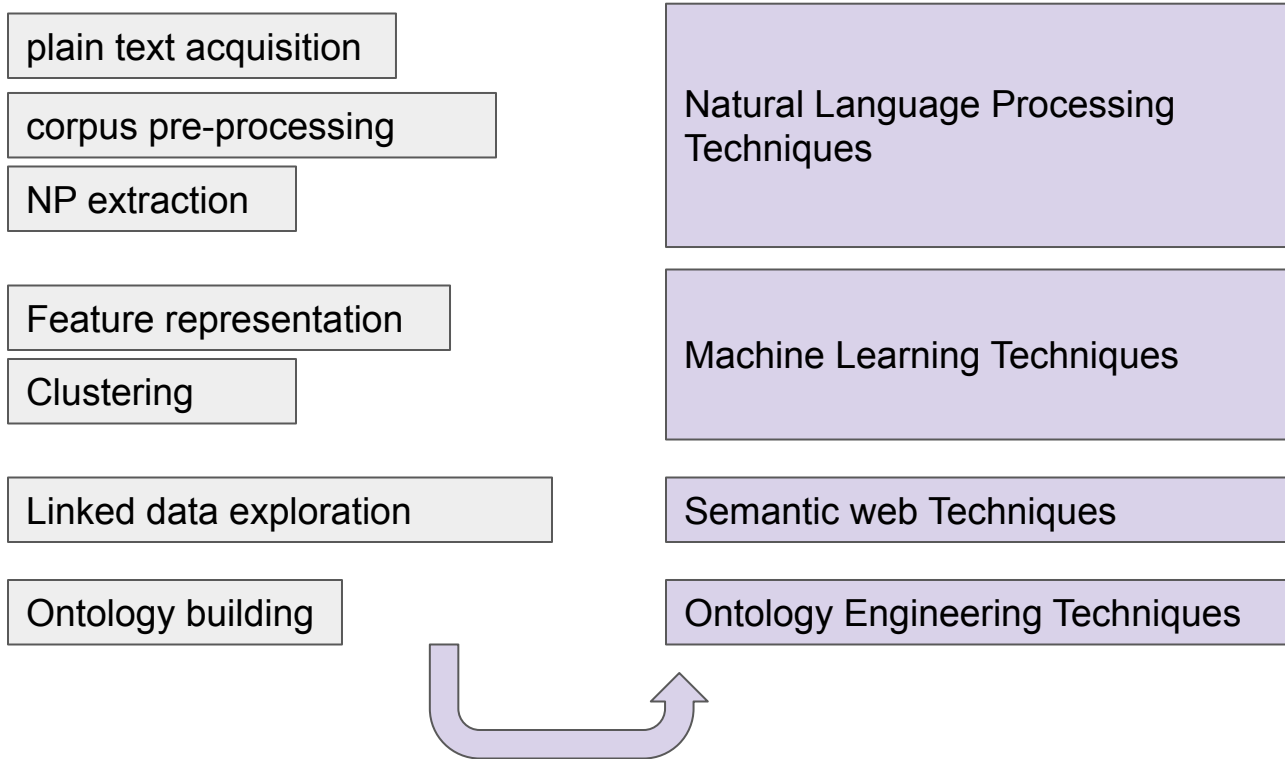


## II. Practice with SPARQL queries

### The attributes of Practice 1

	DBpedia	WikiData
synonyms	owl:sameAs dbpedia2:names	NULL
hypernym	< <a href="http://purl.org/linguistics/gold/hypernym">http://purl.org/linguistics/gold/hypernym</a> > < <a href="http://purl.org/dc/terms/subject">http://purl.org/dc/terms/subject</a> >	#subclass of (P279)
other relations	dbpedia2:related	#practiced by (P3095) #used by (P1535)

### III. Experiment on linked data



**Let's do it step by step**

## Reference

Source1: <https://en.wikipedia.org/wiki/Google>

Source2: The entity visualizer from spaCy.io

Source3: The Cross-Domain Linked Open Data Cloud from lod-cloud.net

Source4: <http://data.doremus.org/ontology/>

Source5: [https://www.wikidata.org/wiki/Wikidata:WikiProject\\_Freebase](https://www.wikidata.org/wiki/Wikidata:WikiProject_Freebase)

Source6: <http://www.conceptnet.io/>