Question Answering

Relation Identification and Linking

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Objective

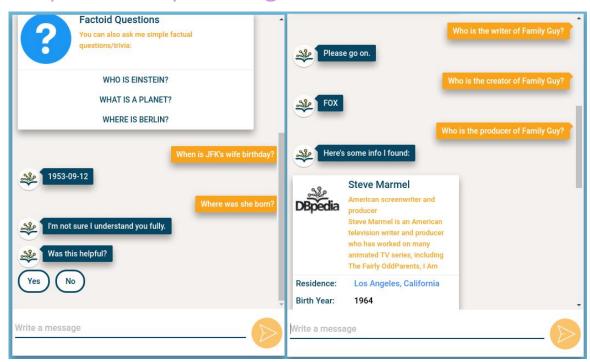
- Identify relations between entities
- Find corresponding information from a database

For example:

- Who are the family members of Peter Griffin?
- Who are the family members of Peter Griffin?
- family members ← Peter Griffin
- Look up for family members of Peter Griffin in DBpedia

Inspiration

http://chat.dbpedia.org/



← → C ① O dbpedia.org/page/Family_Guy	
₩ DBpedia	
	Guy was renewed for a fifteenth season. (en)
dbo:COmpany	 dbr:20th_Century_Fox_Television
	 dbr:Fuzzy_Door_Productions
dbo:composer	 dbr:Ron_Jones_(composer)
	 dbr:Walter_Murphy
dbo:creator	 dbr:Seth_MacFarlane
_{dbo:} developer	dbr:David_Zuckerman
_{dbo} :distributor	 dbr:20th_Television
dbo:executiveProducer	dbr:Danny_Smith_(writer)
	 dbr:Chris_Sheridan_(writer)
	 dbr:Daniel_Palladino
	 dbr:David_AGoodman
	 dbr:Mark_Hentemann
	 dbr:Wellesley_Wild
	 dbr:Alec_Sulkin
	 dbr:Steve_Callaghan
dbo:format	 dbr:NTSC

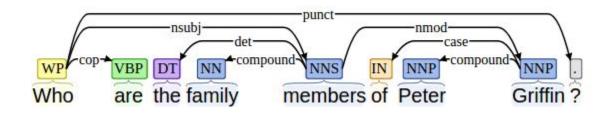
A C A C dhoedia org/page/Family Cuy

Basic Flow

- Question: (...) X of Y of Z (currently)
- Identify Z
- Find out relationship Y
- Find out relationship X
- Provide an answer

Dependency Parsing

Who are the family members of Peter Griffin?



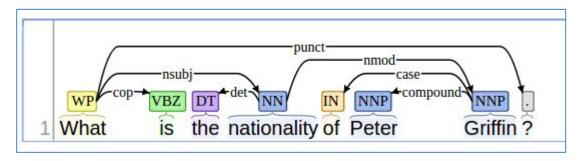
members Griffin

```
((u'What', u'WP'), u'cop', (u'is', u'VBZ'))
((u'What', u'WP'), u'nsubj', (u'nationality', u'NN'))
((u'nationality', u'NN'), u'det', (u'the', u'DT'))
((u'nationality', u'NN'), u'nmod', (u'Griffin', u'NNP'))
((u'Griffin', u'NNP'), u'case', (u'of', u'IN'))
((u'Griffin', u'NNP'), u'compound', (u'Peter', u'NNP'))
```

Entity Recognition

What are the family members of Peter Griffin?

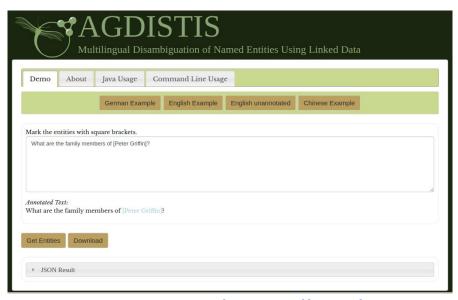
Griffin



What are the family members of [Peter Griffin]?

Entity Recognition

What are the family members of [Peter Griffin]?



http://dbpedia.org/resource/Peter_Griffin

http://dbpedia.org/resources/Family Guy

select distinct ?prop where {<http://dbpedia.org/resource/Peter_Griffin> ?prop ?ent }

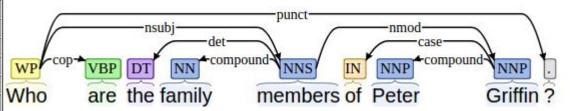


opeua	Browse using -	prop
ty		http://www.w3.org/1999/02/22-rdf-syntax-ns#type
tract		http://www.w3.org/2000/01/rdf-schema#label
tract		http://www.w3.org/2000/01/rdf-schema#comment
		http://www.w3.org/2002/07/owl#sameAs
		http://purl.org/dc/terms/subject
		http://dbpedia.org/ontology/wikiPageID
		http://dbpedia.org/ontology/wikiPageRevisionID
		http://xmlns.com/foaf/0.1/name
		http://purl.org/dc/terms/description
		http://xmlns.com/foaf/0.1/givenName
		http://xmlns.com/foaf/0.1/gender
		http://xmlns.com/foaf/0.1/isPrimaryTopicOf
		http://xmlns.com/foaf/0.1/surname
		http://www.w3.org/ns/prov#wasDerivedFrom
d		http://dbpedia.org/ontology/abstract
		http://dbpedia.org/ontology/child
		http://dbpedia.org/ontology/creator
ator		http://dbpedia.org/ontology/firstAppearance
		http://dbpedia.org/ontology/occupation
Appearance	•	http://dbpedia.org/ontology/relative
upation		http://dbpedia.org/ontology/series
		http://dbpedia.org/ontology/spouse
tive		http://dbpedia.org/ontology/voice
		http://dbpedia.org/property/align
		http://dbpedia.org/property/nationality
es		http://dbpedia.org/property/quote
		http://dbpedia.org/property/source
use		http://dbpedia.org/property/width
e e		http://purl.org/linguistics/gold/hypernym
		intparparations/iniguistics/gold/itypemylli

DEOD

http://dbpedia.org/ontology/creator
http://dbpedia.org/ontology/firstAppearance
http://dbpedia.org/ontology/occupation
http://dbpedia.org/ontology/relative
http://dbpedia.org/ontology/series
http://dbpedia.org/ontology/spouse
http://dbpedia.org/ontology/spouse
http://dbpedia.org/ontology/voice
http://dbpedia.org/property/align
http://dbpedia.org/property/nationality
http://dbpedia.org/property/quote
http://dbpedia.org/property/source
http://dbpedia.org/property/source
http://dbpedia.org/property/width

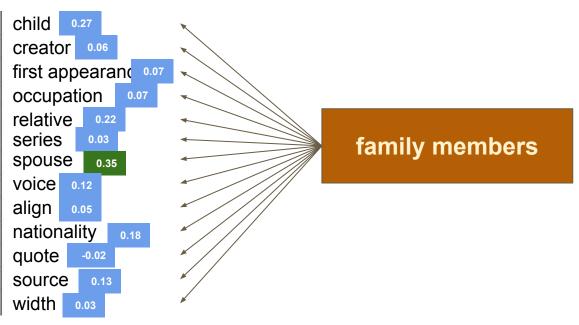
members



family members

Phrase Matching: Using word2vec and cosine similarity

http://dbpedia.org/ontology/child		
http://dbpedia.org/ontology/creator		
http://dbpedia.org/ontology/firstAppearance		
http://dbpedia.org/ontology/occupation		
http://dbpedia.org/ontology/relative		
http://dbpedia.org/ontology/series		
http://dbpedia.org/ontology/spouse		
http://dbpedia.org/ontology/voice		
http://dbpedia.org/property/align		
http://dbpedia.org/property/nationality		
http://dbpedia.org/property/quote		
http://dbpedia.org/property/source		
http://dbpedia.org/property/width		



spouse → property

dbo:spouse

dbr:Lois_Griffin

http://dbpedia.org/resources/Lois Griffin

Answer!!

Achievement

Simply structured questions of the given format yields correct result if

- DBpedia has an answer for it
- If the phrase matching yields a reliable result

Setback

- Agisdistis does not always returns a correct entity URLs
 - What is [Family Guy]? (
 - Fails
 - correct: http://dbpedia.org/resources/Family_Guy
 - What are the satellites of [Earth]?
 - returns http://dbpedia.org/resource/Earth 2
 - correct: http://dbpedia.org/resource/Earth

- Phrase matching fails sometimes
 - Who is the owner of Facebook?
 - Owner → Subsidiary instead of Owner → Founder

Setback

Entity Extraction and relationship extraction is crude.

All complicated questions fail.

"Who is the creator of Batman?" or "Who is Batman's creator?"

http://dbpedia.org/resource/Bob Kane,
http://dbpedia.org/resource/Bill Finger

"Who is the artist who created Batman?"

"Failed to fetch answer".

Things to do now...

Supervised Relation Extraction

- Choose a set of relations to be extracted, a set of relevant entities and find and label data.
- Find all pairs of named Entities, decide if 2 entities are related, classify the relation.
- Using words or Bigrams and parse features to identify relations.
- Using classifiers extract the features.

Thank you

Questions?