

# Entity Linking using MAG

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# Introduction

More than 1 exabyte per day



## 2017 This Is What Happens In An Internet Minute



## 2018 This Is What Happens In An Internet Minute

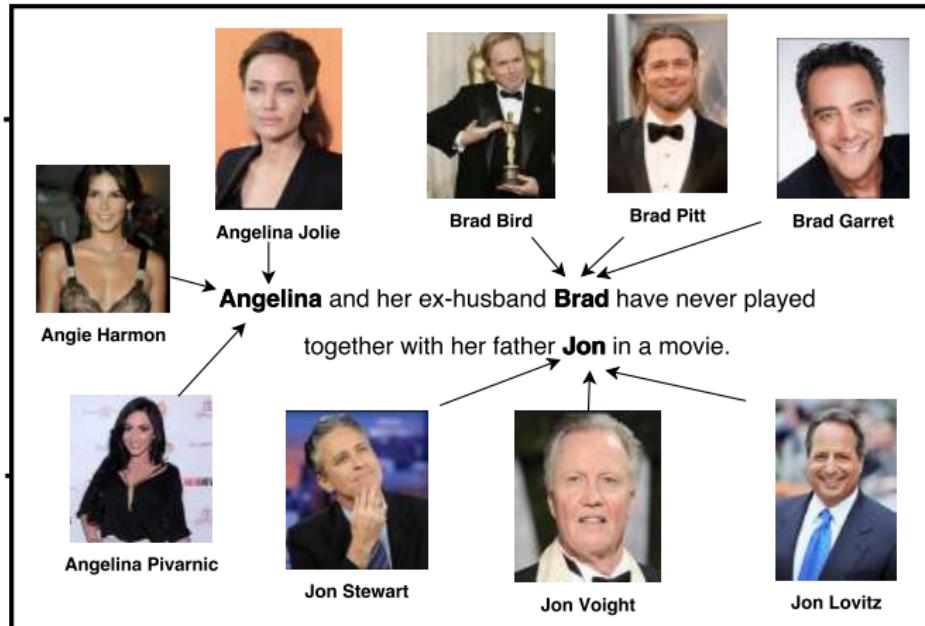


# Introduction

## Entity Linking



TEXT



# Background

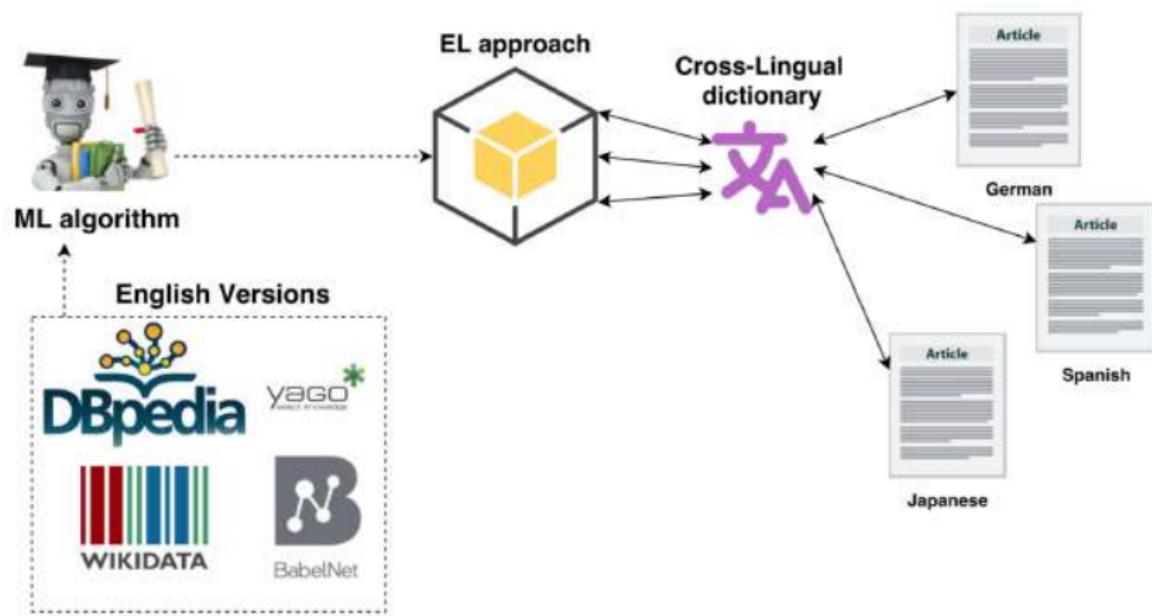
## Timeline



- AGDISTIS - Graph-Based Disambiguation of Named Entities Using Linked Data by Usbeck et al. published at ISWC in 2014
- MAG - A Multilingual, Knowledge-base Agnostic and Deterministic Entity Linking Approach by Moussallem et al published at K-CAP in 2017
- Entity Linking in 40 Languages using MAG by Moussallem et al. published at ESWC in 2018

# Motivation

Current Drawback: Multilingual Approaches



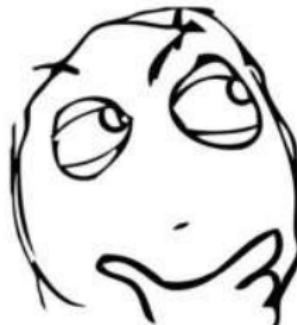
# Research Question

## Contribution



### Goal

Create an EL approach which (1) achieves state of the art performance and (2) can easily be ported to different languages.



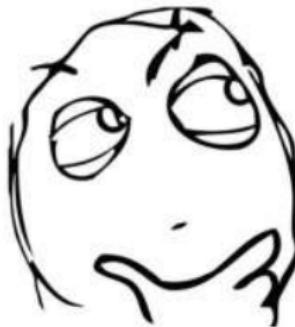
# Research Question

Contribution



## Goal

Create an EL approach which (1) achieves state of the art performance and (2) can easily be ported to different languages.

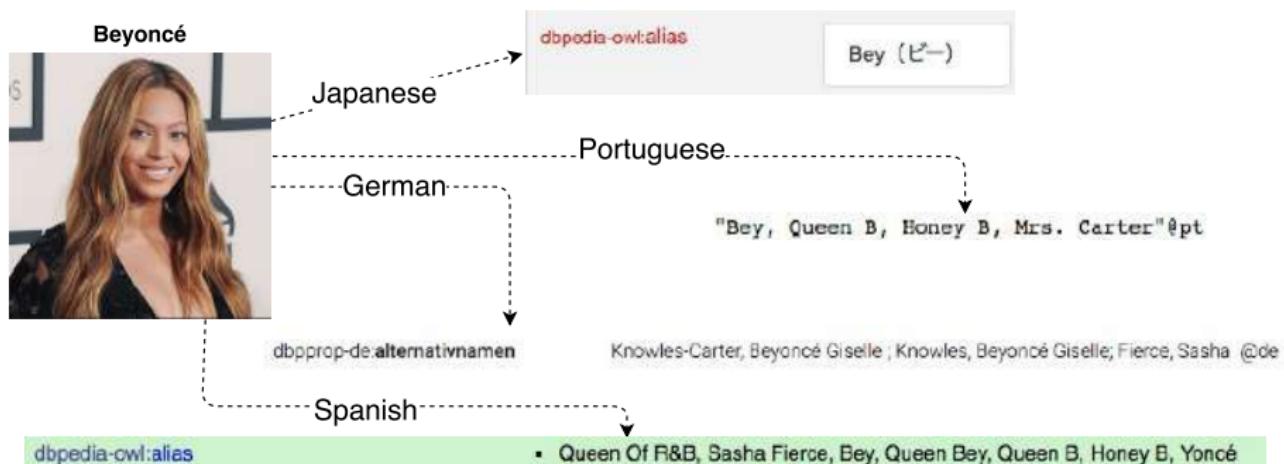


## Solution

MAG

### Index creation

- Surface forms (rdfs:label, schema:name, skos:prefLabel, skos:altLabel and others.)
- Acronyms (list of acronyms provided by Stands4.com)
- Person's name (foaf:name, foaf:nickname, foaf:givenName, dbo:alias and others.)
- Rare references (rdfs:comments, rdfs:description properties.)
- Context (Concise Bounded Descriptions (CBD) of resources)



Beyoncé



Spanish

Beyoncé Giselle Knowles , conocida como Beyoncé (Houston, Texas, Estados Unidos, 4 de septiembre de 1981), es una cantante

Japanese

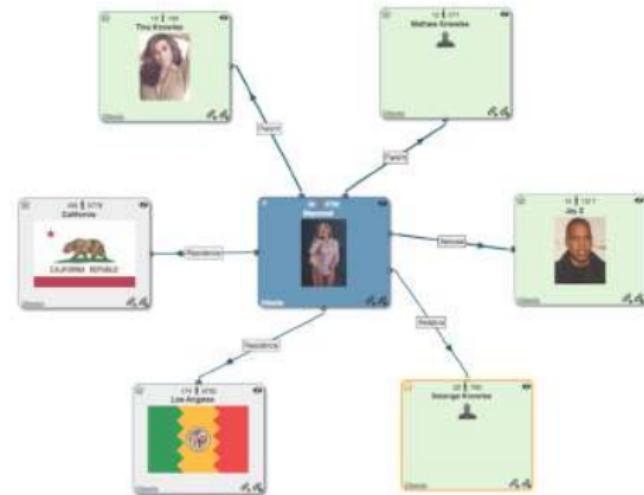
ビヨンセ・ジゼル・ノーブルズ、通称ビヨンセ (Beyoncé Giselle Knowles, 1981年9月4日 - ) は、アメリカ合衆国テキサス州ヒューストン出身のシンガーソ

English

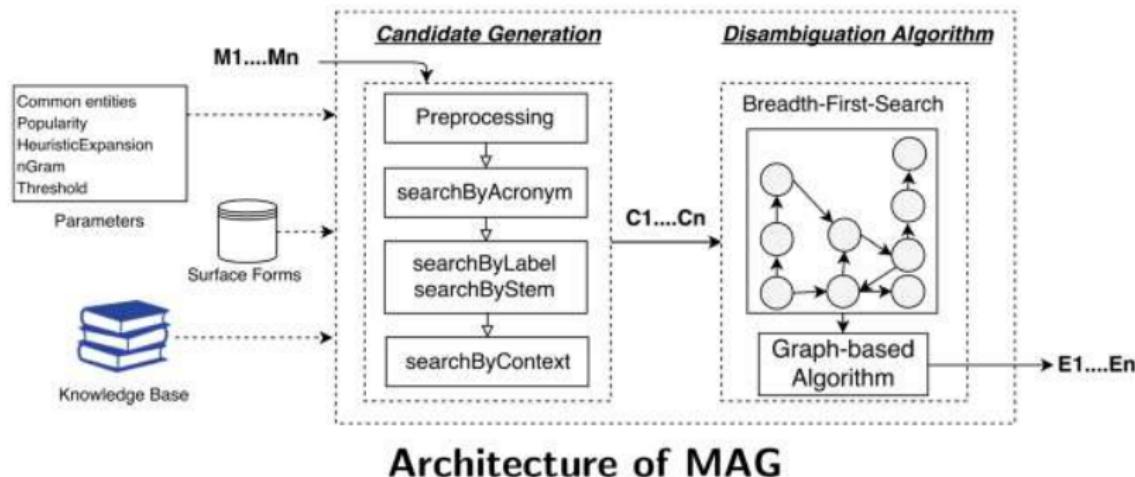
Beyoncé Giselle Knowles-Carter (/bɪˈjɒnsə/; born September 4, 1981) is an American singer,

Portuguese

"Beyoncé Giselle Knowles Carter (Houston, 4 de setembro de 1981), mais conhecida simplesmente como Beyoncé é uma cantora,



dbr:Beyoncé — [Beyoncé spouse Jay Z sister Solange Knowles parent Tina Knowles residence California residence Los Angeles + N words]



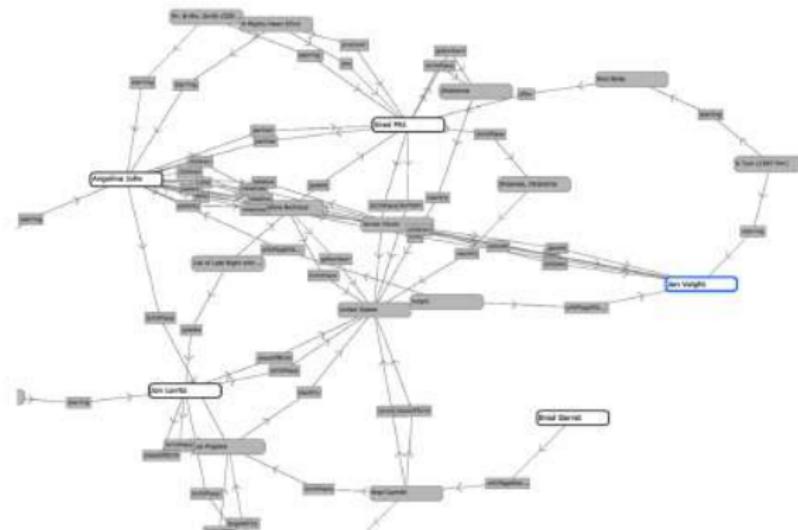
MAG

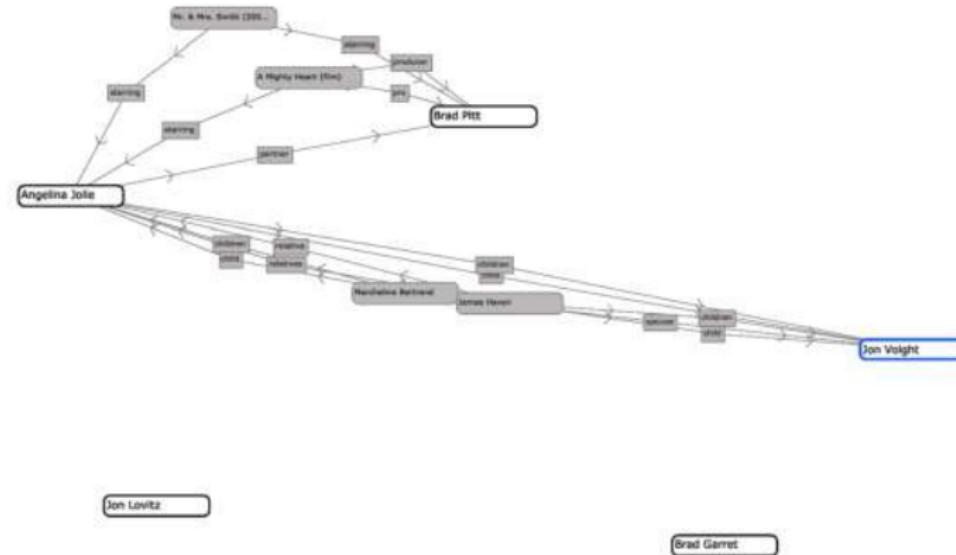
## Online phase - Context search



[Angelina] and [Brad] have never played in a movie with her father [Jon].

RelFinder



RelFinder 

# Results - K-CAP

Red entries are the top scores while blue represents the second best scores

Language	Tools/Data sets	AGDISTIS	AIDA	Babelify	DBpedia	DoSer	entityclassifier.eu	FRED	Kea	NERD-ML	PROPHET	WAT	xLisa	MAG + HITS	MAG + PR
English	ACE2004	0.65	0.70	0.53	0.48	<b>0.75</b>	0.50	0.00	0.66	0.58	<b>0.72</b>	0.66	0.70	0.69	0.60
	AIDA/CoNLL-Complete	0.55	0.68	0.66	0.50	0.69	0.50	0.00	0.61	0.20	<b>0.75</b>	<b>0.71</b>	0.48	0.59	0.54
	AIDA/CoNLL-Test A	0.54	0.67	0.65	0.48	0.69	0.48	0.00	0.61	0.00	<b>0.75</b>	<b>0.7</b>	0.45	0.59	0.54
	AIDA/CoNLL-Test B	0.52	0.69	0.68	0.52	0.69	0.48	0.00	0.61	0.00	<b>0.75</b>	<b>0.72</b>	0.47	0.57	0.52
	AIDA/CoNLL-Training	0.55	0.69	0.66	0.50	0.69	0.52	0.00	0.61	0.28	<b>0.75</b>	<b>0.71</b>	0.48	0.60	0.55
	AQUAINT	0.52	0.55	0.68	0.53	<b>0.82</b>	0.41	0.00	0.78	0.60	<b>0.81</b>	0.73	0.76	0.67	0.68
	Spotlight	0.27	0.25	0.52	0.71	<b>0.81</b>	0.25	0.04	0.74	0.56	<b>0.79</b>	0.67	0.71	0.65	0.66
	ITTB	0.47	0.18	0.37	0.30	0.43	0.14	0.00	<b>0.48</b>	0.43	0.38	0.41	0.27	<b>0.52</b>	0.43
	KORE50	0.27	<b>0.70</b>	<b>0.74</b>	0.46	0.52	0.30	0.06	0.60	0.31	0.63	0.62	0.51	0.24	0.24
	MSNBC	0.73	0.69	0.71	0.42	<b>0.83</b>	0.51	0.00	0.78	0.62	<b>0.82</b>	0.73	0.5	0.79	0.75
	Microposts2014-Test	0.33	0.42	0.48	0.50	<b>0.76</b>	0.41	0.05	0.64	0.52	<b>0.73</b>	0.60	0.55	0.45	0.44
	Microposts2014-Train	0.42	0.51	0.51	0.48	<b>0.77</b>	0.00	0.31	0.65	0.52	<b>0.71</b>	0.63	0.59	0.49	0.44
	N3-RSS-500	0.66	0.45	0.44	0.20	<b>0.48</b>	0.00	0.00	0.44	0.38	0.53	0.44	0.45	<b>0.69</b>	<b>0.67</b>
	N3-Reuters-128	0.61	0.47	0.45	0.33	<b>0.69</b>	0.00	0.41	0.51	0.41	<b>0.65</b>	0.52	0.39	<b>0.69</b>	0.64
	OKE 2015 Task 1 evaluation set	0.59	0.56	0.59	0.31	0.59	0.00	0.46	<b>0.63</b>	0.61	<b>0.63</b>	0.57	<b>0.62</b>	0.58	0.55
	OKE 2015 Task 1 example set	0.50	<b>0.60</b>	0.40	0.22	0.55	0.00	0.60	0.55	0.00	0.50	<b>0.60</b>	0.50	<b>0.67</b>	0.50
	OKE 2015 Task 1 training set	0.62	0.67	0.71	0.25	<b>0.78</b>	0.00	0.61	<b>0.78</b>	<b>0.77</b>	0.76	0.72	0.75	0.72	0.70
Multilingual	N <sup>3</sup> news.de	0.61	0.52	0.50	0.48	0.56	0.28	0.00	0.61	0.33	0.30	0.59	0.36	<b>0.76</b>	<b>0.63</b>
	Italian Abstracts	0.22	0.28	<b>0.33</b>	0.00	0.00	0.00	0.00	0.00	0.00	0.20	0.00	0.00	<b>0.80</b>	<b>0.80</b>
	Spanish Abstracts	0.25	0.33	0.26	0.00	0.24	0.27	0.00	0.47	0.00	0.31	0.33	0.31	<b>0.75</b>	<b>0.68</b>
	Japanese Abstracts	0.15	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	<b>0.38</b>	0.00	0.00	<b>0.54</b>	<b>0.54</b>
	Dutch Abstracts	0.33	0.36	0.36	0.28	0.36	0.22	0.00	0.40	0.00	0.5	0.40	0.25	<b>0.66</b>	<b>0.67</b>
	French Abstracts	0.00	0.00	<b>0.28</b>	0.22	0.00	0.25	0.00	0.00	0.00	0.20	<b>0.28</b>	<b>0.28</b>	<b>0.80</b>	<b>0.80</b>
<b>Average</b>		0.45	0.48	0.50	0.36	0.55	0.24	0.11	0.53	0.31	<b>0.59</b>	0.54	0.45	<b>0.63</b>	<b>0.59</b>
<b>Standard Deviation</b>		0.19	0.22	0.18	0.19	0.27	0.21	0.21	0.23	0.26	0.20	0.22	0.20	0.13	0.13

ESWC 2018, we released MAG demo in 40 languages.

- Feedback from the community
  - Good usability according to SUS score
  - Extension to all languages provided by DBpedia
  - Combination with other approaches + Machine Learning



# MAG (Multilingual AGDISTIS)

A Multilingual, Knowledge-base Agnostic and Deterministic Entity Linking Approach

Demo More Languages About Java or Docker Usage Command Line Usage

English Example German Example **Spanish Example** French Example Italian Example

Japanese Example Dutch Example Portuguese Example Wikidata English Example Chinese Example

Mark the entities with square brackets.

[Leipzig] (en [alemán estándar]) o [Lipsia], en español, es una ciudad [alemana] en el noreste del estado de [Sajonia].

Annotated Text:  
[Leipzig] (en [alemán estándar]) o [Lipsia], en español, es una ciudad **alemana** en el noreste del estado de **Sajonia**.

Get Entities Download

\* JSON Result

<http://agdistis.aksw.org/mag-demo/>

# Future work

- All languages provided by DBpedia (KB completion)
- New graph-based algorithms
- Conventional Machine Learning algorithms + Neural Networks



# Thank you for your Attention!

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- ⇒ **GITHUB:** `https://github.com/dice-group/AGDISTIS`
- ⇒ **WEBSITE:** `https://agdistis.aksw.org/mag-demo`