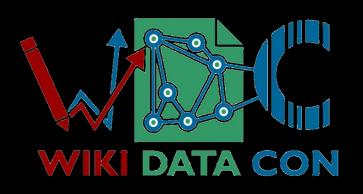




Patrice Lopez

October 29, 2017



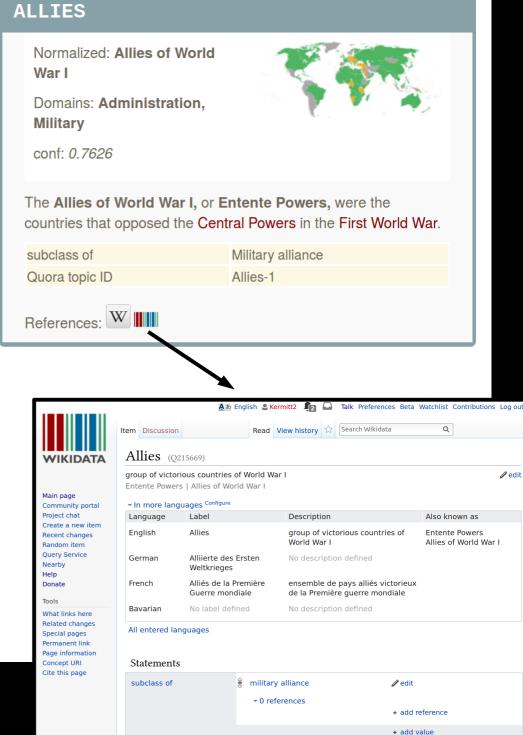
## entity-fishing

- Repo: https://github.com/kermit2/nerd
- Demo: http://entity-fishing.science-miner.com
- Doc: http://nerd.readthedocs.io
- Open source Apache 2 (including dependencies)
- Resources/models CC0

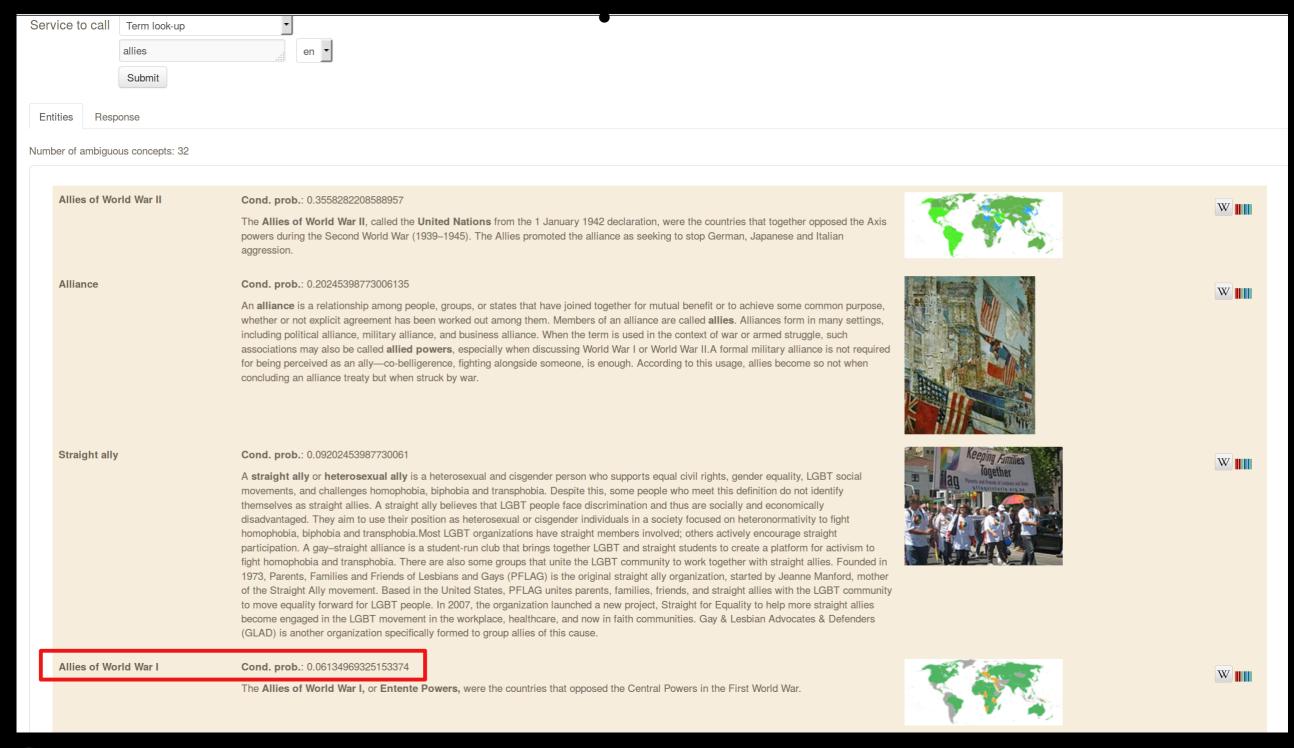


# First World War excerpt

```
AUSTRIA invaded and fought the SERBIAN ARMY at the BATTLE OF CER and BATTLE OF KOLUBARA beginning on
12 AUGUST
The army, led by general PAUL VON HINDENBURG defeated RUSSIA in a series of battles collectively known as the
First BATTLE OF TANNENBERG (17 AUGUST - 2 SEPTEMBER). But the failed RUSSIAN invasion, causing the fresh
GERMAN TROOPS to move to the east, allowed the tactical ALLIED victory at the FIRST BATTLE OF THE MARNE
Unfortunately for the Allies, the pro-German King constantine I dismissed the pro-Allied government of E.
VENIZELOS before the ALLIED expeditionary force could arrive. Beginning in 1915, the ITALIANS under CADORNA
mounted eleven offensives on the ISONZO front along the ISONZO RIVER, northeast of TRIESTE.
At the siege of maubeuge about 40000 French soldiers surrendered, at the BATTLE of GALICIA Russians took
about 100 - 120000 AUSTRIAN captives, at the BRUSILOV OFFENSIVE about 325 000 to 417 000 GERMANS and
AUSTRIANS SURRENDERED TO RUSSIANS, at the BATTLE OF TANNENBERG 92,000 RUSSIANS SURRENDERED.
After marching through BELGIUM, LUXEMBOURG and the ARDENNES, the GERMAN ARMY advanced, in the latter
half of AUGUST, into northern FRANCE where they met both the FRENCH ARMY, under JOSEPH JOFFRE, and the
initial six divisions of the BRITISH EXPEDITIONARY FORCE, under SIR JOHN FRENCH. A series of engagements known
as the BATTLE OF THE FRONTIERS ensued. Key battles included the BATTLE OF CHARLEROI and the
BATTLE OF MONS. In the former battle the FRENCH 5TH ARMY was almost destroyed by the German 2nd and
3RD ARMIES and the latter delayed the GERMAN advance by a day. A general ALLIED retreat followed, resulting in
more clashes such as the BATTLE OF LE CATEAU, the SIEGE OF MAUBEUGE and the BATTLE OF ST. QUENTIN (Guise).
The GERMAN ARMY came within 70 km (43 mi) of PARIS, but at the FIRST BATTLE OF THE MARNE
(6-12 SEPTEMBER), FRENCH and BRITISH troops were able to force a GERMAN retreat by exploiting a gap which
appeared between the 1ST and 2ND ARMIES, ending the GERMAN advance into FRANCE. The GERMAN ARMY
retreated north of the AISNE RIVER and dug in there, establishing the beginnings of a static western front that was
to last for the next three years. Following this GERMAN setback, the opposing forces tried to OUTFLANK each
other in the RACE FOR THE SEA, and quickly extended their TRENCH SYSTEMS from the NORTH SEA to the SWISS
frontier. The resulting GERMAN-OCCUPIED TERRITORY held 64% of FRANCE's pig-IRON PRODUCTION, 24% of its steel
manufacturing, dealing a serious, but not crippling setback to FRENCH industry.
```



The challenge is to disambiguate mentions in context. For instance, "allies" refers most likely in the English Wikimedia to the Second World War allies entity, WW1 allies being only fourth with only ~6% prob.



## Catching Wikidata entities in scholar PDF article



Morphological variation in hybrids between Salmo marmoratus and alien Salmo species in the Volarja stream, Soca River basin, Slovenia

B. Delling\*||, A. J. Crivelli†, J-F. Rubin‡ and P. Berrebi¶

\*Department of Vertebrate Zoology, Swedish Museum of Natural History, P.O. Box 50007, SE-104 05 Stockholm and Department of Zoology, Stockholm University, SE-106 91 Stockholm, Sweden; †Station Biologique de la Tour du Valat, Le Sambuc, F-13200 Arles, France; ‡Institut d'Ecologie, Lausanne University, CH-1000 Dorigny, Switzerland; ¶Laboratoire Génome et Populations, Université Montpellier II, CC063, Place Bataillon, F-34095 Montpellier Cédéx 05, France

(Received 11 February 2000, Accepted 16 June 2000)

There were significant correlations between colour pattern, LDH-5\* genotype and certain meristic characters in 59 hybrid trout Salmo sp. from the Volaria stream, Soca River basin, Slovenia. It is concluded that panmixia between native Salmo marmoratus and introduced S. trutta of Atlantic, Danubian and Mediterranean origin had not been reached in this zone, despite the long period of introgression. The result is in agreement with other studies dealing with introgression in Salmo, and for management purposes certain morphological characters, especially colour pattern, can be a valuable tool in restoring the marble trout population in the Soca River.

Key words: introgression; hybridization; allozymes; morphometrics; Salmo marmoratus

#### INTRODUCTION

Hybridization and introgression among fish species is well documented (Verspoor & Hammar, 1991; Leary et al., 1995). Among the Eurasian Salmo species, hybrids between Atlantic salmon Salmo salar L. and brown trout

#### **SALMO MARMORATUS**

Normalized: Salmo marmoratus

Domains: **Animals** 

conf: 0.7247



Salmo marmoratus (marble trout) is a species of freshwater fish in the Salmonidae family. It is characterized by a distinctive marbled color pattern and high growth capacity. The marble trout is found in only three basins and two rivers of the Adriatic basin, namely the Po with only northern/left tributaries and the Adige, Brenta, Piave, Tagliamento and Livenza basins in Italy, the Soča basin in Slovenia and Italy, the Neretva river in Bosnia and Herzegovina and Croatia, and the Morača river in Montenegro. While once present in the Drin river basin in Albania fish is almost certainly extirpated there.

taxon rank	Subspecies
taxon name	Salmo trutta marmoratus
Commons category	Salmo marmoratus
parent taxon	Brown trout
Freebase ID	/m/02wygvg
instance of	Taxon
image	Salmo marmoratus.jpg
Encyclopedia of Life ID	1157691
taxon synonym	Q22231158

References: W

# Search query disambiguation for "concrete pump sensor" (response time 5-10ms)

#### concrete

Conf: 0.36

**Concrete** is a composite material composed of coarse aggregate bonded together with a fluid cement that hardens over time. Most concretes used are lime-based concretes such as Portland cement concrete or concretes made with other hydraulic cements, such as ciment fondu. However, asphalt concrete, which is frequently used for road surfaces, is also a type of concrete, where the cement material is bitumen, and polymer concretes are sometimes used where the cementing material is a polymer.





concrete pump

**Conf**: 0.72

A **concrete pump** is a machine used for transferring liquid concrete by pumping. There are two types of concrete pumps. The first type of concrete pump is attached to a truck or longer units are on semi-trailers. It is known as a boom concrete pump because it uses a remote-controlled articulating robotic arm (called a *boom*) to place concrete accurately. Boom pumps are used on most of the larger construction projects as they are capable of pumping at very high volumes and because of the labour saving nature of the placing boom. They are a revolutionary alternative to line-concrete pumps.





pump

**Conf**: 0.36

A **pump** is a device that moves fluids (liquids or gases), or sometimes slurries, by mechanical action. Pumps can be classified into three major groups according to the method they use to move the fluid: *direct lift*, *displacement*, and *gravity* pumps.





sensor

**Conf**: 0.72

In the broadest definition, a **sensor** is an electronic component, module, or subsystem whose purpose is to detect events or changes in its environment and send the information to other electronics, frequently a computer processor. A sensor is always used with other electronics, whether as simple as a light or as complex as a computer.



online process

language identification

acronym identification

person name co-ref.

mention recognition

**Grobid-NER** 

Wikipedia labels

species

Grobid

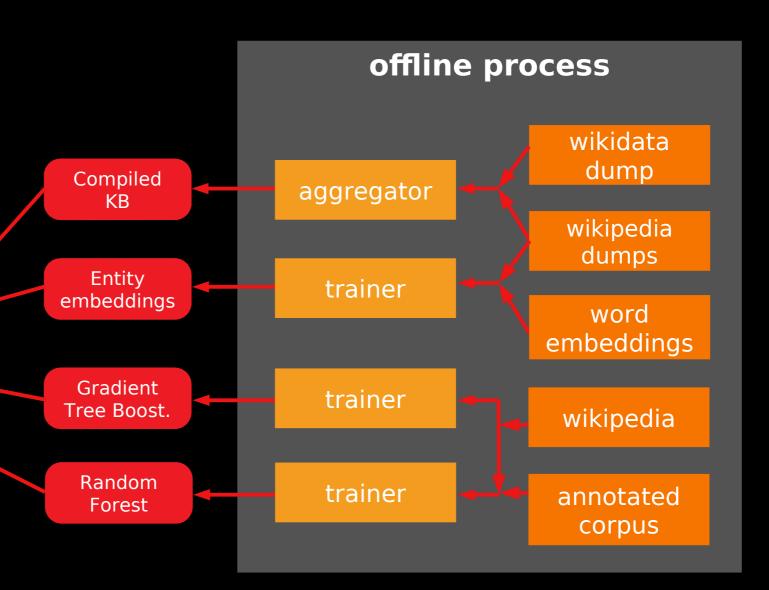
entity resolution

candidate generation

disambiguation

selection

entity descriptions



online process

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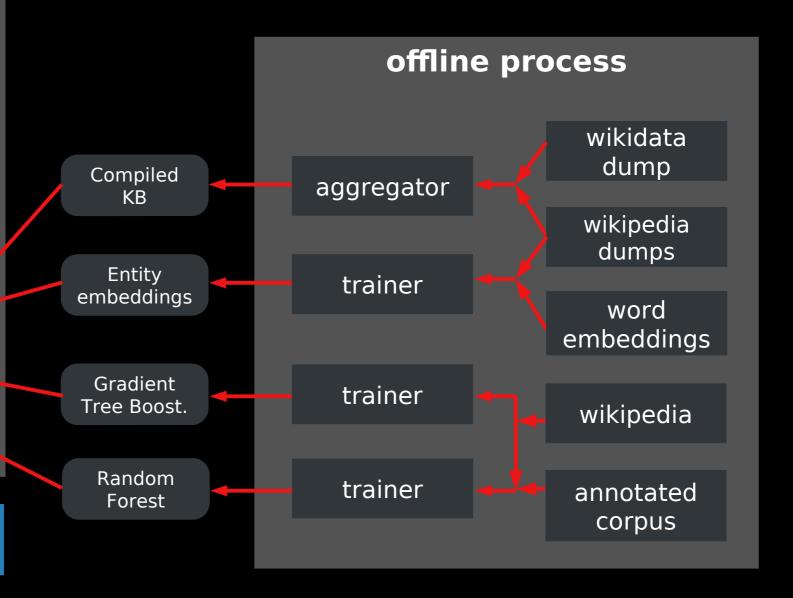
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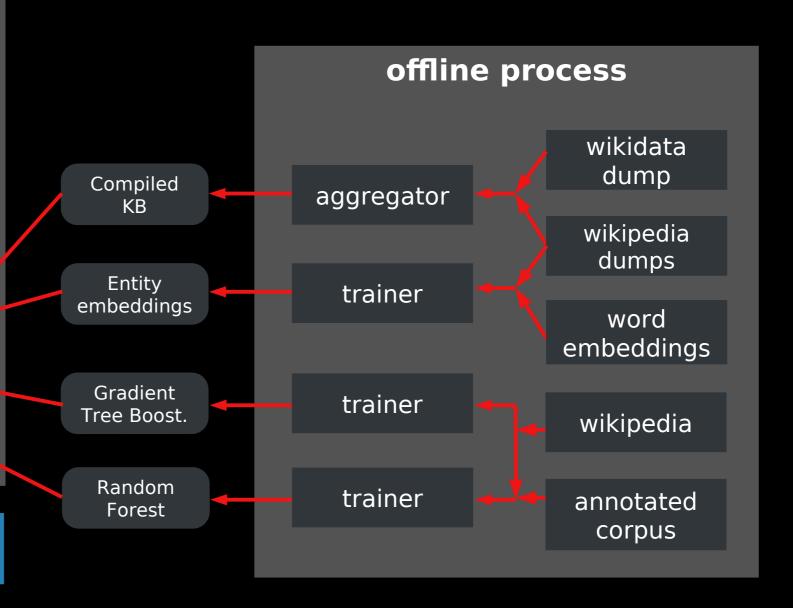
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## Catching entities

Entity-fishing supports English,
 German, French (it and es soon)



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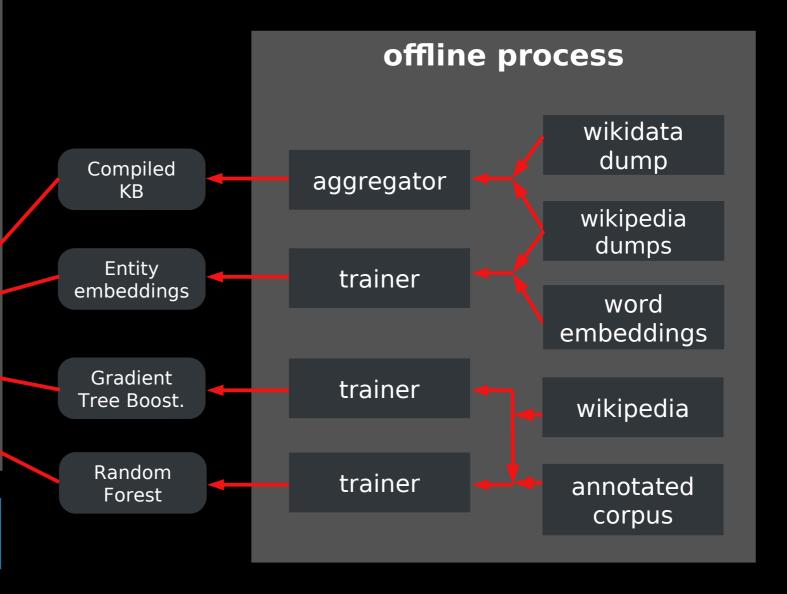
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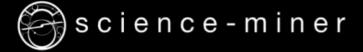
selection

#### entity descriptions



## Mention detection

- A mention is a text string that can refer to an entity
- Traditional mentions are identified by
  - → A Named-Entity Recognizer, for names, locations, organisations, etc.
  - → Wikipedia titles and anchors
- But Wikidata entities are much more heterogeneous than in usual NERD, for example:
  - Many scientific entities, e.g. chemical formula, name of species, astronomical objects, etc.
  - → Bibliographical objects



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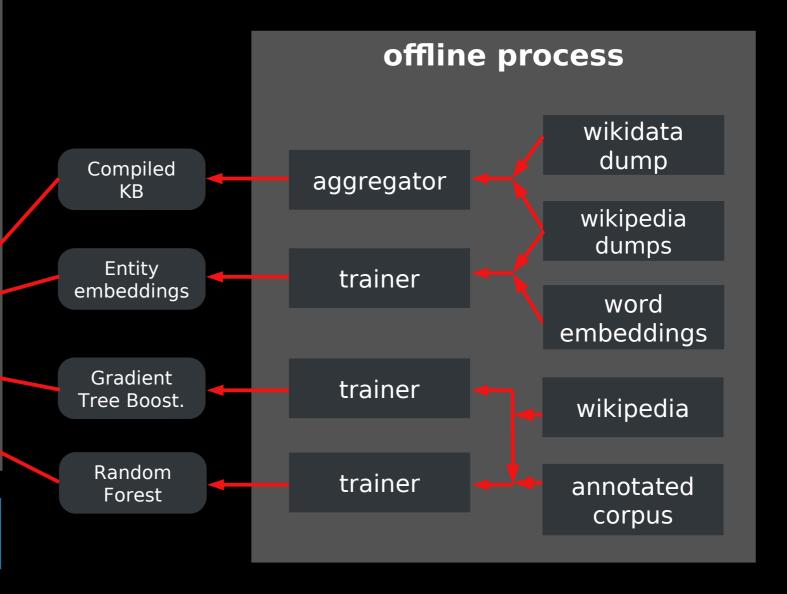
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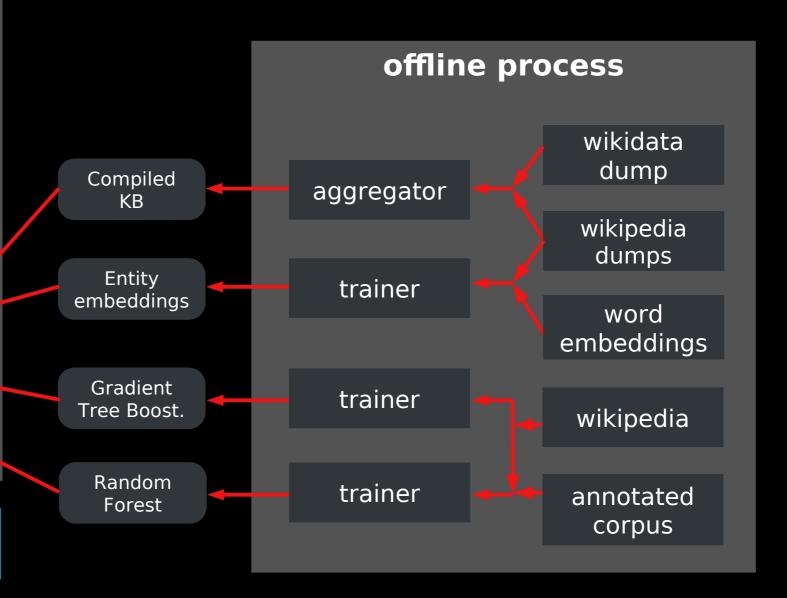
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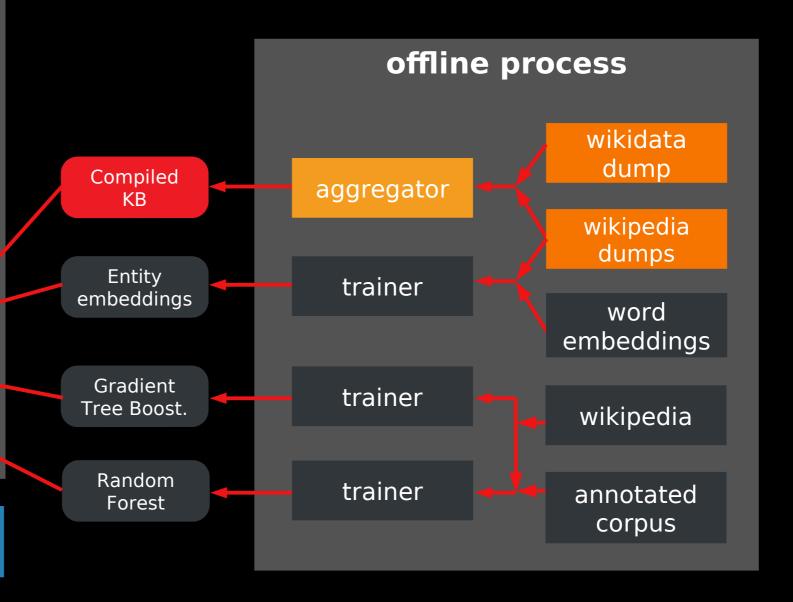
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# online process language identification acronym identification person name co-ref. mention recognition Grobid-NER Wikipedia labels species Grobid

#### entity resolution

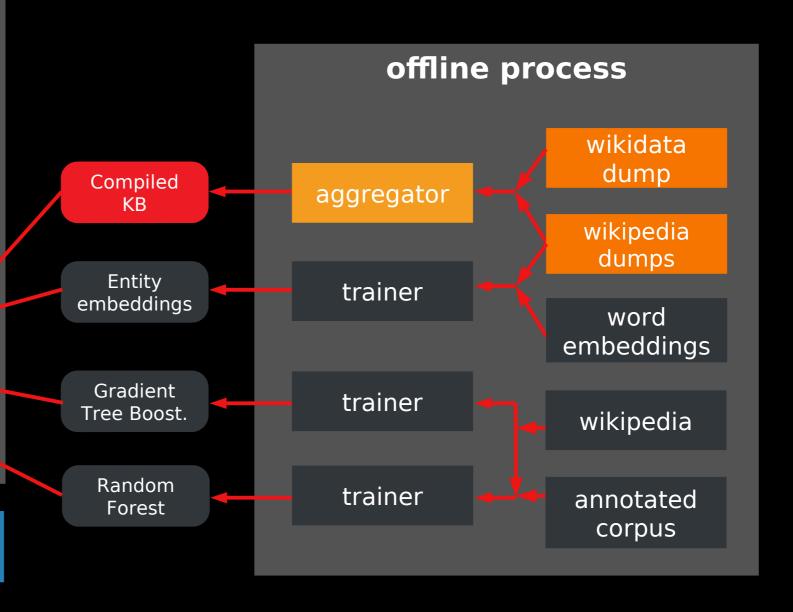
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entity descriptions

- All Wikidata & Wikipedia content parsed/compiled
- Hadoop process with Sweble (~10h for English)
- Stored in LMDB: 600.000 access per second, per thread



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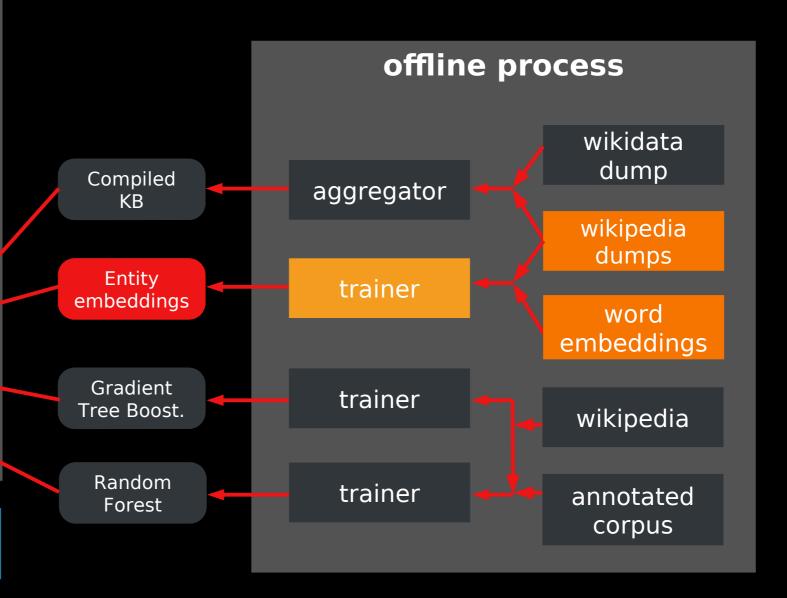
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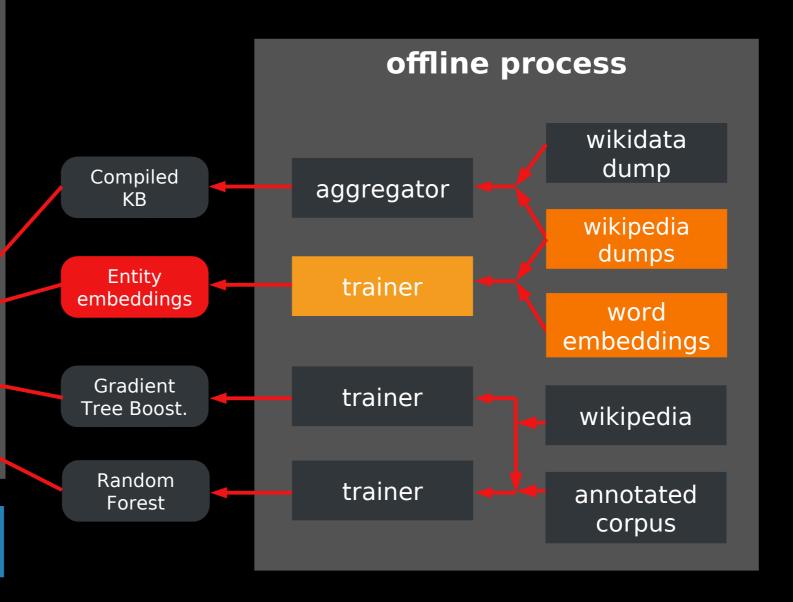
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- Entity embeddings for ~4.5M entities
- Based on word embeddings (FastText) and page descriptions (takes 39h with 24 cores)
- Experiments for using Wikidata statements



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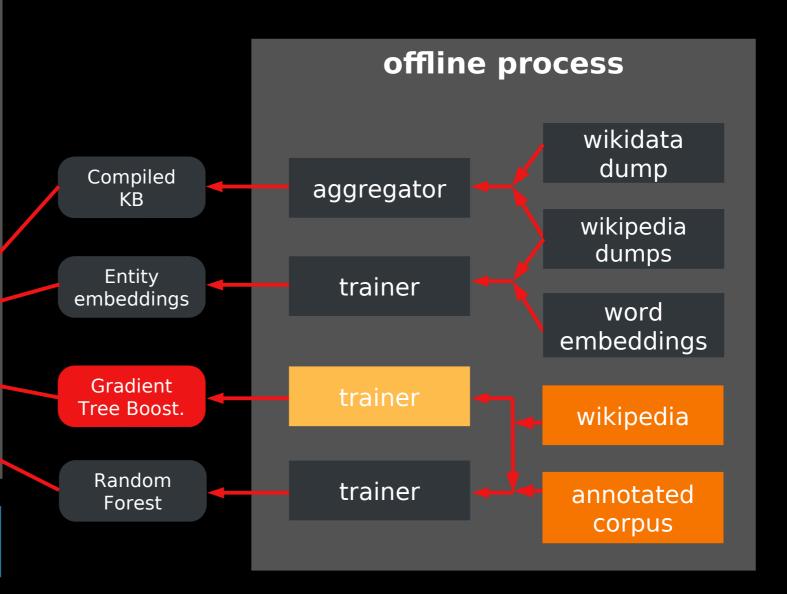
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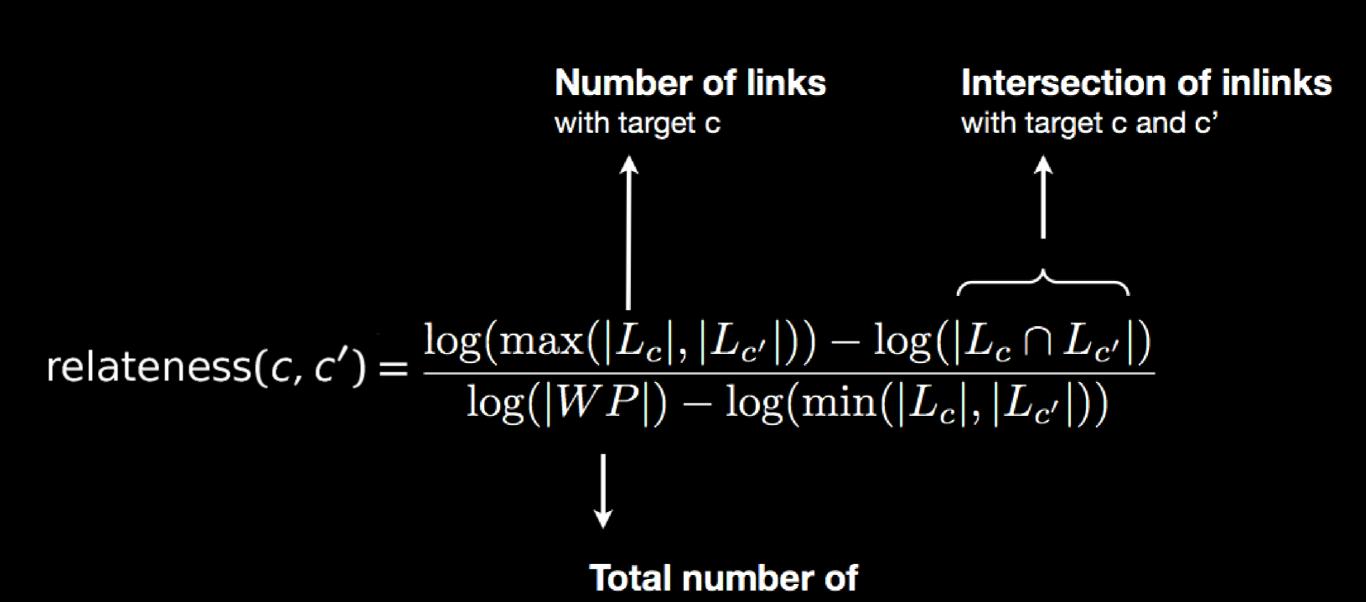


## Entity disambiguation

- One model per language
- Ranking entity candidates with Gradient Tree Boosting and features:
  - → Milne & Witten relatedness
  - Embeddings cosine entity and word context
  - → Prior probability text → entity, based on anchors in Wikipedia
  - Context quality



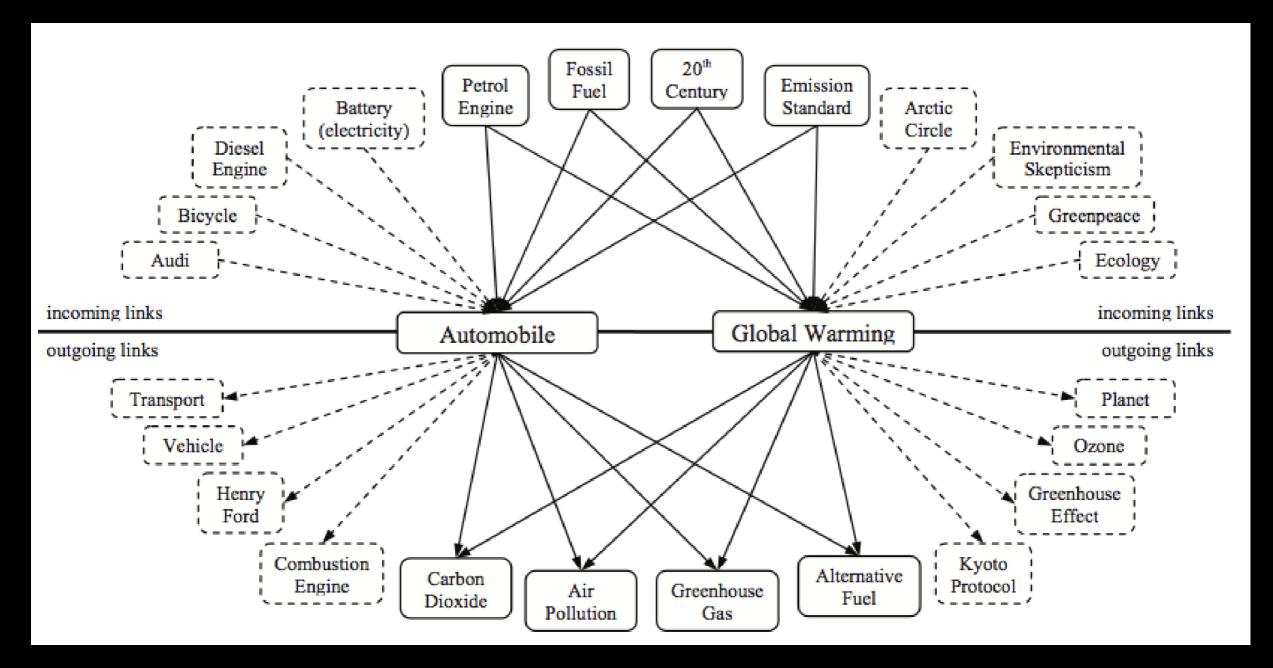
## Milne & Witten (2009) relatedness



Wikipedia articles



# Milne & Witten (2009) relatedness



**→** Extend well to Wikidata relations



## Entity disambiguation

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- Ranking entity candidates with Gradient Tree Boosting and features:
  - Milne & Witten relatedness
  - Embeddings cosine entity and word context
  - → Prior probability text → entity, based on anchors in Wikipedia
  - Context quality



## Entity disambiguation accuracy

	Priors	entity- fishing	Wikifier	DoSeR	AIDA	Spotlight	Babelfy	WAT	(Ganea & Hofmann, 2017)
ACE2004	83.1	83.5	83.4	90.7	81.5	71.3	56.1	80.0	88.5
AIDA-CONLL -testb	66.1	76.5	77.7	78.4	77.4	59.3	59.2	84.3	92.2
AQUAINT	80.3	89.1	86.2	84.2	53.2	71.3	65.2	76.8	88.5
MSNBC	71.1	86.7	85.1	91.1	78.2	51.1	60.7	77.7	93.7

- only disambiguation of entities (mentions are given)
- only named entities (person, location, organisation, misc.)
- results from (Zwicklbauer & al., 2016), (Ganea & Hoffman, 2017) and GERBIL
- entity-fishing is work-in-progress and this will be improved



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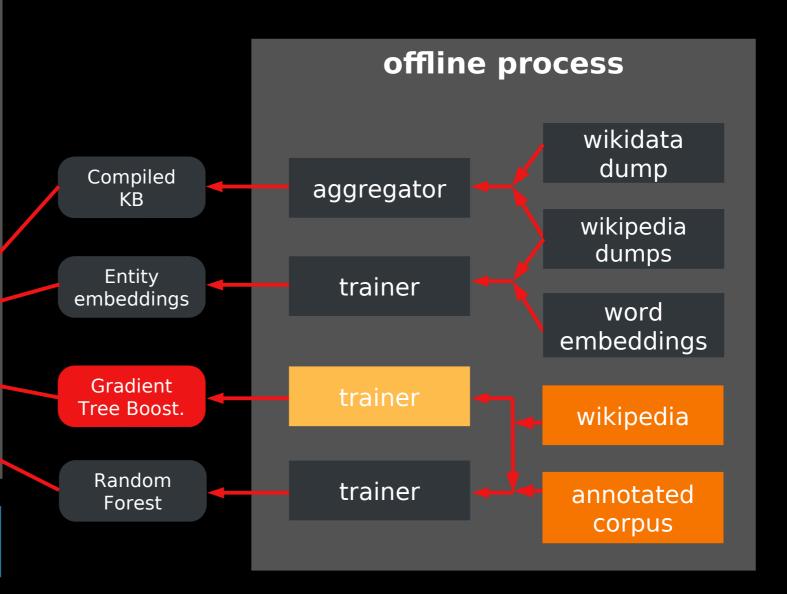
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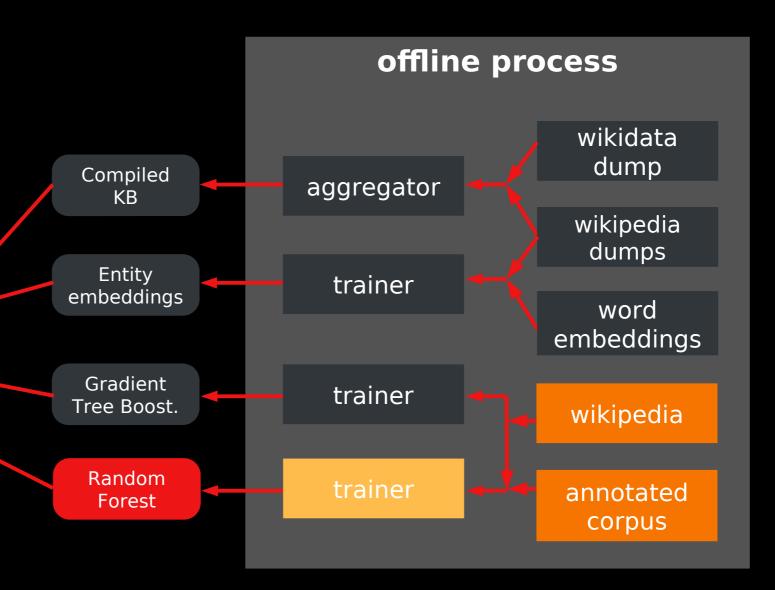
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## Scaling

# concurrent clients	1	5	6	10
text tokens/s	1371	3796	4800	3756
PDF pages/s	2.6	8.92	9.86	8.17
PDF tokens/s	1108.2	3796	4077	3376.7

- entity-fishing runs with 2GB RAM (4GB ideally)
- For comparison: AIDA 40GB, Wikifier 8-16GB (named-entity only),
   DoSeR 25GB (disambiguation only), ...

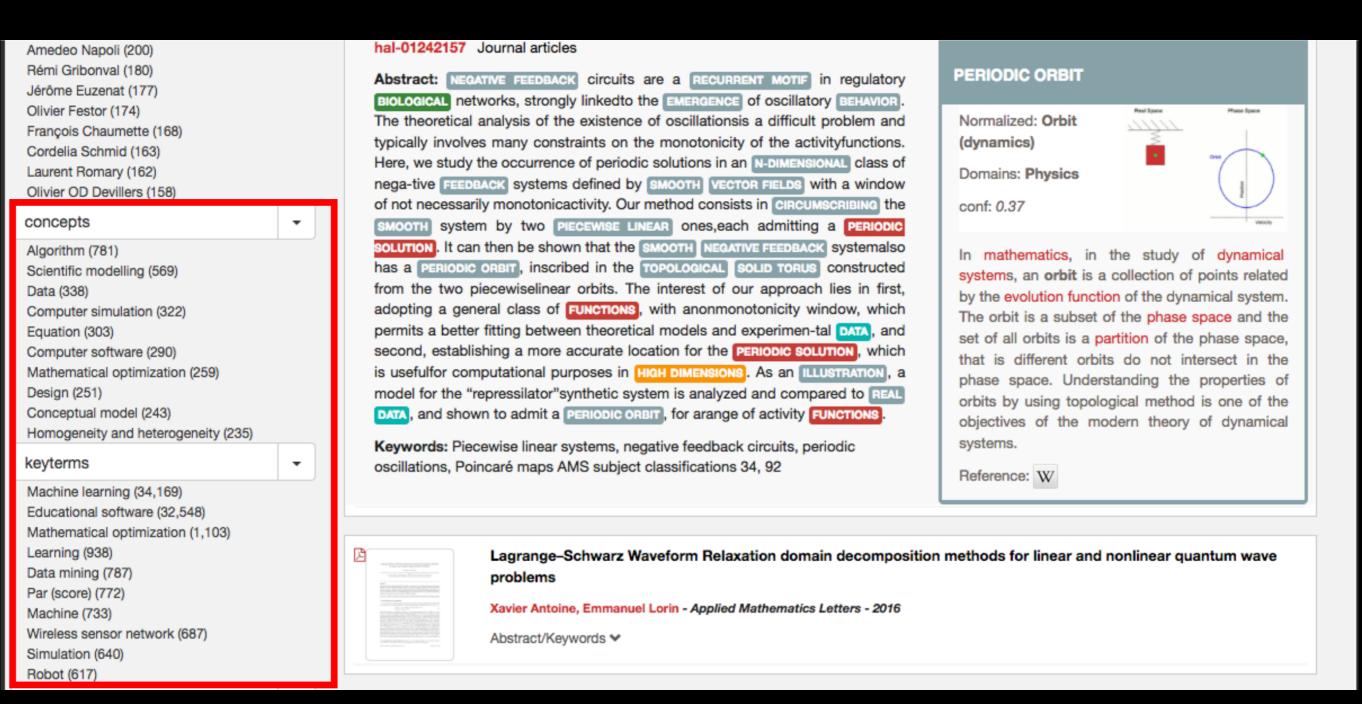


## Some usages

- Scientific entity recognition and disambiguation from PDF (and structure-aware annotation via GROBID)
- Search engine query disambiguation
- Key-phrase and concept extraction from scientific extraction
- And also
  - Taxonomy mapping to Wikidata (astro-thesaurus)
  - Natural language command processing
  - Bibliographical citation matching in Wikidata



## Semantic enrichment for scholar search engine



## Key-concept extraction from scholar articles

Zoomorphology (1985) 105:114-124

#### Domes, arches and urchins: The skeletal architecture of echinoids (Echinod

#### Malcolm Telford

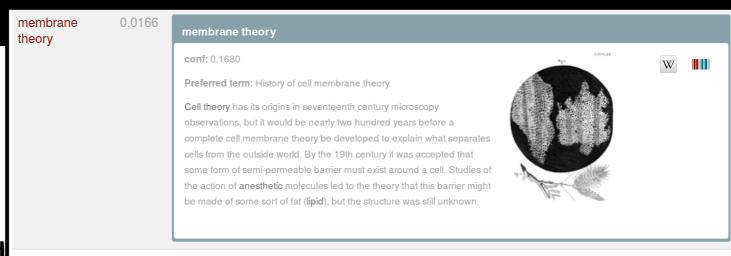
Department of Zoology, University of Toronto, Ontario, M5S 1A1, Canada

Summary. A combination of simple membrane theory and statical analysis has been used to determine how stresses are carried in echinoid skeletons. Sutures oriented circumferentially are subject principally to compression. Those forming radial zig-zags are subject to compression near the apex and tension near the ambitus. Radial and circumferential sutures in Eucidaris are equally bound with collagen fibers but in Diadema, Tripneustes, Psammechinus, Arbacia and other regular echinoids, most radial sutures are more heavily bound, and thus stronger in tension. *Psammechinus*, Tripneustes and several other echinoids have radial sutures thickened by ribs which increase the area of interlocking trabeculae. Ribs also increase flexural stiffness and carry a greater proportion of the stress. Further, ribs effectively draw stress from weaker areas pierced by podial pores, and increase the total load which can be sustained.

Allometry indicates that regular echinoids become relatively higher at the apex as size increases, thus reducing ambital stresses. Some spatangoids with very high domes (eg Agassizia) maintain isometry, but others (eg Meoma) become flatter with size. Both holectypoids (Echinoneus)

in part to the 'f et al. (1976), to to 'Mechanical an understandin (strength, rigidity of skeletal mater 'the overall design Very few analyse and most of the has been directed and its arrangem example, Raup (1 and Currey (1970 (1981), to mentistrength characte derm calcite. Sm micromorphology (1969) experimer pieces of stereom

The mechanic lysed by Burkhan



echinoid

conf: 0.1492

Preferred term: Sea urchin

Sea urchins or urchins, archaically called sea hedgehogs, are small, spiny, globular animals that, with their close kin, such as sand dollar, constitute the class Echinoidea of the echinoderm phylum. About 950 species of echinoids inhabit all oceans from the intertidal to deep. The shell, or "test", of sea urchins is round and spiny, typically from across. Common colors include black and dull shades of green, olive, brown, purple, blue, and red. Sea urchins move slowly, feeding primarily on algae. Sea otter, starfish, wolf eel, triggerfish, and other predators hunt and feed on sea urchins. The name "urchin" is an old word for hedgehog, which sea urchins resemble.



sutures

echinoid

0.0062

0.0083

sutures

conf: 0.1026

Preferred term: Trilobite

Trilobites (; meaning "three lobes") are a fossil group of extinct marine arachnomorph arthropod that form the class Trilobita. Trilobites form one of the earliest known groups of arthropods. The first appearance of trilobites in the fossil record defines the base of the Atdabanian stage of the Early Cambrian period, and they flourished throughout the lower Paleozoic era before beginning a drawn-out decline to extinction when,



7