



NLP and Text Visualization

SFU Natural Language Lab

<http://natlang.cs.sfu.ca/>

SUBJECT PUNCHED QUICKLY OXIDIZED TCEJBUS DEHCNUP YLKCIUQ DEZIDIXO
CERTAIN QUICKLY PUNCHED METHODS NIATREC YLKCIUQ DEHCNUP SDOHTEM
SCIENCE ENGLISH RECORDS COLUMNS ECNEICS HSILGNE SDROCER SNMULOC
GOVERNS PRECISE EXAMPLE MERCURY SNREVOG ESICERP ELPMAXE YRUCREM
CERTAIN QUICKLY PUNCHED METHODS NIATREC YLKCIUQ DEHCNUP SDOHTEM
GOVERNS PRECISE EXAMPLE MERCURY SNREVOG ESICERP ELPMAXE YRUCREM
SCIENCE ENGLISH RECORDS COLUMNS ECNEICS HSILGNE SDROCER SNMULOC
SUBJECT PUNCHED QUICKLY OXIDIZED TCEJBUS DEHCNUP YLKCIUQ DEZIDIXO
CERTAIN QUICKLY PUNCHED METHODS NIATREC YLKCIUQ DEHCNUP SDOHTEM
SCIENCE ENGLISH RECORDS COLUMNS ECNEICS HSILGNE SDROCER SNMULOC

- the engine.
- the engine caught fire.
- Passengers **believed** the engine caught fire.
- Passengers **reported** they saw streaks of flames out of the engine and **believed** the engine had caught fire.



Text is tough (to visualize)*

- Very high dimensionality
 - Tens to hundreds of thousands of features
- Language is compositional and ambiguous
 - Can be combined together in innumerable ways
- Abstract concepts
 - So difficult to visualize
- **Not** pre-attentive
 - Must foveate to read
- Unordered

* i247: Information Visualization and Presentation by Marti Hearst

Explore new visualizations that exploit parsed language

Lensing Language

- **Semantic parsing of natural language:** going beyond topic models and clustering bags of words
- **Exploit language understanding:** *who did what to whom, where, when and how ...*
- **"Embodied" visualization:** place spatial, temporal and social entities into an intuitive low dimensional space

Predicate-centric Ontology

- Semantic Role Labeling to extract predicate argument structures
- Verbose labeling
- Automatically populate a novel predicate-centric ontology
 - Killer
 - Corpse
 - Entity defeated
 - Entity victorious
- Using ontology as facet in visualization
 - Easily find uncommon facts
 - Micro-reading in contrast to macro reading

Semantic Role Labeling

- identifying semantic arguments for a verb of a sentence and defining their roles such as who did what to whom, when and where

The boy hit a ball

hit : Predicate

The boy: Agent

a ball: Patient

} Hitter
} Semantic Role
} Thing hit } Verbose labels

Predicate Sense Disambiguation

Mary gamely kicked in \$5 to John's bail.

Kick.01

A0: kicker

A1: thing kicked

A2: instrument

Kick.03

A0: contributor

A1: contribution

A2: given to

Accuracy: 92%

Features:

Parse tree Contextual
(POS,...)

Visualization

Faceted Browsing

Clear all constraints

Facets Timeline Map

2013 CE

April 15 – Two bombs explode at the Boston Marathon, in Boston, Massachusetts in the United States, killing three and injuring 183.

2013 CE

March 27 – Canada becomes the first country to withdraw from the United Nations Convention to Combat Desertification.

2013 CE

February 15 – A meteor explodes over the Russian city of Chelyabinsk, injuring 1,491 people and damaging over 4,300 buildings. It is the most powerful meteor to strike Earth's atmosphere in over a century. The incident, along with a coincidental flyby of an asteroid, prompts international concern regarding the vulnerability of the planet to meteor strikes.

Role

Clear selection

agent [8981]
theme [6381]
patient [4015]
topic [2653]
thing set [2393]
corpse [2321]
entity changing [2077]
theme(-creation) [1769]
killer [1534]
entity defeated [1331]
entity victorious [1208]
creator [1196]
thing gotten [1009]
taker [957]
leader [857]
thing taken [852]
task [761]
entity succeeding [753]

Person

Clear selection

Alexander [595]
Henry [360]
Antiochus [356]
Charles [349]
Hannibal [319]
John [318]
Ptolemy [245]
Demetrius [231]
Demosthenes [206]
Antiochus III [203]
Constantine [202]
Philip [198]
Franks [196]
Pericles [184]
James [170]
Edward [164]
Pyrrhus [157]
Richard [152]

Current country

Clear selection

United States [11993]
United Kingdom [8297]
Italy [6997]
Greece [4438]
France [4302]
Turkey [3482]
China [2897]
Germany [2856]
Spain [2313]
Egypt [1704]
Japan [1471]
Russia [1301]
India [1174]
The Netherlands [1168]
Iran [1150]
Tunisia [1102]
Israel [1097]
Syria [943]

Location

Clear selection

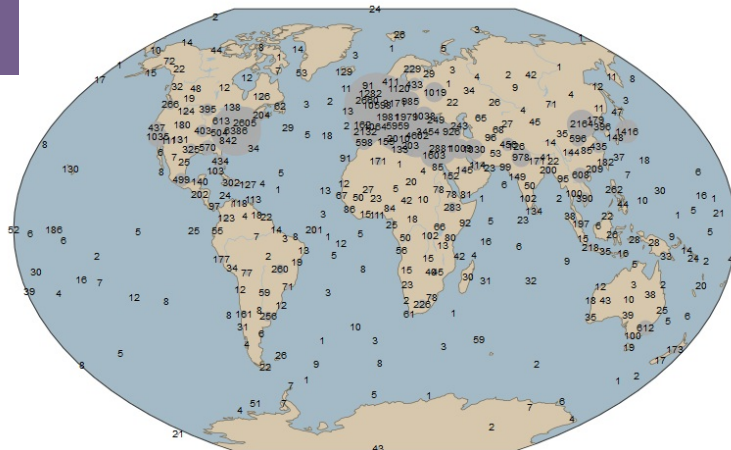
England [2813]
Rome [2811]
United States [2375]
U.S. [1945]
France [1931]
Athens [1653]
China [1530]
Italy [1370]
London [1329]
Japan [1150]
Egypt [1111]
Germany [1068]
Constantinople [1003]
Spain [1001]
India [814]
United Kingdom [810]
Sicity [797]
Greece [773]

Clear selection Toggle Drag Pan

- + Centre View

Facets Timeline Map

Map



Timeline



Framework



Article [Talk](#) **Wikipedia Human History** [Read](#) [Edit](#) [View history](#)

1471 **Time**

From Wikipedia, the free encyclopedia

Events [\[edit\]](#)

January–December [\[edit\]](#)

- **March 1** – Emperor **Le Thanh Tong** captures the Champa Capital, establishing new regions in middle Vietnam.
- **March** – The Yorkist King **Edward IV** returns to England to reclaim his throne.
- **April 14** – **Battle of Barnet**: Edward defeats the **Lancastrian** army under **Warwick**, who is killed.

~41K descriptions

Descriptions

**Entity Extraction
(NER & hyperlinks)**

Locations

~12K locations
~12K persons

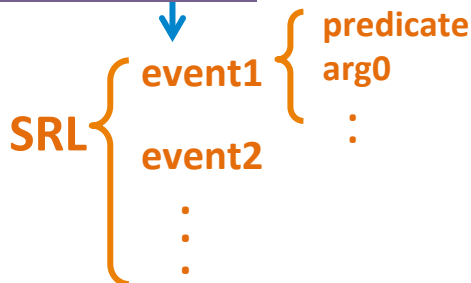
Persons

Google reverse
geo-coding

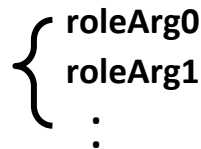
Country

**Knowledge
Base**

kill	2100
found	1801
defeat	1637



**Predicate Sense
Disambiguation**



```
{
```

```
"arg0": "Emperor Le Thanh Tong",
```

```
"arg1": "the Champa Capital",
```

```
"event": "capture",
```

```
"latitude": 21.03,
```

```
"longitude": 105.85,
```

```
"country": "Vietnam",
```

```
"roleArg0": "getter",
```

```
"roleArg1": "thing gotten",
```

```
"year": 1471,
```

```
"person": "Le Thanh Tong",
```

```
"location": {"Champa Capital", "Vietnam"},
```

```
→ "description": "March 1 – Emperor Le Thanh Tong captures the Champa Capital, establishing new regions in middle Vietnam.",
```

```
"Wikipedia_categories": {  
  "Vietnamese poets", "Lê Dynasty emperors", "Southeast Asian countries", "15th-century monarchs in Asia",...}
```

```
}
```

~83K events

Verifying Name Entities

- Map to Wikipedia articles
 - Person
 - Wikipedia categories and infobox: “YEAR births”, “YEAR deaths”, “Kings of*”, “Born”, “Religion”,...
 - Location
 - Latitude & longitude
 - Organization
 - Wikipedia categories and infobox: “Established in*”, “Companies*”, “Founder”, “Headquarters”, “Employees”, ...
- Ongoing work on machine learning for domain adaptation and Wikipedia Categories



Maryam Siahbani



Max Whitney

Demo