

# NLP

- Basic concepts
- Tools

- Interactions between
  - COMPUTERS
    - Unstructured information
    - Programming Languages (c++, Java...)
  - Human (natural) language
    - Ambiguities, missing information...
    - Sentiments, e.g. irony..
    - Fluent dialogs
- Inter-disciplinary subject
  - AI, language, linguistics, statistics, CS,...



# What can NLP do for me?

- Cleanup, tokenization
  - Clean the text and find the components (and functions) of each sentence
- Stemming
  - Find the root
- Lemmatization
  - Find the lemma

# What can NLP do for me?

- Part-of-speech tagging
- Query suggestions/expansion
- Information extraction
- Entity recognition
- Sentiment analysis
- Disambiguation
- Text similarity

# What can NLP do for me?

- Machine translation
- Language recognition
- Summarization
- Speech recognition/processing
- Question answering
- Text to speech
- ...

- Apache Tika
  - API for extracting metadata from (almost) any format
  - Useful for search engine indexing, content analysis, translation,...



```
LanguageIdentifier identifier = new LanguageIdentifier("This is my text");  
String language = identifier.getLanguage();
```

- <http://nlp.stanford.edu/software>
  - Main NLP tools (in Java) for English, Spanish, Chinese, and German(\*)
    - tokenization, part-of-speech tagging, named entity recognition, parsing, and coreference, classifier (ML).
  - open source, **licensed under the [GNU General Public License](#)**



(\*) Most tools

# Stanford CoreNLP

Output format: Visualise ▾

Please enter your text here:

Hi this is a test for our workshop in Wien!

Senden Clear

## Part-of-Speech:

NN DT VBZ DT NN IN PRP\$ NN IN NNP  
1 Hi this is a test for our workshop in Wien!

## Named Entity Recognition:

Pers  
1 Hi this is a test for our workshop in Wien!

## Coreference:

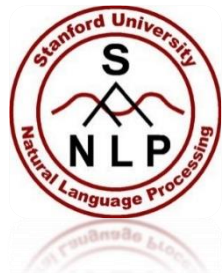
Mention --- Coref --- Mention  
1 Hi this is a test for our workshop in Wien!

## Basic Dependencies:

nsubj dep cop det nmod:poss nmod:case nmod:case  
1 Hi this is a test for our workshop in Wien!

## Enhanced Dependencies:

nsubj dep cop det nmod:for:case nmod:poss nmod:in:case  
1 Hi this is a test for our workshop in Wien!





## Stanford Named Entity Tagger

Classifier:

Output Format:

Preserve Spacing:

Please enter your text here:

Am 9. Juni 2015 lädt die WU zu einer Gesprächsrunde über die "Affäre Borodajkewycz" ein, die sich heuer zum 50. Mal jährt. Damit leistet sie einen Beitrag zur kritischen Auseinandersetzung mit einer der dunkelsten Episoden der österreichischen Nachkriegsgeschichte und der eigenen Universitätsgeschichte. Die Zeitzeugen Bundespräsident Heinz Fischer, Bundesminister a.D. Ferdinand Lacina und Elizabeth T. Spira werden im Gespräch mit Rektor Christoph Badelt und Wirtschaftshistoriker Peter Berger über ihr Erleben der Affäre Borodajkewycz berichten, das Zeitgeschehen analysieren und dazu Stellung nehmen. Melden Sie sich gleich an!

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Potential tags:

- I-MISC
- B-LOC
- I-PER
- I-LOC
- B-MISC
- I-ORG
- B-ORG



- Python library supporting multiple NLP tasks
  - classification, tokenization, stemming, tagging, parsing, semantic reasoning,...

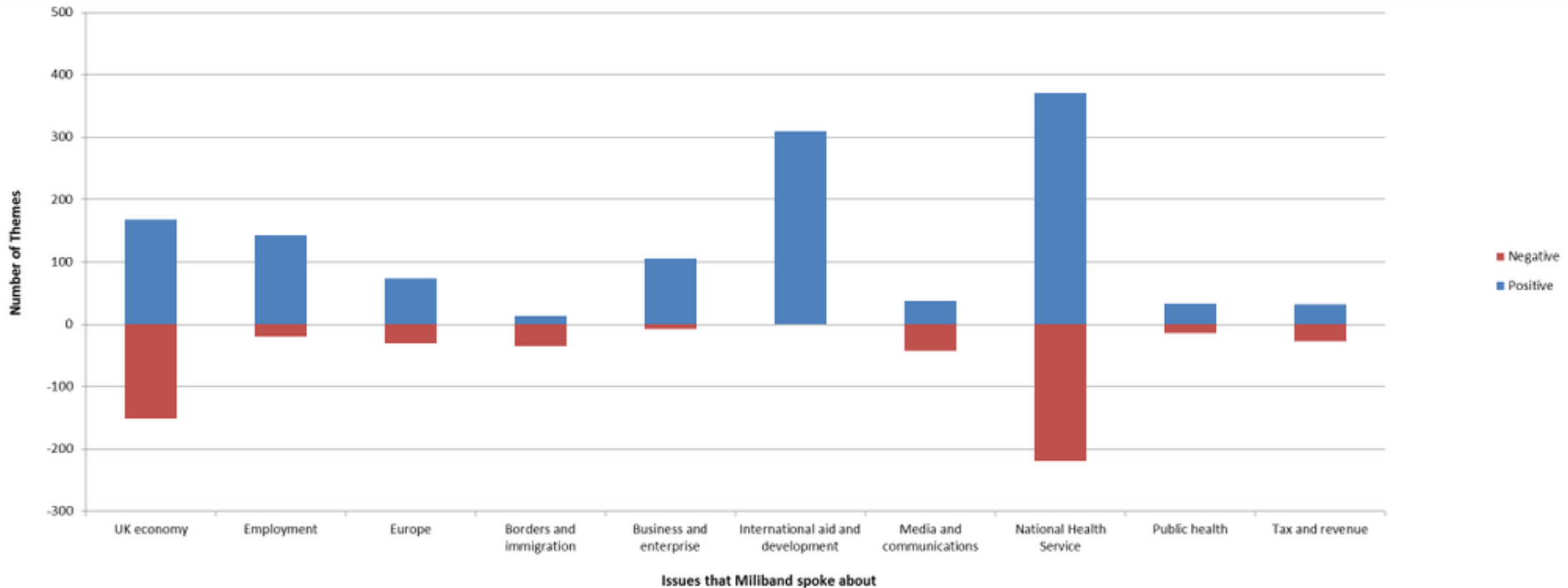
```
>>> import nltk
>>> sentence = """At eight o'clock on Thursday morning
... Arthur didn't feel very good."""
>>> tokens = nltk.word_tokenize(sentence)
>>> tokens
['At', 'eight', "o'clock", 'on', 'Thursday', 'morning',
'Arthur', 'did', "n't", 'feel', 'very', 'good', '.']
>>> tagged = nltk.pos_tag(tokens)
>>> tagged[0:6]
[('At', 'IN'), ('eight', 'CD'), ("o'clock", 'JJ'), ('on', 'IN'),
('Thursday', 'NNP'), ('morning', 'NN')]
```



- R: <http://cran.rstudio.org/web/packages/NLP/>
  - Based on functionalities from Stanford and Apache OpenNLP
- Apache OpenNLP: <https://opennlp.apache.org/>
  - tokenization, sentence segmentation, part-of-speech tagging, named entity extraction, chunking, parsing, and coreference resolution

# Sentimental analysis

- Gate: <https://gate.ac.uk/>
  - Annotate and analyse corpus

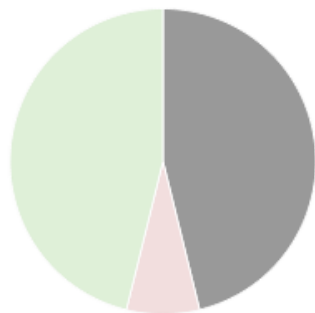


# Sentimental analysis

- Plenty of (freemium) tools and APIs
  - <https://www.metamind.io/>
  - <http://www.socialmention.com/>
  - <http://www.alchemyapi.com/>
  - <http://www.clarabridge.com/>
  - <http://www.lymbix.com/>



# MetaMind



● neutral ● negative ● positive

Twitter search: @wu\_vienna

#### positive

- Now: @CEMS\_alliance event with @BCG at beautiful @WU\_Vienna. Big thanks to Sabine Baresch (Head of #HR Austria) & @CEMSClubVienna!
- RT @cems\_alliance: @Indogermanican @BCG @wu\_vienna @CEMSClubVienna Hope it turns out to be a great time!

#### neutral

- RT @Prison\_Health: Effect of Incentives & Meta-Incentives on the Evolution of Cooperation <http://t.co/36UXLYZPYW> HT @wu\_vienna
- WU Campus is made of a lot of different buildings, which one is your favorite?! #studyabroad #vienna @wu\_vienna <https://t.co/4u5xaKUwDI>

#### negative

- RT @anna\_narloch: You don't want to be embarrassed by your #investment #ReinhardMillner #npotag#SocialImpactBond @npokompetenz @wu\_vienna

@wu\_vienna

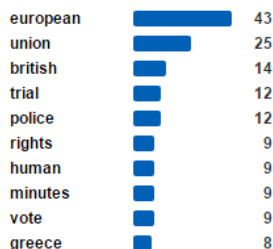
Classify



## Sentiment



## Top Keywords



## Top Users



## Top Hashtags

## Mentions about european union

Sort By:  Results: 

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-  [European trial over man mistakenly killed by British police](#)

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-  [Proposals for a referendum on the UK's membership of European Union have ...](#)

The vote follows the first debate on the EU Referendum Bill and means the legislation move to the next of the process through Parliament. The Conservatives and Labou...

[www.gloucestercitizen.co.uk/Proposals-referendum-UK-s-membership-European/story-26670087-detail/story.html](http://www.gloucestercitizen.co.uk/Proposals-referendum-UK-s-membership-European/story-26670087-detail/story.html)  
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