

ER&RE

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Future Work

Entity Recognition and Relation Extraction

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Presentation Outline

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Aim

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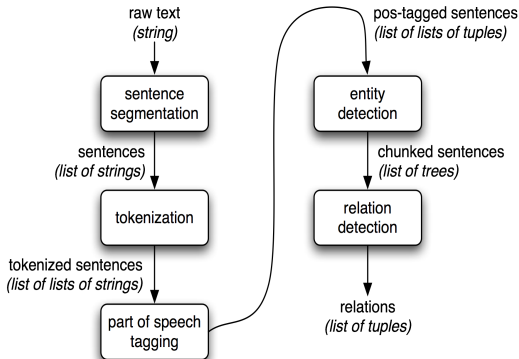
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To recognise entities(Named Entites) in the given text and extracting relationships.



www.nltk.org/book/

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In 1917, Einstein applied the general theory of relativity to model the large-scale structure of the universe. He was visiting the United States when Adolf Hitler came to power in 1933 and did not go back to Germany, where he had been a professor at the Berlin Academy of Sciences. He settled in the U.S., becoming an American citizen in 1940. On the eve of World War II, he endorsed a letter to President Franklin D. Roosevelt alerting him to the potential development of "extremely powerful bombs of a new type" and recommending that the U.S. begin similar research. This eventually led to what would become the Manhattan Project. Einstein supported defending the Allied forces, but largely denounced using the new discovery of nuclear fission as a weapon. Later, with the British philosopher Bertrand Russell, Einstein signed the Russell-Einstein Manifesto, which highlighted the danger of nuclear weapons. Einstein was affiliated with the Institute for Advanced Study in Princeton, New Jersey, until his death in 1955.

Tag colours:

LOCATION TIME PERSON ORGANIZATION MONEY PERCENT DATE

Image: <http://www.europeana-newspapers.eu/named-entity-recognition-for-digitised-newspapers/>

Entity Recognition

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We can achieve this in two ways:

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We can achieve this in two ways:

- Procedure 1
 - PoS Tagging
 - Named Entity Chunking

Entity Recognition

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We can achieve this in two ways:

- Procedure 1
 - PoS Tagging
 - Named Entity Chunking
- Procedure 2
 - Named Entity Extraction as Tagging

Intro. to PoS Tagging

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Part-of-Speech Tagging

INPUT:

Profits soared at Boeing Co., easily topping forecasts on Wall Street,
as their CEO Alan Mulally announced first quarter results.

OUTPUT:

Profits/**N** soared/**V** at/**P** Boeing/**N** Co./**N** ,/**,** easily/**ADV** topping/**V**
forecasts/**N** on/**P** Wall/**N** Street/**N** ,/**,** as/**P** their/**POSS** CEO/**N**
Alan/**N** Mulally/**N** announced/**V** first/**ADJ** quarter/**N** results/**N** ./.

N = Noun
V = Verb
P = Preposition
Adv = Adverb
Adj = Adjective

...

PoS Tagging Contd..

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Here we used NLTK's recommended PoS Tagger. It uses the Penn Treebank tagset.

Intro to Named Entity Chunking

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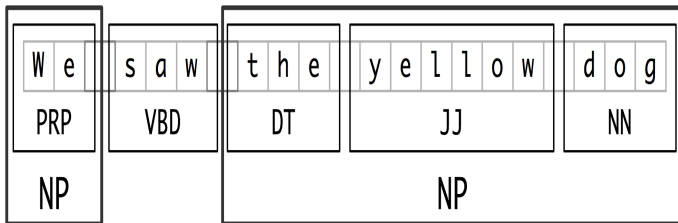
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Named Entity Chunking Contd...

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- We can use *hand-written rules*(**Ex: regular expressions** to chunk tags in to a named-entity. Or we use a trained chunker.
- In the case we used NLTK's recommended Chunker. Which is trained on ACE(Automatic Context Extraction).

Entity Extraction itself as Tagging

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Example: Bikel et. al 1999 (Named Entity Recognition) Named Entity Extraction as Tagging

INPUT:

Profits soared at Boeing Co., easily topping forecasts on Wall Street,
as their CEO Alan Mulally announced first quarter results.

OUTPUT:

Profits/NA soared/NA at/NA Boeing/SC Co./CC ,/NA easily/NA
topping/NA forecasts/NA on/NA Wall/SL Street/CL ,/NA as/NA
their/NA CEO/NA Alan/SP Mulally/CP announced/NA first/NA
quarter/NA results/NA ./NA

NA = No entity
SC = Start Company
CC = Continue Company
SL = Start Location
CL = Continue Location

...

Entity Extraction as Tagging Contd..

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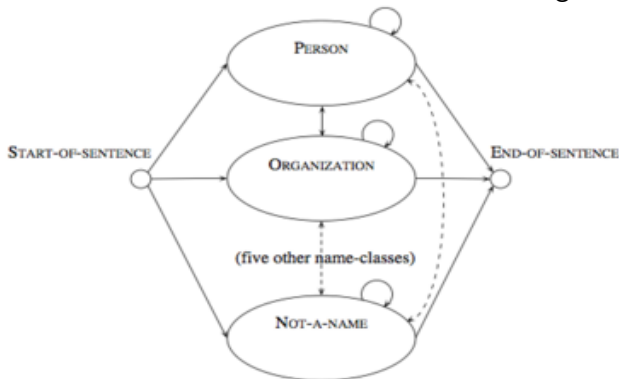
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Bikel et al. used Hidden Markov Models to tag.



<http://curtis.ml.cmu.edu/w/courses/index.php/>

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What kind of relationship is there between entities



PERSON

Founder?
Investor?
Member?
Employee?
President?



ORGANIZATION

Intro to Relation Extraction

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Future Work

- Here we are using *hand-written patterns*(**regular expressions**) to extract the relationship.
- We may use the so-called *learning technique*. But we may need huge hand-labeled training data(in case of supervised) or very advanced techniques(in case of unsupervised).

How ?

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Future Work

- Form relation-tuples of the form $(subj, filler, obj)$
- $subj, obj$ are Entities and $filler$ is text.
- Apply rules on $filler$ to extract relation.

Applications of Relation Extraction

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Concentrated application is **Question Answering**
where are different facilities located
who is employed by what company.

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Future Work

- Technologies: Python,NLTK.
- Tested: BBC business text.
- Worked only with few class
PERSON,LOCATION,ORGANIZATION,GPE.
- Looking forward to work with 7 classes.
- Started workin with **Stanford Named Entity Recognizer**.
- Theoretical study of HMMTagger,Maximum Entropy
Markov Model Tagger(*not completed*) and Perceptron
Tagger(*not completed*).
- Generative vs. discriminative learning models.

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Future Work

- To do everything done so far for Indian languages.
- Tried but left the work due to some difficulties observed.

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Thank You