
Named Entity Recognition

IS407 Intro to Data Science

What we will discuss today

- Section-1: Introduction
 - Section-2: Use cases and Results
 - Section-3: Implementation in Python
 - Section-4: What lies ahead?
 - Section-5: Further References
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Introduction

What is NER?

Named entity recognition (NER) is an NLP based technique to identify and assign labels named entities in text

Labels like a person, location, organisation, product etc.

What is a Named entity?

A real world object denoted by proper noun

Named Entities

Examples:

- Champaign - <city>
 - UIUC - <university>
 - Sharvi Tomar - <person>
 - Grainger Engineering Library - <location>
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Use Cases

- Document Categorisation
 - Tracking mentions of particular entities in documents
 - For question answering, answers are usually named entities
 - Extracting wanted information using named entities
 - Support Chatbots
 - NER for Medical Purposes
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Results

Below is an screenshot of how a NER algorithm can extract particular entities from a given text:

When **Sebastian Thrun PERSON** started working on self - driving cars at **Google ORG** in **2007 DATE** , few people outside of the company took him seriously . “ I can tell you very senior CEOs of major **American NORP** car companies would shake my hand and turn away because I was n’t worth talking to , ” said **Thrun PERSON** , in an interview with **Recode ORG**

Intuition: Example Sentence

'European authorities fined Google a record \$5.1 billion on Wednesday for abusing its powers'

Step-1: Tokenize

```
[ 'European',  
  'authorities',  
  'fined',  
  'Google',  
  'a',  
  'record',  
  '$',  
  '5.1',  
  'billion',  
  'on',  
  'Wednesday',  
  'for',  
  'abusing',  
  'its',  
  'powers' ]
```

Step-2: Part-of-Speech(POS) Tagging

```
[('European', 'JJ'),  
 ('authorities', 'NNS'),  
 ('fined', 'VBD'),  
 ('Google', 'NNP'),  
 ('a', 'DT'),  
 ('record', 'NN'),  
 ('$ ', '$ '),  
 ('5.1', 'CD'),  
 ('billion', 'CD'),  
 ('on', 'IN'),  
 ('Wednesday', 'NNP'),  
 ('for', 'IN'),  
 ('abusing', 'VBG'),  
 ('its', 'PRP$'),  
 ('powers', 'NNS')]
```

Step-3: Chunking Noun Phrases

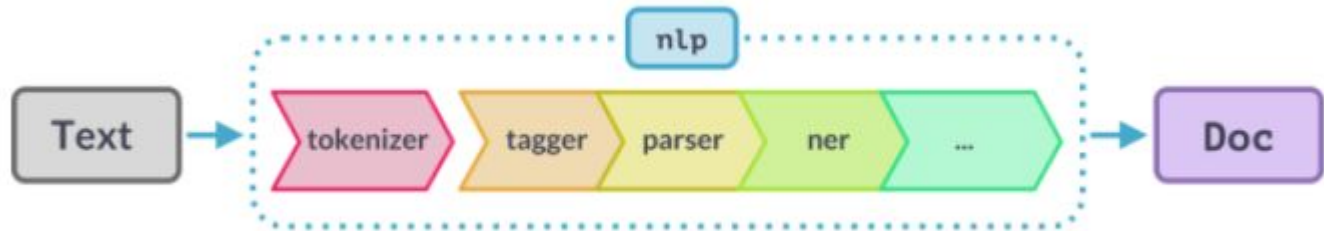
- Identify named entities using a regular expression(regex)
- Regex rules indicate how sentences should be chunked
- Our chunk pattern consists of one rule, that a noun phrase, NP, should be formed whenever the chunker finds an optional determiner, DT, followed by any number of adjectives, JJ, and then a noun, NN.

```
pattern = 'NP: {<DT>?<JJ>*<NN>}'
```

Step-4: Add category labels to named entities

```
(S
  European/JJ
  authorities/NNS
  fined/VBD
  Google/NNP
  (NP a/DT record/NN)
  $/$
  5.1/CD
  billion/CD
  on/IN
  Wednesday/NNP
  for/IN
  abusing/VBG
  its/PRP$
  (NP power/NN)
```

SpaCy's Pipeline



Section-2 Approaches

A. Traditional approaches :

- Rule-based solutions: have an obvious flaw, i.e. they require a well-defined and exhaustive lexicon set
- Feature-based supervised machine learning approaches: requires carefully hand-crafted features like lookup list, case/morphology/POS tag etc to make it work.

B. Deep Learning-based models

- Training Neural Network models for NER
 - Rather than training models from scratch, the new paradigm in NLP is to select an off-the-shelf model that has been trained on the task of “language modelling” (predicting which words belong in a sentence), then “fine-tuning” the model with data from your specific task.
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Section-3: Implementation

Let's jump to experiment notebook

Section-4: What's next for you?

- Advanced courses at UIUC
 - IS 567 - Text Mining
 - CS 447 - Natural Language Processing
 - CS 410 - Text Information Systems
 - CS 510 - Advanced Information Retrieval
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Section-5: References for further study

R book with chapters and examples with NER (need university library to access)

<https://learning.oreilly.com/library/view/mastering-text-mining/9781783551811/ch07.html#ch07lv11sec41>

<https://learning.oreilly.com/library/view/mastering-text-mining/9781783551811/ch07s03.html#ch07lv13sec59>

Implementation in R

<https://www.analyticsvidhya.com/blog/2021/06/nlp-application-named-entity-recognition-ner-in-python-with-spacy/#:~:text=Spacy%20is%20an%20open%2Dsource,very%20easily%20for%20NER%20tasks.>

<https://towardsdatascience.com/named-entity-recognition-ner-using-spacy-nlp-part-4-28da2ece57c6>

<https://towardsdatascience.com/custom-named-entity-recognition-using-spacy-7140ebbb3718>

<https://medium.com/in-pursuit-of-artificial-intelligence/named-entity-recognition-using-spacy-ner-da6eebd3d08>

<https://nanonets.com/blog/named-entity-recognition-with-nltk-and-spacy/>

<https://towardsdatascience.com/named-entity-recognition-with-nltk-and-spacy-8c4a7d88e7da>

Questions/comments?
