

## Introduction to NLP

Information extraction





## **Information Extraction**

- Usually from unstructured or semi-structured data
- Examples
  - News stories
  - Scientific papers
  - Resumes
- Entities
  - Who did what, when, where, why
- Build knowledge base



### **Named Entities**

- Types:
  - People
  - Locations
  - Organizations
    - Teams
    - Newspapers
    - Companies
  - Geo-political entities
- Ambiguity:
  - London can be a person, city, country (by metonymy) etc.
- Useful for interfaces to databases, question answering, etc.



## **Times and Events**

- Times
  - Absolute expressions
  - Relative expressions (e.g., "last night")
- Events



# **Sequence Labeling**

- Many NLP problems can be cast as sequence labeling problems
  - POS part of speech tagging
  - NER named entity recognition
  - SRL semantic role labeling
- Input
  - Sequence w<sub>1</sub>w<sub>2</sub>w<sub>3</sub>
- Output
  - Labeled words
- Classification methods
  - Can use the categories of the previous tokens as features in classifying the next one
  - Direction matters



# Named Entity Recognition (NER)

#### Segmentation

- Which words belong to a named entity?
- Brazilian football legend <u>Pele</u>'s condition has improved, according to a <u>Thursday evening</u> statement from a <u>Sao Paulo</u> hospital.

#### Classification

- What type of named entity is it?
- Use gazetteers, spelling, adjacent words, etc.
- Brazilian football legend [PERSON Pele]'s condition has improved, according to a [TIME Thursday evening] statement from a [IOCATION Sao Paulo] hospital.



# NER, Time, and Event Extraction

- Brazilian football legend [ $_{PERSON}$  Pele]'s condition has improved, according to a [ $_{TIME}$  Thursday evening] statement from a [ $_{LOCATION}$  Sao Paulo] hospital.
- There had been earlier concerns about Pele's health after [ORG Albert Einstein Hospital] issued a release that said his condition was "unstable."
- [TIME Thursday night]'s release said [EVENT Pele was relocated] to the intensive care unit because a kidney dialysis machine he needed was in ICU.



# **Biomedical Example**

- Gene labeling
- Sentence:
  - [GENE BRCA1] and [GENE BRCA2] are human genes that produce tumor suppressor proteins