# **Plug Latent Structures and Play Coreference Resolution**

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# **Motivation**

**• coreference resolution**: which mentions in a text are used to refer to the same entity?

Manchester United have confirmed they are on the verge of signing **Bayern Munich midfielder Bastian Schweinsteiger**.

**The World Cup winner** is set to undergo a medical and it is unlikely there will be problems agreeing personal terms with him.

- tackled by increasingly complex structured prediction approaches
- ► key idea: view coreference resolution as prediction of latent structures

**Theoretical Studies** 

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# **Toolkit Overview**

- Python implementation of framework proposed in Martschat and Strube (TACL, 2015), extending analysis toolkit cort
- **graph-based representation** of structures
- learning: structured perceptron with cost-augmented inference
- Iready implemented: mention pair, mention ranking, antecedent trees
- ► works on CoNLL data and raw text
- ► source code and more:

http://github.com/smartschat/cort

▶ install:

pip install cort

#### **Plug-and-Play Coreference Resolution**

# **Example: Mention Ranking Model**

cast coreference as ranking of candidate antecedents for anaphor

Define search space for latent (sub)structures



def extract\_substructures(doc): substructures = []

*# iterate over mentions* for i, ana in enumerate(doc.system\_mentions): for\_anaphor\_arcs = []

*# iterate in reversed order over candidate antecedents* for ante in sorted(doc.system\_mentions[:i], reverse=True): for\_anaphor\_arcs.append((ana, ante))

substructures.append(for\_anaphor\_arcs)

return substructures

► represent each document as a graph ▶ instances: substructures (colored black)

► define valid arcs for substructures



class RankingPerceptron(perceptrons.Perceptron): def argmax(self, substructure, arc\_information): (best, max\_val, best\_cons, max\_cons, best\_is\_cons) = \ self.find\_best\_arcs(substructure, arc\_information)

> return ([best], [], [max\_val], [best\_cons], [], [max\_cons], best\_is\_cons)

► get highest scoring structure & highest scoring structure consistent with gold

► supports incorporating cost functions

# Visualization and Analysis

- building upon error analysis toolkit (Martschat et al., 2015)
- ► visualize and analyze decisions and errors of approaches

#### cort visualization: wsj\_0174\_part\_000

| Documents           |  |
|---------------------|--|
| wsj_0126_part_000   | 1. ORTEGA ENDED a truce with the Contrast and said elections were threatened .           |
| wsj_0134_part_000   | Recall   |
| wsj_0174_part_000   | 2. The Nicaraguan president , citing attacks by the U.S backed rebels , suspended a 19 - |
| wsj_2278_part_000   | month - old cease - fire and accused Bush of `` promoting death . "                      |
| wsj_2400_part_000 - |  |
| Errors (11)         | 3. While he reaffirmed support for the country 's Feb. 25 elections , Ortega indicated   |
|                     | that renewed U.S. military aid to the Contrast could thwart the balloting                |

#### Results

- **state-of-the-art** performance on CoNLL-2012 data
- compare with HOTCoref (Björkelund and Kuhn, 2014) and nn\_coref (Wiseman et al., 2015)



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