

Coreference Resolution

Introduction

What is Coreference Resolution?

- Manning and Clark:

Coreference Resolution is the task of identifying which mentions in a text refer to the same real world entity. A mention is a text span, usually coherent, which serves as a referent to an entity.

Improving Coreference Resolution by Learning Entity-Level Distributed Representations

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What is Coreference Resolution?

Beispiel

[Barack Obama]₁¹ nominated [Hillary Clinton]₂² as [[his]₃¹ secretary of state]₄³ on [Monday]₅⁴. [He]₆¹

- Superscript: ID of an entity
- Subscript: ID of a mention

What is Coreference Resolution?

- What is the structure of the problem?
- Goal is it to predict an ID for every mention (the entity ID)
- Example:

| Mention-ID | Entity-ID |
|------------|-----------|
| 1 | 1 |
| 2 | 1 |
| 3 | 1 |
| 4 | 1 |

➔ This means, the first 4 mentions are all the same entity

What is Coreference Resolution?

- The amount of entities is unknown, but it resides in $[1, n]$, with n being the amount of mentions in the text

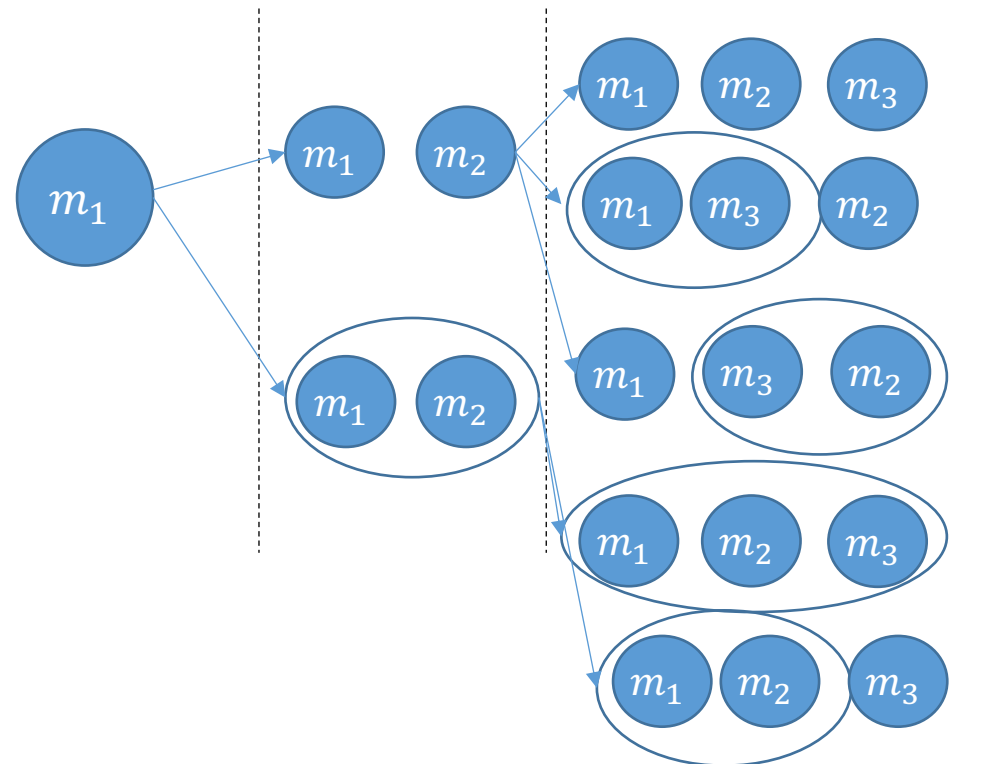
Coreference, more formal

The task of Coreference Resolution is to provide an entity ID for every mention, this results in a **clustering** of mentions

- ➔ The structure of Coreference Resolution is to predict a clustering among all possible clusterings

Coreference as Clustering

- How many possibilities to cluster n mentions
- Idea: Swipe iteratively through the text and keep track of all possible sub-clusterings



Coreference as Clustering

- We observe:
 - Every clustering with k clusters, creates $k + 1$ clusters in the next step
- You can now try to sum this and you will end up at the **Bell number**

$$B_n = \frac{1}{e} \sum_{k=0}^{\infty} \frac{k^n}{k!}$$

Coreference as Clustering

- Bell number:

| Amount mentions | Bell number |
|-----------------|--------------------------|
| 10 | 115975 |
| 20 | 51724158236496 |
| 30 | 846749014529889671069667 |
| 50 | $1.8572414972124E+47$ |
| 100 | $2.3 \cdot 10^{117}$ |

➔ The amount of clusters is growing extremely fast, scoring and ranking them is infeasible!

Coreference Resolution – Literary Phenomena

- If you are dealing with Coreference literature, you should know some literary phenomena

| Phenomenon | Example |
|-------------------|---|
| Apposition | [Otto] ₁ ¹ , [her oldest son] ₂ ¹ |
| Predicative | [He] ₁ ¹ was [a baker] ₂ [?] |
| Expletive | [It] is raining |
| Singleton | An entity with just a single reference |
| Split Antecedents | [[Hansel] ₁ ¹ and [Gretel] ₂ ²] ₃ ³ . [They] ₄ ³ |
| Bridging Anaphora | I met [two interesting people] yesterday. [The woman] |