

# Entity Linking

Lecture 17, Oct 29, 2019

Throughout this exercise, you will annotate a sample text using simple (yet effective) entity linking approach, known as “CMNS”<sup>1</sup>.

You are provided with the data from a knowledge graph and asked to annotate a document using a general entity linking consisting of mention detection, candidate selection, and disambiguation steps. Table 1 presents an excerpt from a surface form dictionary, together with the number of times an entity appeared as the target link of the mention in Wikipedia (denoted as *count*). “*\_total*” is the total number of times a mention is linked to any entity.

## Input text:

“... Angola changed from a one-party Marxist-Leninist system ruled by the MPLA to a formal multiparty democracy following the 1992 elections ...”

Table 1: An excerpt from the surface form dictionary.

Mention	Entity	Count
1992 elections	⟨wikipedia:Philippine_general_election,_1992⟩	9
1992 elections	⟨wikipedia:Angolan_presidential_election,_1992⟩	1
1992 elections	<i>_total</i>	98
angola	⟨wikipedia:Angola⟩	4026
angola	⟨wikipedia:Angola_(Portugal)⟩	6
angola	⟨wikipedia:Angola_national_football_team⟩	120
angola	<i>_total</i>	4298
democracy	⟨wikipedia:Democracy⟩	108
democracy	⟨wikipedia:Democracy_(album)⟩	3
democracy	<i>_total</i>	2162
multiparty democracy	⟨wikipedia:multiparty_democracy⟩	11
multiparty democracy	<i>_total</i>	11
one party	⟨wikipedia:Non-possessors⟩	1
one party	⟨wikipedia:Single-party_state⟩	5
one party	<i>_total</i>	983

## Step 1: Mention detection

Mention detection in CMNS is based on the following heuristic:

It starts with longest possible n-gram of the text (e.g.  $n = 8$ ). If the n-gram is found in the dictionary, the mention and the corresponding entities are kept (and the shorter n-grams are ignored). Otherwise, it tries to match the (n-1)-grams. The algorithm continues recursively until a mention is found or  $n$  reaches to 1.

**Question.** Considering Table 1, what is the output of the mention detection step for the given sample text?

**Answer:** All mention-entity pairs of Table 1 are considered, except the ones related to the mention “democracy.” We ignore this mention, because the longer mention “multiparty democracy” is considered.

## Step 2: Entity ranking

Entity ranking in CMNS is based on the commonness score:

$$\text{Commonness}(e, m) = p(e|m) = \frac{n(m, e)}{\sum_{e'} n(m, e')}, \quad (1)$$

where  $n(m, e)$  denotes the number of times entity  $e$  is the link target of mention  $m$ .

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<sup>1</sup>pronounced as commonness.

**Question.** Compute the commonness for all mention-entity pairs, where mention is “1992 elections”.

**Answer:** Even though the question asks the commonness for the first two lines of Table 1, we present it for all mention-entity pairs.

Mention	Entity	Commonness
1992 elections	<a href="#">⟨wikipedia:Philippine_general_election,_1992⟩</a>	<a href="#">9/98 = 0.09</a>
1992 elections	<a href="#">⟨wikipedia:Angolan_presidential_election,_1992⟩</a>	<a href="#">1/98 = 0.01</a>
angola	<a href="#">⟨wikipedia:Angola⟩</a>	<a href="#">4026/4298 = 0.93</a>
angola	<a href="#">⟨wikipedia:Angola_national_football_team⟩</a>	<a href="#">120/4298 = 0.03</a>
angola	<a href="#">⟨wikipedia:Angola_(Portugal)⟩</a>	<a href="#">6/4298 = 0.001</a>
multiparty democracy	<a href="#">⟨wikipedia:multiparty_democracy⟩</a>	<a href="#">11/11 = 1</a>
one party	<a href="#">⟨wikipedia:Single-party_state⟩</a>	<a href="#">5/983 = 0.005</a>
one party	<a href="#">⟨wikipedia:Non-possessors⟩</a>	<a href="#">1/983 = 0.001</a>

### Step 3: Disambiguation

CMNS performs disambiguation by returning the top ranked entity for each mention, when the ranking score is above the threshold  $\tau_s$ .

**Question.** Considering  $\tau_s = 0.01$ , what is the output of the CMNS approach?

**Answer:**

Mention	Entity
<a href="#">1992 elections</a>	<a href="#">⟨wikipedia:Philippine_general_election,_1992⟩</a>
<a href="#">angola</a>	<a href="#">⟨wikipedia:Angola⟩</a>
<a href="#">multiparty democracy</a>	<a href="#">⟨wikipedia:multiparty_democracy⟩</a>