Concept Alignment for Multilingual Machine Translation

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Arianna Masciolini

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- in such systems, **lexical exactness** is as important as grammaticality
  - need for high-quality **translation lexica** preserving semantics *and* morphological correctness

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  - possible when **example parallel data** are available

A parallel corpus

Alice thought she might as well wait, as she had nothing else to do, and perhaps after all it might tell her something worth hearing.

For some minutes it puffed away without speaking, but at last it unfolded its arms, took the hookah out of its mouth again, and said, 'So you think you're changed, do you?'

'I'm afraid I am, sir,' said Alice; 'I can't remember things as I used--and I don't keep the same size for ten minutes together!'

Alice pensò che poteva aspettare, perchè non aveva niente di meglio da fare, e perchè forse il Bruco avrebbe potuto dirle qualche cosa d'importante.

Per qualche istante il Bruco fumò in silenzio, finalmente sciolse le braccia, si tolse la pipa di bocca e disse: — E così, tu credi di essere cambiata?

— Ho paura di sì, signore, — rispose Alice. — Non posso ricordarmi le cose bene come una volta, e non rimango della stessa statura neppure per lo spazio di dieci minuti!

From Lewis Carroll, *Alice's adventures in Wonderland*. Parallel text at `paralleltext.io`

Alignment

Word alignment:

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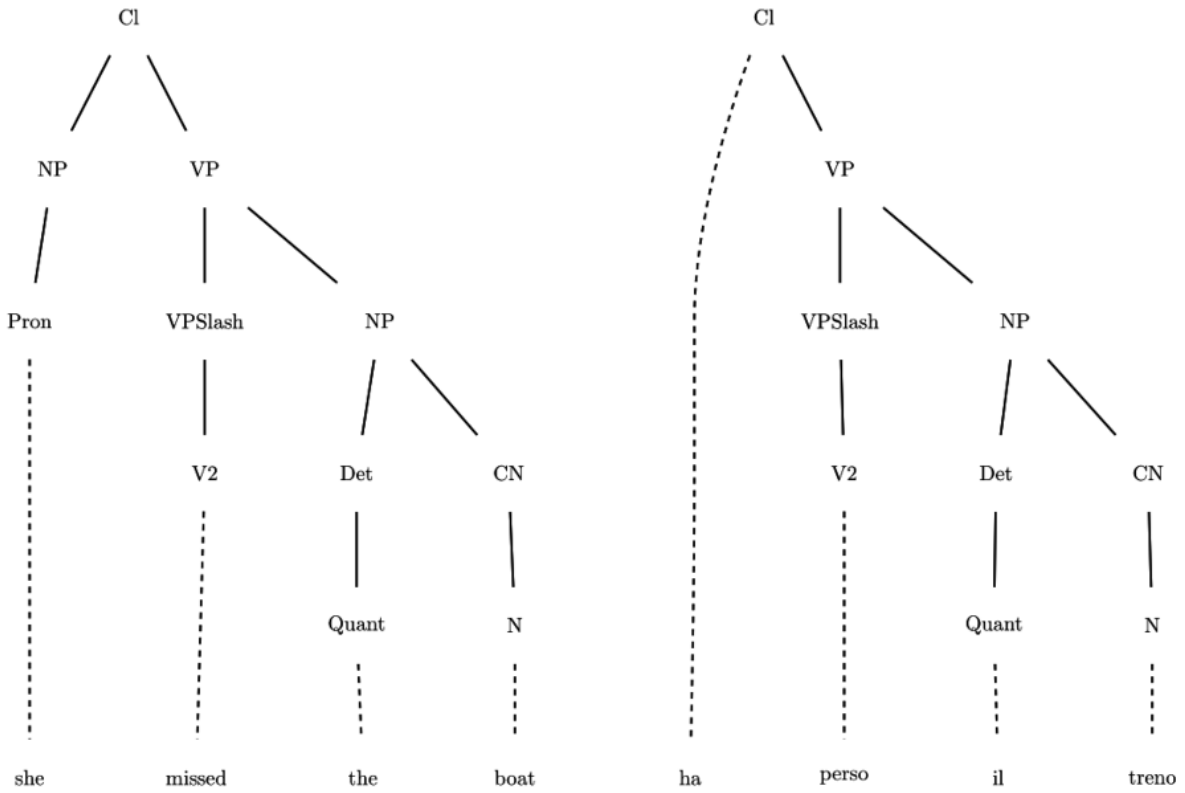
  - correspondences between strings $\rightarrow$ no morphological info
  - "fixed" level of abstraction (word, phrase or sentence)

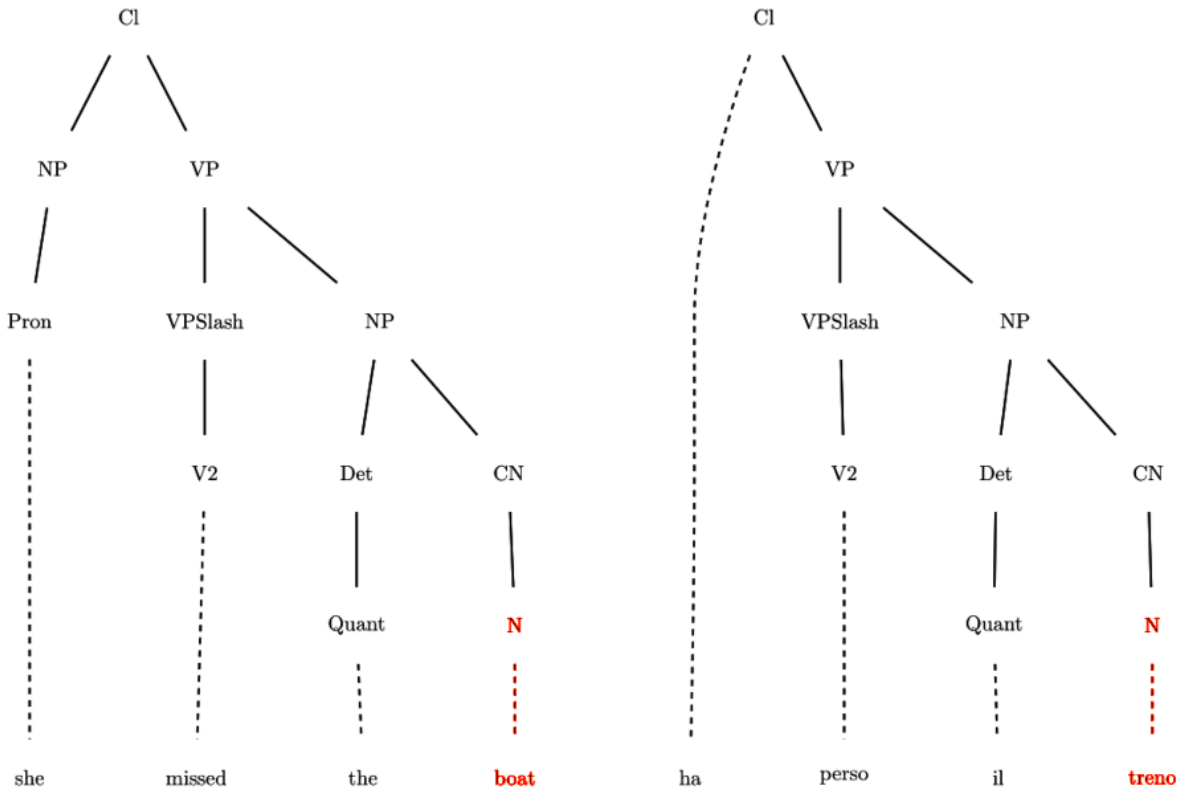
Syntax-based approaches I

Alternative: tree-to-tree alignment.



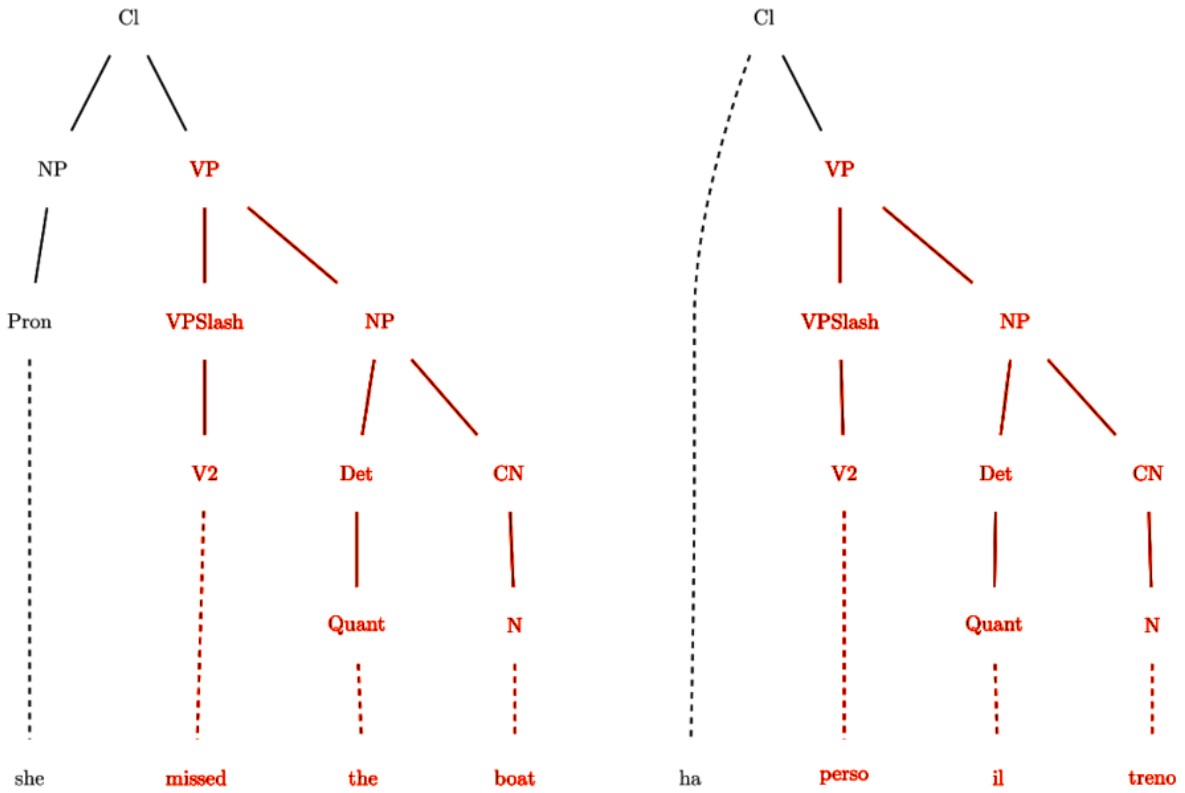
Syntax-based approaches II

Word alignment



Syntax-based approaches III

Phrase alignment



Comparison

statistical	**syntax-based**
require **large amounts of data**	work consistently well even on **individual sentence pairs**
works with **raw** data	requires the data to be **analyzed**
correspondences between **strings**	correspondences between **grammatical objects**
"fixed" level of abstraction (**word** or **phrase**)	all levels of abstraction $\rightarrow$ **concept** alignment

Why not just use GF?

- quality of the analysis is crucial
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  - lack of robust GF parsers
- dependency trees are an easier target for a parser
  - neural parsers such as **UDPipe**

Overview

parallel text
UD parsing
UD trees
concept alignment
UD subtrees
gf-ud ++
GF translation lexicon

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1. parse parallel data to UD trees

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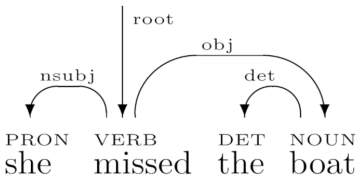
2. search for aligned UD subtrees
3. convert them to GF trees and then grammar rules

UD trees

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2 missed miss VERB _ _ 0 root _ _
3 the the DET _ _ 4 det _ _
4 boat boat NOUN _ _ 2 obj _
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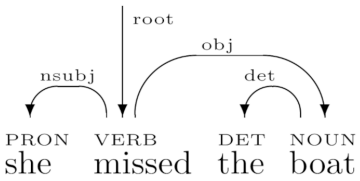
Graphical, CoNNL-U and Rose Tree representation of the same UD tree.

UD trees

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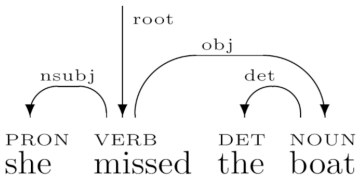


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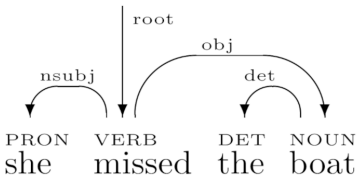


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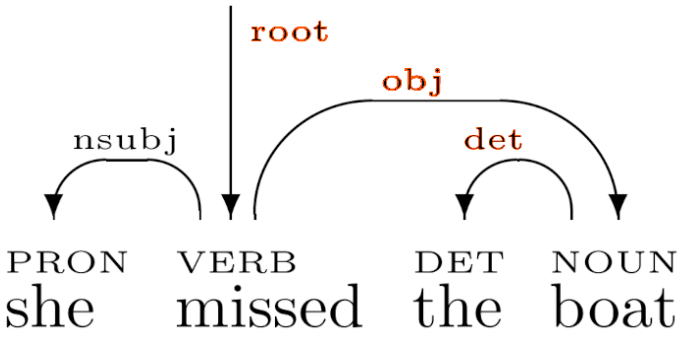
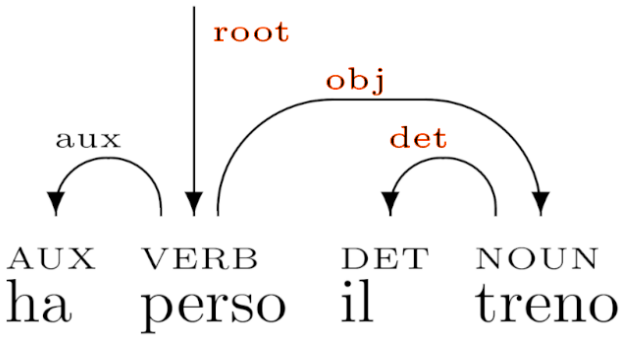
Extracting concepts

Matching dependency labels





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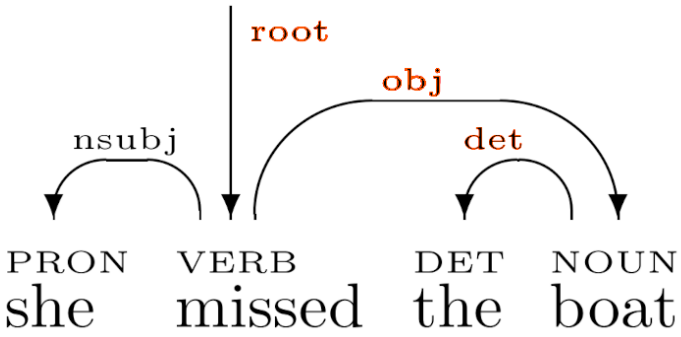

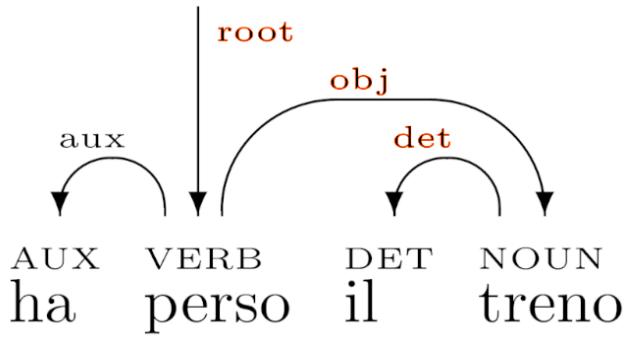

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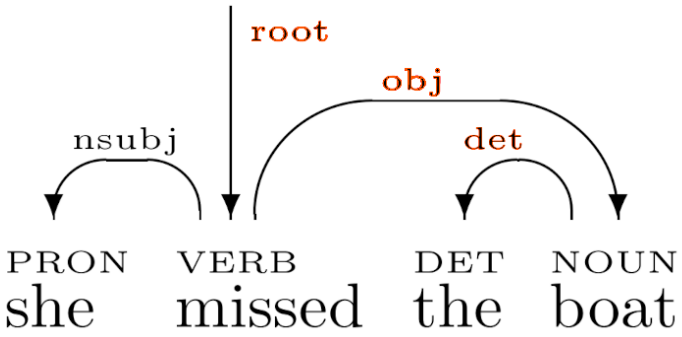

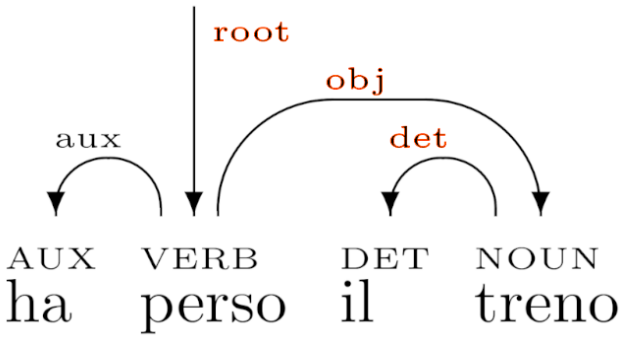

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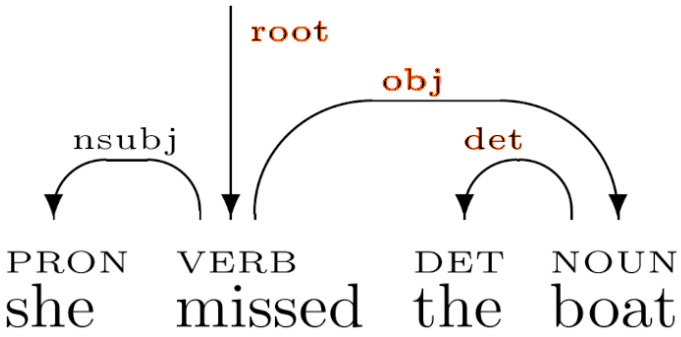

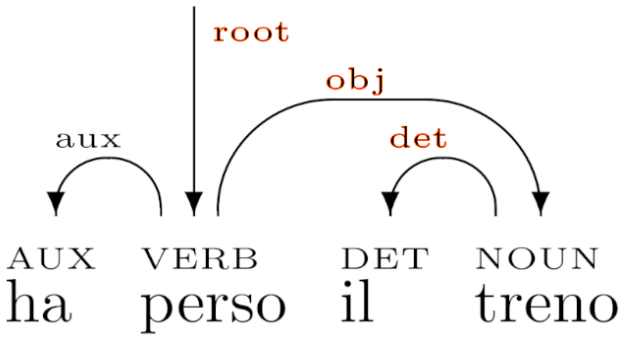

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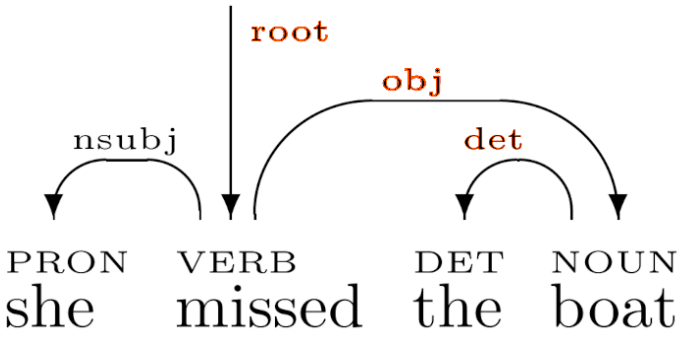

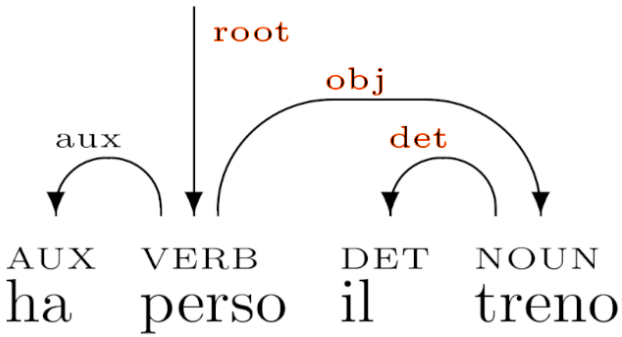

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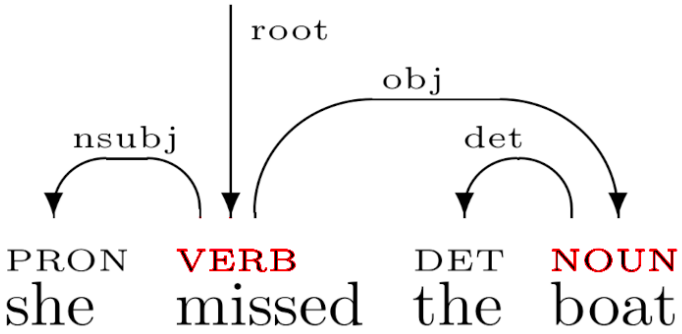
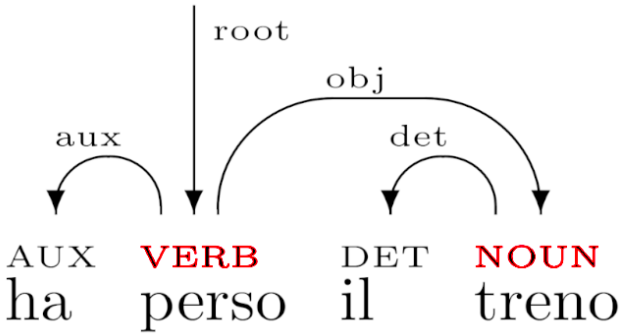
  (including the auxiliary)

Using POS tags





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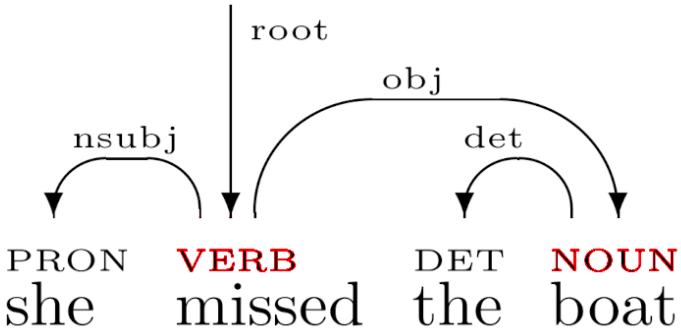

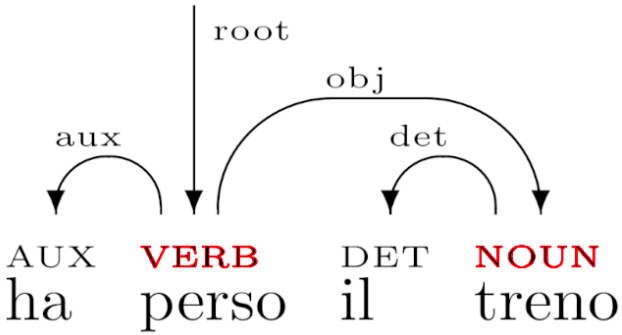

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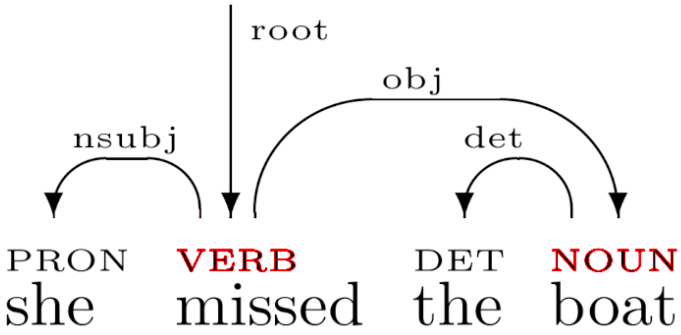

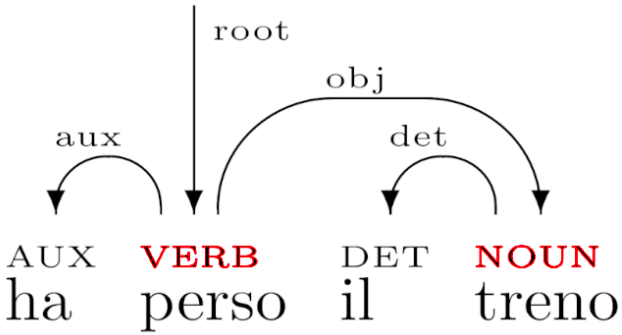

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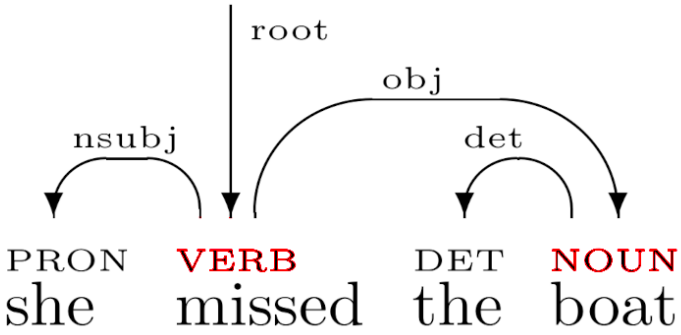

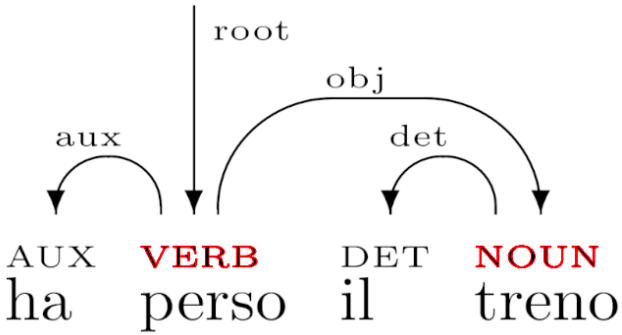

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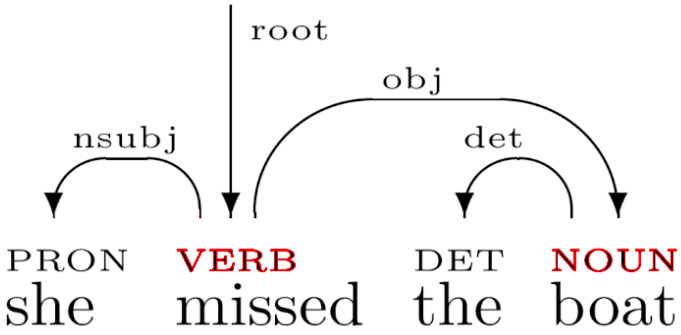

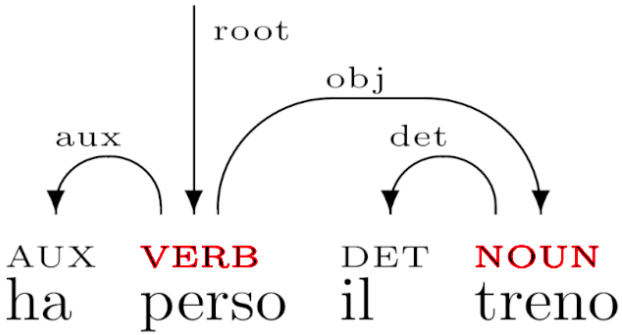

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- can increase precision if used **in conjuncion with labels**

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  - ⟨*Anna* ***usually*** *goes for walks*, *Anna* ***brukar*** *promenera*⟩
- thematic
  - ⟨***Yana*** *likes* ***books***, ***A Yana*** *piacciono* ***i libri***⟩

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Example predication patterns:

- ⟨*she missed the boat, ha perso il treno*⟩ → ⟨*[subj] missed [obj], ha perso [obj]*⟩
- ⟨*she told you that, hon berättade det för dig*⟩ → ⟨*[subj] told [iobj] [obj],[subj] berättade [obj] för [obl]*⟩

Propagating concepts to a new language

Concept Propagation

- So far, we focused on how to identify correspondences in bilingual parallel texts (***Concept Extraction***)

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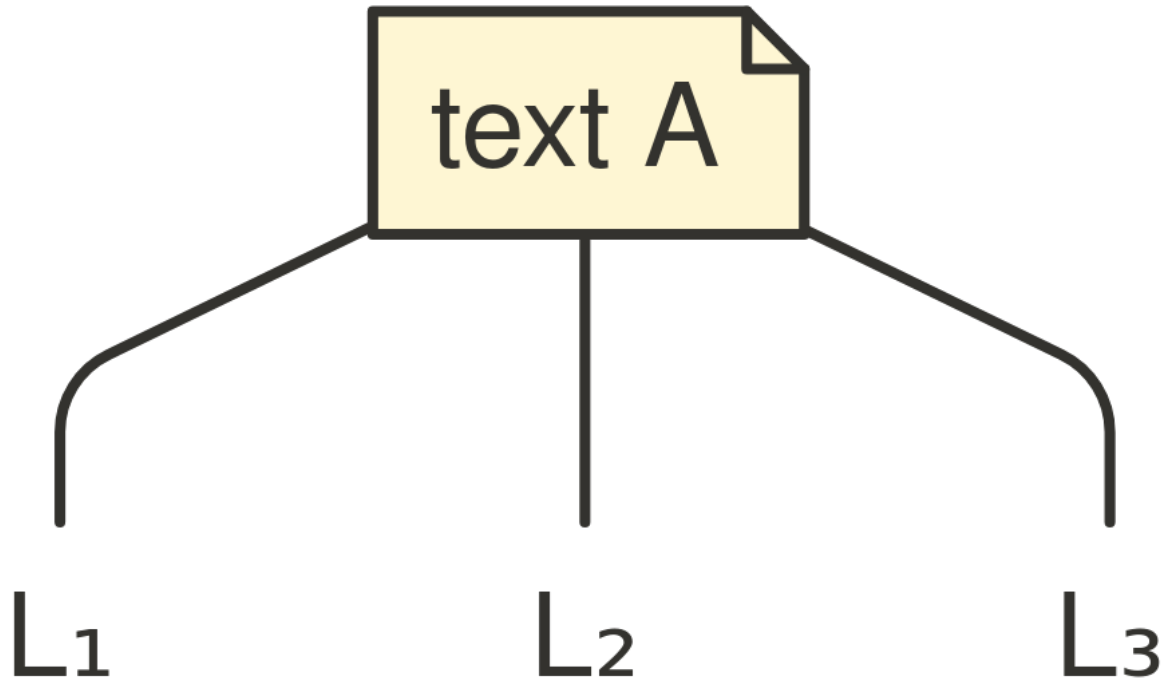
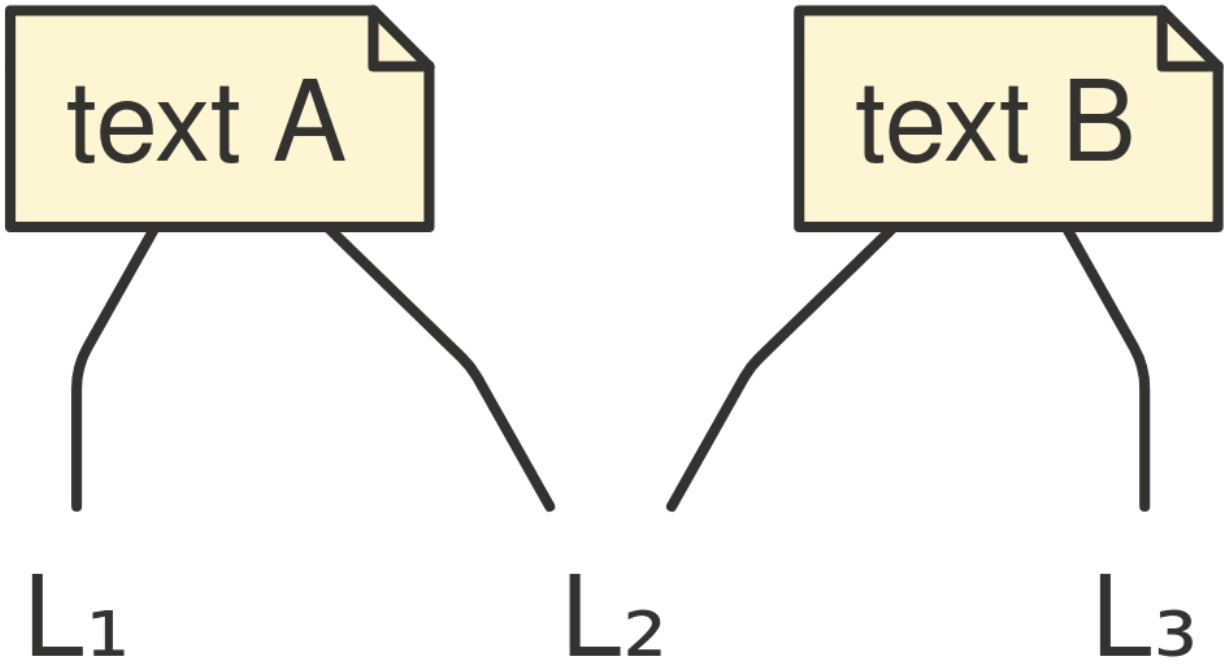
- So far, we focused on how to identify correspondences in bilingual parallel texts (***Concept Extraction***)
- what happens when we need to handle a third language?
  - ***Concept Propagation***: finding the expression corresponding to a known concept in a new language

Scenario 1



Scenario 2



Generating grammar rules

Requirements

- aligned UD trees

Requirements

- aligned UD trees
- dependency configurayions for `gf-ud`

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- **morphological dictionaries**

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- aligned UD trees
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- **morphological dictionaries**
- **extraction grammar**

Morphological dictionaries

Purely morphological unilingual dictionaries.

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Example:

```
...
lin morphologic_A =
  mkAMost "morphologic" "morphologicly" ;
lin morphological_A =
  mkAMost "morphological" "morphologically" ;
lin morphology_N =
  mkN "morphology" "morphologies" ;
...
```

Extraction grammar

Defines the syntactic categories and functions to build lexical entries.

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Defines the syntactic categories and functions to build lexical entries.

Example (prepositional NPs):

```
PrepNP : Prep -> NP -> PP # case head
```

Lexical rules

Abstract:

```
fun in_the_field__inom_området_PP : PP ;
```

Lexical rules

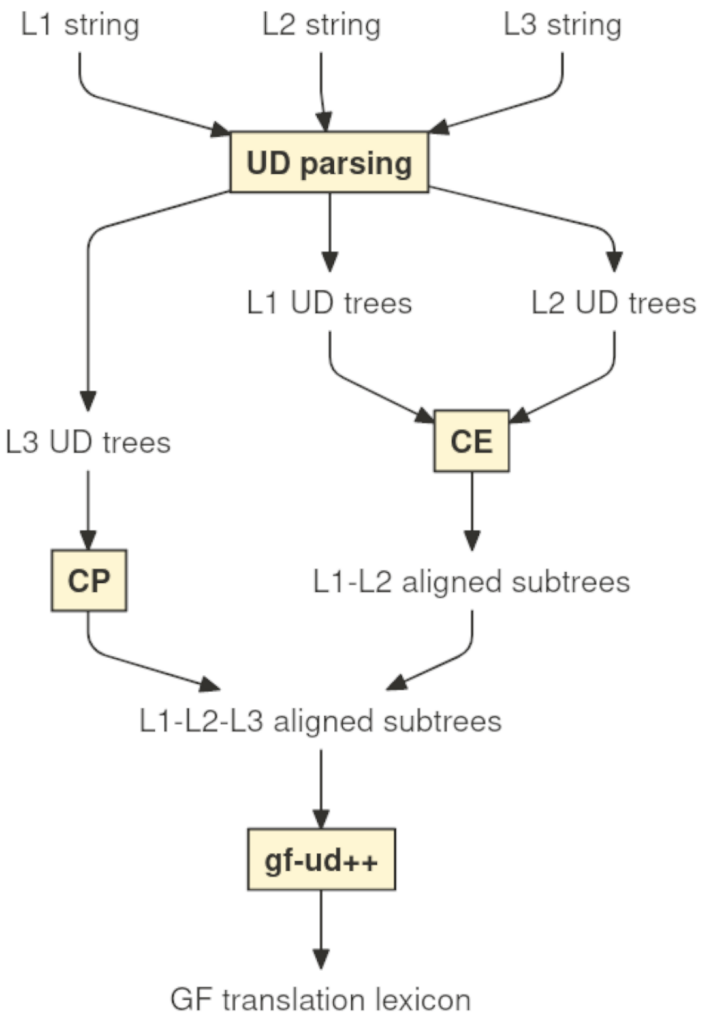
Abstract:

```
fun in_the_field__inom_området_PP : PP ;
```

English concrete:

```
lin in_the_field__inom_område_PP =
  PrepNP in_Prep (DetCN the_Det (UseN field_N))
```

Detailed view



Refining the generated lexicon

Postprocessing tools:

Refining the generated lexicon

Postprocessing tools:

- interactive selection

Refining the generated lexicon

Postprocessing tools:

- interactive selection
- CoNNL-U synoptic viewer

Summary

- (parsing)

Summary

- (parsing)
- Concept Extraction

Summary

- (parsing)
- Concept Extraction
- Concept Propagation

Summary

- (parsing)
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- Concept Propagation
- GF lexicon generation

Summary

- (parsing)
- Concept Extraction
- Concept Propagation
- GF lexicon generation
- postprocessing

Links

Links to everything mentioned in this talk, and more:

- **An overview of the IBM models**
- `fast_align`
- **the UD standard**
- **UDPipe**
- **B. J. Dorr's paper on translation divergences**
- `gf-ud`
- **the `concept-alignment` repo**
- **my thesis report** where everything is explained in detail but not everything is up to date
- **the paper on CE** I wrote together with Aarne
- **the CoNNL-U synoptic viewer**

Questions?