



Multilevel Learner Corpora

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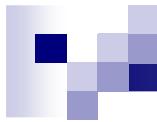
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Overview

- Advantages of multi-level corpus architectures
- Relevance for learner corpora and learner studies
 - Error annotation & target hypotheses
 - Contrastive Interlanguage Analysis
- Outlook: Falko in Annis, a multilevel search tool

Corpus architectures

Inline

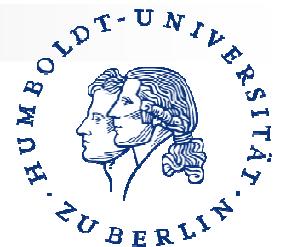
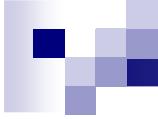
- Large (standard) corpora
- Good/fast search tools available
- Difficult to add annotation
- Difficult/impossible to represent conflicting annotation

Multilevel (standoff)

- Developed for multimodal and small/specific corpora
- Few tools available (many under development); annotation tools better than search tools
- Annotation layers can be added unrestrictedly (without changing old data)
- No problem to represent conflicting annotation
[Carletta et al. 2005](#), [Wittenburg 2008](#), [Chiarcos et al. 2009](#), ...

Data: the Falko corpus

- Falko (**fehlerannotiertes Lernerkorpus**), freely available multilevel learner corpus ([Lüdeling et al. 2008](#))
- Different subcorpora
 - Summaries (Free University & Humboldt University, Berlin), L2 (many different mother tongues) & L1
 - Essays (Free University & Humboldt University, Berlin) L2 (many different mother tongues) & L1
 - Longitudinal corpus (Georgetown University), L2 (English ns)
- Automatic pos tagging and lemmatization ([TreeTagger](#), [Schmid 1994](#)), partly manually corrected; summaries and longitudinal data topologically annotated ([Doolittle 2008](#))



Learner corpus studies

■ 2 basic approaches

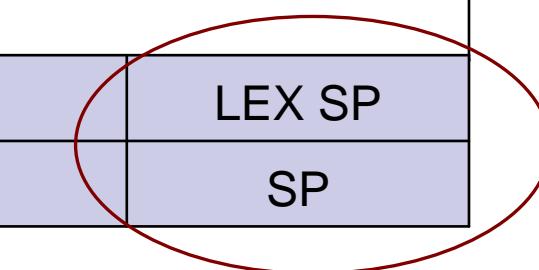
(Selinker 1972; Ringbom 1998; Granger et al. 2002):

- Error Analysis (EA studies)
- Contrastive Interlanguage Analysis (CIA)

1. Error analysis

Ambiguity of errors and EA

| | | | | | | | | | |
|---|------|--|-----|---------|------|-----|-----|-------|---------|
| | was | | die | Novelle | oder | die | Ode | nicht | betrift |
| | what | | the | novella | or | the | ode | not | effects |
| <i>which does not effect the novella or the ode</i> | | | | | | | | | |
| A1 | | | | | | | | | |
| A2 | | | | | | | | | |



- Errors **are** potentially ambiguous ([↑]Adriane Boyd last talk tomorrow)
- How do we detect ambiguities?
- Need for transparent error analyses

1. Error analysis

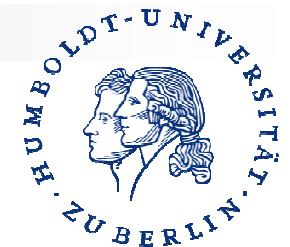
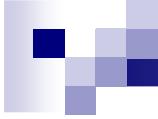
Ambiguity of errors and EA

| | | | | | | | | | |
|---|------|-----|-----|---------|------|-----|-----|-------|----------|
| | was | | die | Novelle | oder | der | Ode | nicht | betrifft |
| | what | | the | novella | or | the | ode | not | effects |
| <i>which does not effect the novella or the ode</i> | | | | | | | | | |
| TH1 | was | auf | die | Novelle | oder | die | Ode | nicht | zutrifft |
| EA1 | | | | | | | | | LEX SP |
| TH2 | was | | die | Novelle | oder | die | Ode | nicht | betrifft |
| EA2 | | | | | | | | | SP |

Target hypothesis: experiment

- 5 annotations for 17 sentences (one text)
(Lüdeling 2008)
- Annotation scheme identical
- Error annotations differ:

| content words | function words |
|---------------|----------------|
| 15 | 13 |
| 24 | 26 |
| 17 | 25 |
| 16 | 12 |
| 14 | 22 |



Conclusion target hypothesis

- Target hypothesis must be explicit/available
- It must be possible to formulate several target hypotheses for the same data
- It must be possible to formulate different analyses for the same target hypothesis (error tags)

Multiple levels → conflicts

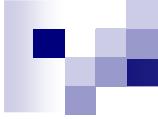
| | | | | | |
|--------|----|---------|-----|-----|------|
| word | He | awaited | for | his | wife |
| phrase | NP | | | PP | |
| targ | | waited | | | |
| targ | | awaited | | | |

- Inline annotation cannot deal with these conflicting annotation spans

Multiple levels → conflicts

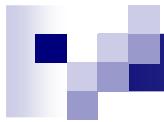
- Annotating errors and PP objects simultaneously in inline XML:
- <NP>He</NP> <err target="waited">
<err target="awaited"> awaited</err>
<PP> for </err> his wife</PP>

| | | | | |
|----|---------|-----|-----|------|
| He | awaited | for | his | wife |
| NP | | PP | | |
| | waited | | | |
| | awaited | | | |



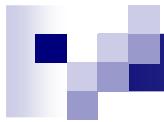
Summary & Conclusion

- EA and target hypothesis
 - Need for competing annotations
 - Need for conflicting annotations
- ADV case study:



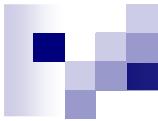
2. Contrastive Interlanguage Analysis (CIA)

- Assumption 1: Learners have systematic interlanguage (interim language)
(Selinker 1972, Corder 1981, Jordens 2003 etc.)
- Assumption 2: Interlanguage has reflexes in the observable data
- Method: Compare L2 with L1 varieties
(Cobb 2003, Tono 2003, Granger 2008, Walter & Grommes 2008, Mukherjee 2008 etc.)



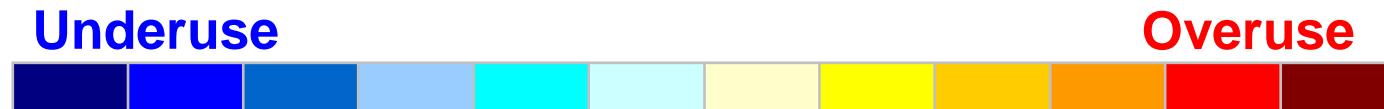
2. Contrastive Interlanguage Analysis (CIA)

- Differences between varieties can be expressed in terms of frequency differences
 - Over- and underuse studies
 - Esp. underuse can indicate learner difficulties
 - e.g. comparing frequencies of
 - Individual lexemes (content or function words)
 - Phrase structures
 - **Pos (chains)**



2. CIA

- Normalized frequencies in all Falko subcorpora (L2/L1) of pos n-grams
- Strength of over- and underuse is color-coded



Detecting structural syntactic difficulties: Pos chains

| bigram | de | da | en | fr | pl | ru |
|----------------|-----------------|-----------------|-----------------|-----------------|-----------------|-----------------|
| \$.-PPER | 0.005297 | 0.009748 | 0.007963 | 0.006166 | 0.005801 | 0.007409 |
| VVFIN-\$, | 0.006457 | 0.00776 | 0.006343 | 0.006937 | 0.006243 | 0.008391 |
| PPOSAT-NN | 0.008058 | 0.007247 | 0.007269 | 0.007066 | 0.006298 | 0.005802 |
| ADV-ADV | 0.012858 | 0.010518 | 0.006111 | 0.006166 | 0.003094 | 0.002856 |
| ADV-APPR | 0.009117 | 0.008016 | 0.005324 | 0.007837 | 0.004807 | 0.004642 |
| PDAT-NN | 0.005409 | 0.004233 | 0.005509 | 0.007837 | 0.007735 | 0.008837 |
| ADV-ART | 0.007629 | 0.006349 | 0.006898 | 0.005653 | 0.006133 | 0.004463 |

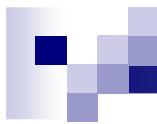
Consecutive adverbs are underused by all learners independent of their L1

ADV underuse case study

- ADV underuse characteristic of advanced learner variety; ADV-ADV underuse is significantly higher than underuse of single ADVs predicts
- Why?
- More precisely:
 - Are there specifically hard ADV categories and combinations of them?
 - Does underuse depend on complexity of ADV-ADV chains?

ADV underuse case study

- How far do we get with what we have?
- Available: surface forms, pos annotation, lemmatization
- Over-/underuse method applicable for individual lexemes:

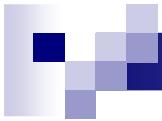


ADV underuse case study

| type | FK_Ess_L1 | FK_Ess_L2 | /FK_Ess_L1 |
|--|-----------|------------|------------|
| immer noch <i>still</i> | 2,3694 | 2,30485556 | 0,9727787 |
| nur noch <i>only still</i> | 4,4425 | 0,65853016 | 0,14823294 |
| immer wieder <i>again and again</i> | 3,2579 | 2,41461059 | 0,74116472 |
| heute noch <i>today still</i> | 1,4808 | 0,21951005 | 0,14823294 |
| noch immer <i>still</i> | 0,2962 | 0,21951005 | 0,74116472 |
| auch noch <i>also still</i> | 0,8885 | 0,87804021 | 0,98821963 |
| immer mehr <i>increasingly more</i> | 3,7021 | 0,43902011 | 0,11858636 |
| sehr viel <i>very much</i> | 0,2962 | 1,20730529 | 4,07640596 |

ADV underuse case study

- Measuring relative frequency of individual lexemes is easy
- Results: "Combinations with *einmal* 'once' (xxx *einmal*) are among the most underused productive L1 bigrams"
- However: No insight into syntactic structures or categories; hard to define syntactic classes
- Pos tag 'ADV' represents a heterogeneous class
 - (lexical) phrase particles (intensifiers, focus particles)
 - Verbal phrase adverbs (*bald* - soon)
 - Sentence adverbs (*eigentlich* - actually)
 - Sentence/modal particles (*wohl*, *doch*, *ja* - ??? (well))
- Many of the lexemes occur in more than one class



Examples from learner data (Falko)

| | | | | | | | | |
|-------|-----|-------|------|--------|-----|------|-----------------|--------|
| word | und | immer | noch | kann | man | eine | unzufriedenheit | spüren |
| apos | KON | ADV | ADV | VMFIN | PIS | ART | unknown | VVINF |
| cpos | KON | ADV | ADV | VMFIN | PIS | ART | NN | VVINF |
| lemma | und | immer | noch | können | man | ein | unknown | spüren |

(And still you can feel some dissatisfaction)

'still'

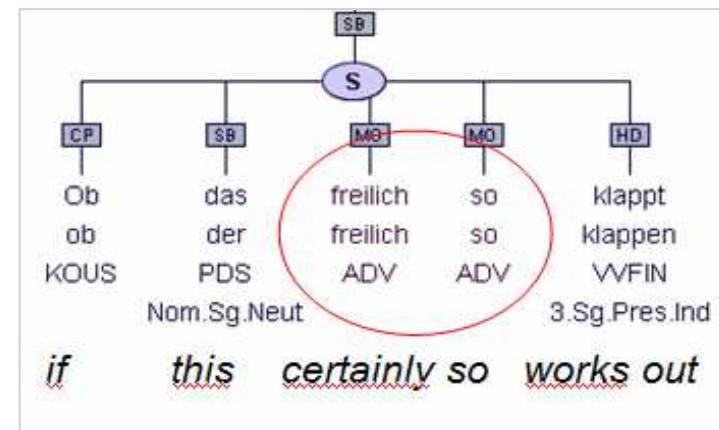
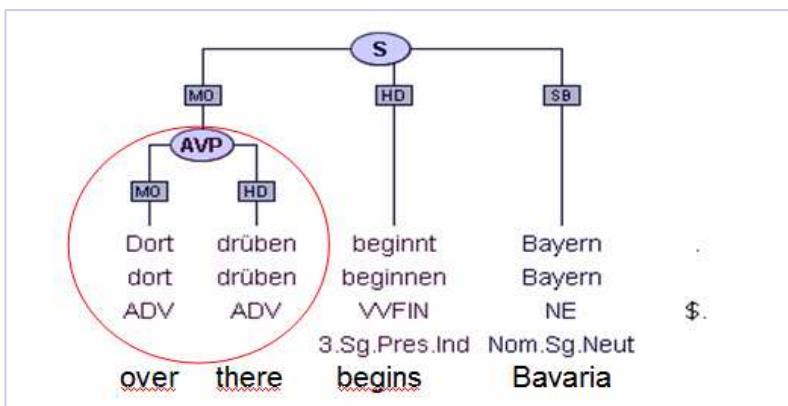
Examples from learner data (Falko)

| | | | | | | |
|-------|------|-------|------|------|-------------|---------|
| word | es | ist | doch | auch | statistisch | belegt |
| apos | PPER | VAFIN | ADV | ADV | ADJD | VVPP |
| cpos | PPER | VAFIN | ADV | ADV | ADJD | ADJD |
| lemma | er | sein | doch | auch | statistisch | belegen |

(It is also statistically proven)

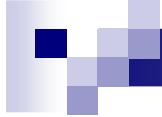
'??? also'

Types of ADV-ADV co-occurrences



Requirements

- Need for a corpus, providing
 - More granularity of pos annotation than the STTS tag 'ADV' offers
 - Phrasal annotation



ADV categories

- Syntactic classification of single ADVs
- Criteria: attachment; ±clause constituent

PT_PHR

DP/PP/AP/AdvP attached, no constituent: Phrasal particles (focus particles, intensifiers)

ADV_VP

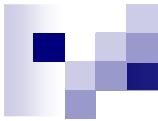
VP attached, constituent: verbal phrase adverbs

ADV_CP

CP attached, constituent: sentence adverbs

PT_CP

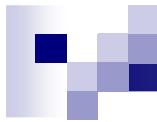
CP attached, no constituent: modal particles



Annotation of ADV categories

| | | | | | | | | |
|---------|-----|--------|--------|-------|-----|------|-----------------|--------|
| word | und | immer | noch | kann | man | eine | unzufriedenheit | spüren |
| apos | KON | ADV | ADV | VMFIN | PIS | ART | unknown | VVINF |
| cpos | KON | ADV | ADV | VMFIN | PIS | ART | NN | VVINF |
| ADV_pos | | PT_PHR | ADV_VP | | | | | |

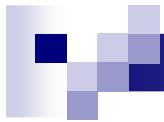
(And still you can feel some dissatisfaction)



Annotation of ADV categories

| | | | | | | |
|---------|------|-------|-------|-------|-------------|--------|
| word | es | ist | doch | auch | statistisch | belegt |
| apos | PPER | VAFIN | ADV | ADV | ADJD | VVPP |
| cpos | PPER | VAFIN | ADV | ADV | ADJD | ADJD |
| ADV_pos | | | PT_CP | PT_CP | | |

(It is also statistically proven)



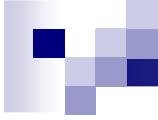
Phrasal annotation

| | | | | | | | | |
|---------|-----|----------|--------|-------|-----|------|-----------------|--------|
| word | und | immer | noch | kann | man | eine | unzufriedenheit | spüren |
| apos | KON | ADV | ADV | VMFIN | PIS | ART | unknown | VVINF |
| cpos | KON | ADV | ADV | VMFIN | PIS | ART | NN | VVINF |
| ADV_pos | | PT_PHR | ADV_VP | | | | | |
| phrase | | AdvP_Iex | | | NP | NP | | |

(And still you can feel some dissatisfaction)

Relevance of additional layers

- Annotation of adverb types and phrase categories
→ Measuring ambiguity → Syntactic variability a factor for learnability?
- AdvP annotation → Acquisition of complex and lexicalized AdvPs (complex lexemes=single lexemes?)
- Falko: additional annotations in progress
- Interim results on register differences by comparing token frequencies, gathered from a German treebank (Tiger; <http://www.coli.uni-sb.de/cl/projects/tiger>)



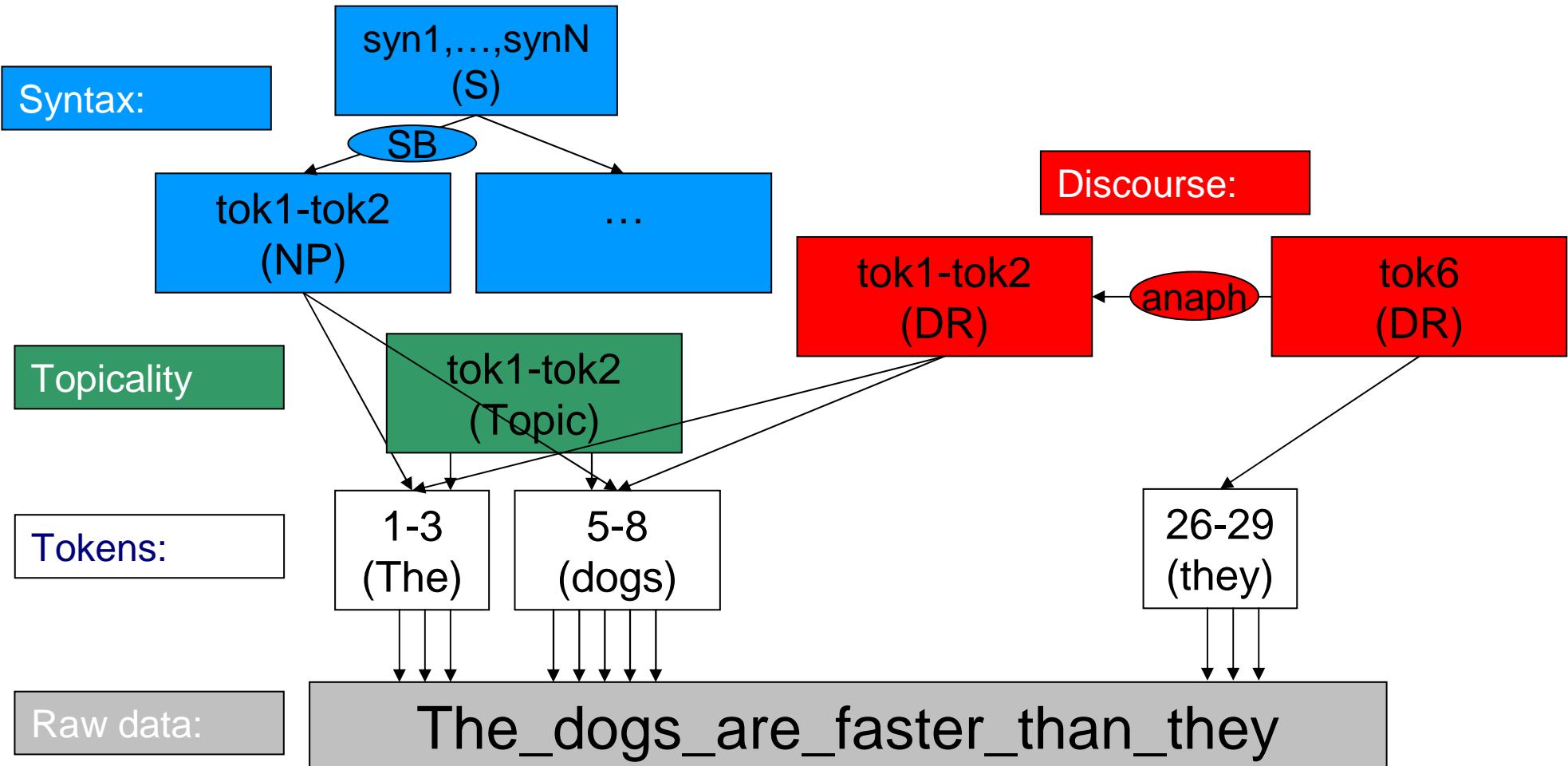
Summary & Conclusion

- EA and target hypothesis
 - Need for competing annotations
 - Need for conflicting annotations
- ADV case study
 - Need for easy addition of new (layers of) annotations (saving original annotations)

Outlook: Falko in Annis – Search in a multi-layer learner corpus

- Annis is a multilevel search architecture allowing search and visualization of:
 - Discontinuous surface structures
 - Conflicting hierarchical structures
 - Ambiguous annotations
- Based on the stand-off XML format PAULA (Dipper & Götze 2005, Chiarcos et al. 2009)

PAULA - Stand-Off XML (simplified)

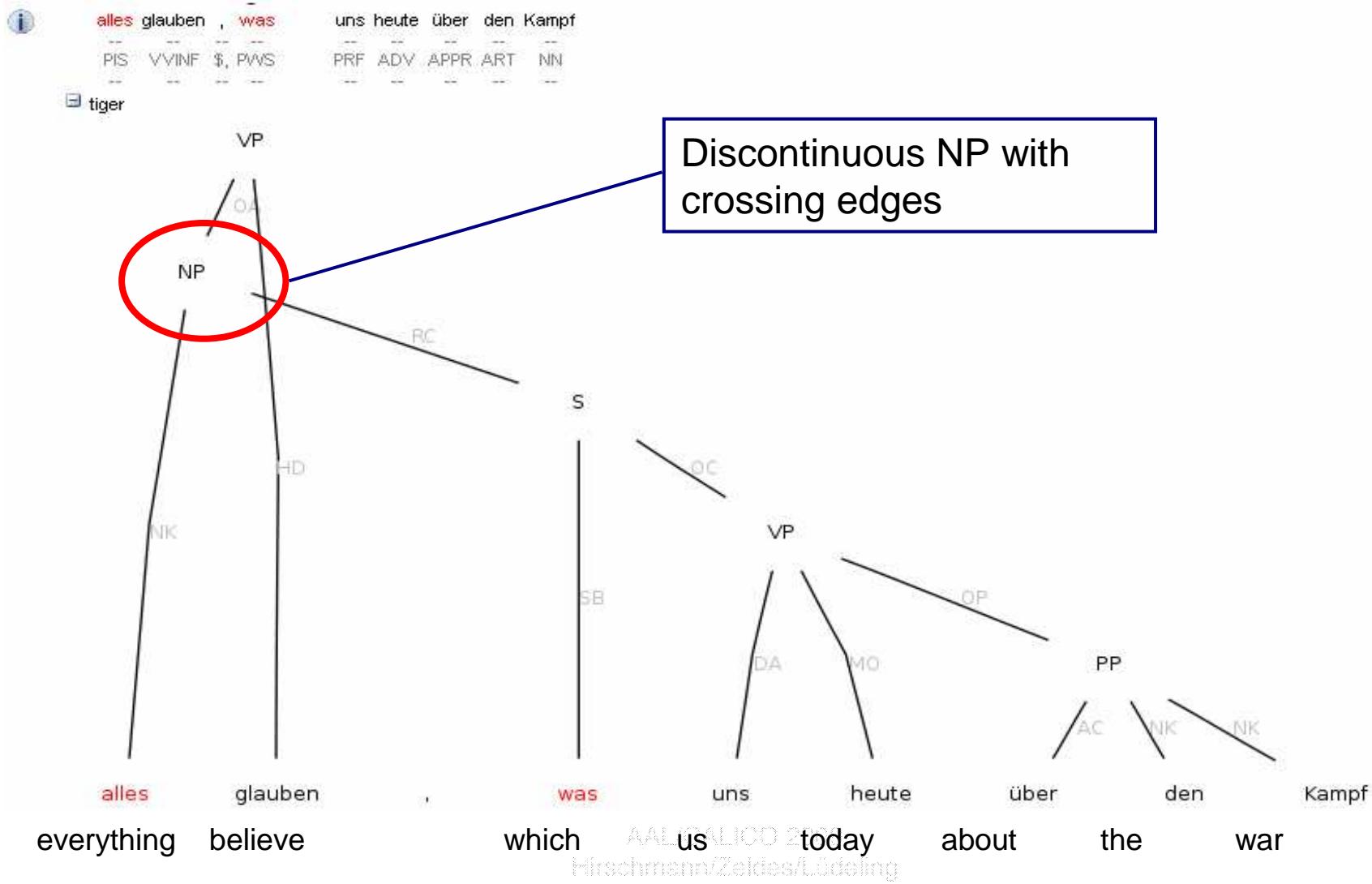


Annis: Search span annotations

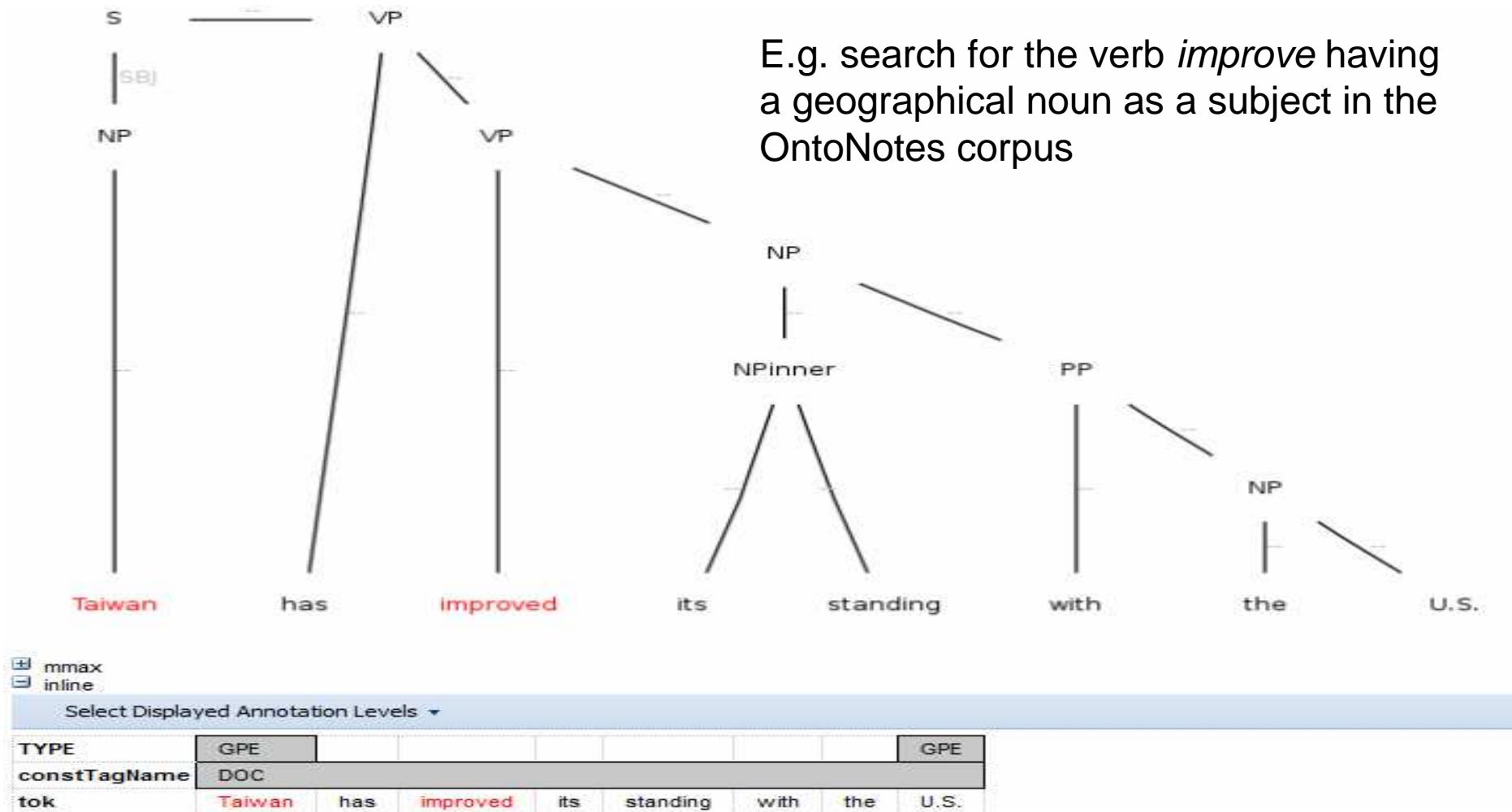
Select Displayed Annotation Levels ▾

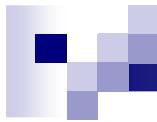
| const1Field | | | | | | | | |
|--------------|-----|---------------|-----|---------------|--------|---------------|---------|-----------|
| matrixField | VF | | | LSK | MF | | | |
| targeth | | | | | | ihrer eigenen | | |
| targeth | | | | Berlinromane | | einer eigenen | | |
| tok | Die | Protagonisten | der | Belinerromane | suchen | nach | eigener | Identität |
| ⊕ Paula Text | | | | | | | | |

Annis: Search treebanks



Annis: Combined search





Thank you! Danke!

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Information and contact Annis:

<http://www.sfb632.uni-potsdam.de/~d1/annis/>

Our learner corpus Falko is freely available at

<http://korpling.german.hu-berlin.de/falko/>

References

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