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Adesam

What are
treebanks?

Trebank
examples

What are
parallel
treebanks?

Creating
treebanks

References

Trebanks

Yvonne Adesam

2013



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Outline

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What are
treebanks?

Treebank
examples

What are
parallel
treebanks?

Creating
treebanks

References

What are treebanks?

Treebank examples

What are parallel treebanks?

Creating treebanks



Min bakgrund

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What are
treebanks?

Treebank
examples

What are
parallel
treebanks?

Creating
treebanks

References

- ▶ Disputerade 2012
 - ▶ Avhandling om att skapa högkvalitativa parallella trädbanker
 - ▶ Flerspråkiga parallella trädbanken Smultron
- ▶ Forskare på Språkbanken
 - ▶ Historiska resurser (MAPiR 2014-2016)
 - ▶ Högkvalitativ korpusannotering (Koala 2014-2016)



What is a treebank?

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What are
treebanks?

Treebank
examples

What are
parallel
treebanks?

Creating
treebanks

References

A *corpus* is “a body of naturally-occurring (authentic) language data which can be used as a basis for linguistic research” (Leech and Eyres, 1997, p. 1).

A *treebank* is “a linguistically annotated corpus that includes some grammatical analysis beyond the part-of-speech level” (Nivre et al., 2005; Nivre, 2008).



What is a Treebank? (2)

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What are
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Treebank
examples

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References

- ▶ A corpus with linguistic annotation beyond the word level
- ▶ The annotation is typically
 - ▶ a syntax tree and
 - ▶ manually checked and corrected.
- ▶ Treebank vs parsed corpus



What is a syntax tree?

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Each sentence is mapped to a graph, which represents its syntactic structure.

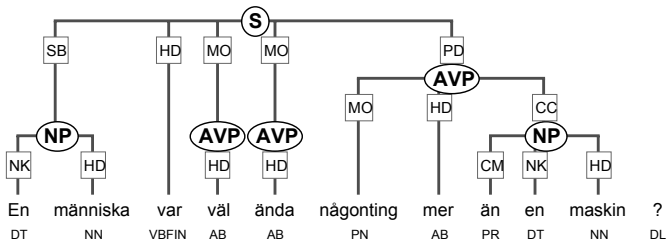
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Treebank
examples

What are
parallel
treebanks?

Creating
treebanks

References





Why Treebanking?

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treebanks?

Treebank
examples

What are
parallel
treebanks?

Creating
treebanks

References

- ▶ Training material for Machine Learning → NLP systems
- ▶ Gold Standards for the evaluation of NLP systems
- ▶ Linguistic empiricism
- ▶ Human grammar exploration and learning

Creating treebanks is still an art, not a science.



The history of treebanks

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Treebank
examples

What are
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Creating
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References

- ▶ Penn Treebank (English; Phase 1: 1989-1992)
- ▶ Forerunners:
 - ▶ Talbanken (Swedish; Lund 1970s)
 - ▶ Ellegård (English; Gothenburg 1978)
 - ▶ Tosca (English; Nijmegen 1980s)
 - ▶ LOB (Lancaster-Oslo-Bergen) Treebank (Engl.; late 1980s)
 - ▶ SynTag (Swedish; Gothenburg 1986-1989)
- ▶ Followers
 - ▶ NEGRA / TIGER Treebanks (German; 1997-2000s)
 - ▶ Prague Dependency Treebank (Czech; 2000s)
 - ▶ Svensk trädbank (Swedish; 2007)
 - ▶ Bulgarian, Danish, Dutch, French, Chinese, Japanese, Arab, Hebrew, Turkish ...



The Penn Treebank

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Treebank
examples

What are
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References

- ▶ Treebank for English built at the University of Pennsylvania
- ▶ Phase 1 (1989-1992)
 - ▶ 3 million words (Brown Corpus and others)
 - ▶ bracket representation with PoS labels and node labels
- ▶ Phase 2 (1993-1995)
 - ▶ Enriching part of the original material with
 - ▶ syntactic functions
 - ▶ traces, null elements, coreference symbols
- ▶ Phase 3 (1996-2000)
 - ▶ additional material annotated
 - ▶ Wall Street Journal
 - ▶ Switchboard corpus (telephone conversations)



Penn treebank

Penn Treebank Example from 1991

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Treebank
examples

What are
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```
( bd0011sx .)
( (S (NP *)
    (VP Show
      (NP me)
      (NP (NP all)
        the nonstop flights
        (PP (PP from
          (NP Dallas))
          (PP to
            (NP Denver))))
      (ADJP early
        (PP in
          (NP the morning)))))) .) )
```



The NEGRA Treebank

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Treebank
examples

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References

- ▶ 40'000 sentences
- ▶ from the Frankfurter Allgemeine Zeitung
- ▶ Annotations
 - ▶ PoS-Tags (STTS)
 - ▶ Morphological information
 - ▶ Syntactic nodes (NP, PP, VP, ...)
 - ▶ Syntactic functions (Subject, Object, Adverbial, etc)
 - ▶ allows crossing branches
 - ▶ allows secondary edges



The NEGRA Treebank

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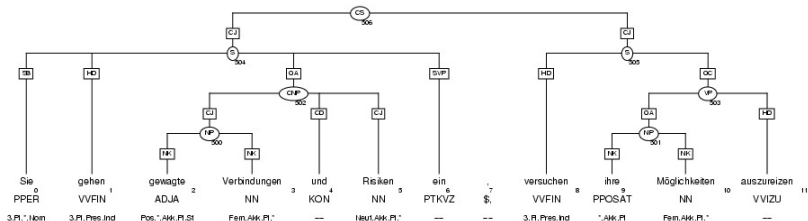
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treebanks?

Treebank
examples

What are
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treebanks?

Creating
treebanks

References





The Swedish Treebank

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Treebank
examples

What are
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Creating
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References

- ▶ Developed in Uppsala and Växjö
- ▶ Harmonizing two resources:
 - ▶ Talbanken: Swedish written and transcribed spoken language from the 1970s, manually annotated with syntactic information according to a traditional Scandinavian analysis tradition (cf. Diderichsen's field analysis)
 - ▶ SUC (Stockholm Umeå Corpus), a morphosyntactically annotated (part-of-speech and lemma), balanced corpus of published Swedish written language from the 1990s
- ▶ Talbanken annotated with SUC morphosyntactic in a semi-automatic process
- ▶ Both Talbanken and SUC automatically syntactically annotated with phrase structure version of Talbanken's original syntax analysis



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Treebank examples

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References





Parallel Treebanks

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Trebank
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References

- ▶ Corpus of translated (parallel) texts
- ▶ Manually or semi-automatically annotated
 - ▶ Each language syntactically annotated treebank
 - ▶ Alignment
- ▶ Useful for
 - ▶ word-sense disambiguation
 - ▶ bilingual dictionaries
 - ▶ machine translation
 - ▶ cross-language information retrieval
 - ▶ translation studies
 - ▶ foreign language pedagogy



Parallel Treebanks

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Treebank
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References

A *parallel corpus* is a collection of naturally-occurring language data consisting of texts and their translations.

Parallel treebanks are treebanks over parallel corpora, i.e., the 'same' text in two or more languages.



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Parallel Treebanks

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Treebank
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En människa var väl ändå någonting mer än en maskin ?



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Treebank
examples

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treebanks?

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References

En	människa	var	väl	ända	någonting	mer	än	en	maskin	?
DT	NN	VBFIN	AB	AB	PN	AB	PR	DT	NN	DL



Parallel Treebanks

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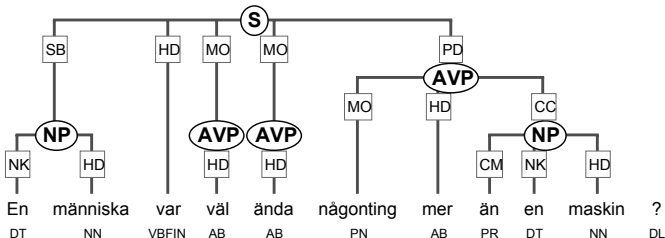
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treebanks?

Treebank
examples

What are
parallel
treebanks?

Creating
treebanks

References





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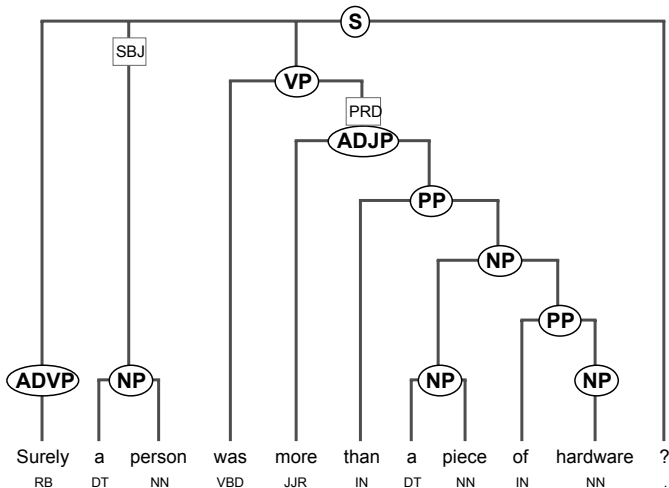
What are
treebanks?

Treetank
examples

What are
parallel
treebanks?

Creating
treebanks

References





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Treebank examples

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Creating treebanks

References





Parallel Treebanks

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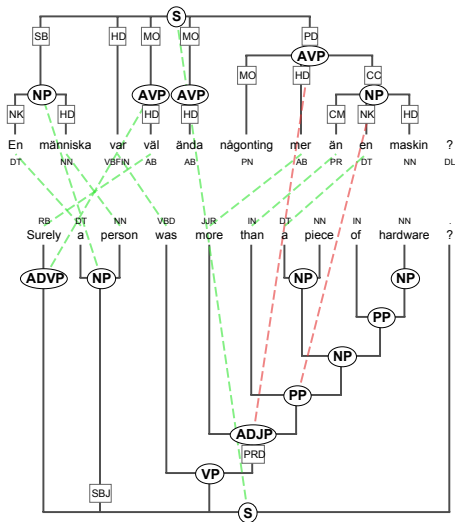
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Treebank
examples

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References





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Stockholm MULtilingual TReebank (v1.0)

English, German, Swedish

Over 1 000 sentences, around 18,000 tokens

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Treebank
examples

What are
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Creating
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References

- ▶ The novel Sophie's World (~530 sentences)
 - ▶ The first two chapters
- ▶ Economy texts (~500 sentences)
 - ▶ Annual report from a bank (SEB)
 - ▶ Quarterly report from a multinational company (ABB)
 - ▶ Banana Certification Program (Rainforest Alliance)
- ▶ v3.0: more texttypes, more languages, 2'500 sentences in 12 treebank files combined by 9 alignment files

Available from

www.cl.uzh.ch/research/parallelcorpora/paralleltreebanks/smultron_en.html



Treebanking – How To? I

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Treebank
examples

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References

1. Define the purpose
2. Select a corpus
 - ▶ written or spoken language?
 - ▶ one text genre or many?
 - ▶ copyright
3. Choose annotation format
 - ▶ what linguistic phenomena to represent
 - ▶ theoretical framework (e.g. constituents vs. dependencies)
 - ▶ depth of annotation
 - ▶ representation type
4. Choose annotation tool (tree editor)
5. Start the annotation (definition phase)
 - ▶ start annotation
 - ▶ write and revise annotation guidelines
6. Select and adapt support tools
 - ▶ PoS tagger



Treebanking – How To? II

- ▶ (shallow) parser

7. Annotate the data (production phase)

- ▶ instruct annotators
- ▶ annotation control by cross-checking
- ▶ discussion of critical cases

8. Check the annotation and make corrections

- ▶ completeness check
- ▶ consistency check

9. Distribute the treebank

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Treebank
examples

What are
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Creating
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References



Treebank Annotation

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References

High-quality corpus development

- ▶ Sentence splitting
- ▶ Tokenization
- ▶ Part-of-speech tagging
- ▶ Lemmas
- ▶ Morphological annotation
- ▶ Parsing/chunking
- ▶ Semantic annotation
- ▶ Named entity recognition
- ▶ Co-reference
- ▶ Alignment (sentence/phrase/word)
- ▶ (...)



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Challenges in Treebank Annotation

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Treebank
examples

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References

► Ambiguity



Challenges in Treebank Annotation

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Treebank
examples

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References

- ▶ Morphological ambiguity (*lemurhelvete*: le, lem, mur, ur, hel, vete, ve, te)
- ▶ Syntactic ambiguity (*He saw a man with a telescope; I saw her duck*)
- ▶ Lexical ambiguity (*bank; saw; run*)
- ▶ Semantic ambiguity (*every boy loves his mother; A and B bought a house*)
- ▶ Discourse ambiguity (*A called B, she was sick*)



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Treebank
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References

- ▶ Ambiguity
- ▶ Multiword units (including names)



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examples

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References

- ▶ Ambiguity
- ▶ Multiword units (including names)
- ▶ Discontinuous units



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Treebank
examples

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References

- ▶ Ambiguity
- ▶ Multiword units (including names)
- ▶ Discontinuous units
- ▶ Foreign language expressions



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Treebank
examples

What are
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References

- ▶ Ambiguity
- ▶ Multiword units (including names)
- ▶ Discontinuous units
- ▶ Foreign language expressions
- ▶ Symbols, numbers, and abbreviations



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Challenges in Treebank Annotation

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Treebank
examples

What are
parallel
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Creating
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References

- ▶ Ambiguity
- ▶ Multiword units (including names)
- ▶ Discontinuous units
- ▶ Foreign language expressions
- ▶ Symbols, numbers, and abbreviations
- ▶ Meta-information (e.g. XML tags)



Challenges in Treebank Annotation

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Treebank
examples

What are
parallel
treebanks?

Creating
treebanks

References

- ▶ Ambiguity
- ▶ Multiword units (including names)
- ▶ Discontinuous units
- ▶ Foreign language expressions
- ▶ Symbols, numbers, and abbreviations
- ▶ Meta-information (e.g. XML tags)
- ▶ Trade-off rich annotation vs (manual) labour



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Current Treebank Annotation

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Treebank
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References

- ▶ Sentence-based
- ▶ Mostly written language
- ▶ Syntax-centered
- ▶ Little work on semantic and discourse treebanks

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Treebank examples

What are parallel treebanks?

Creating treebanks

References

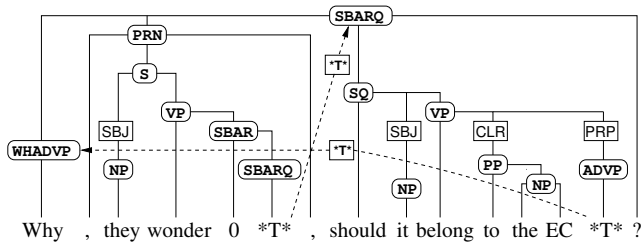


Figure 1: A constituent tree from the Penn Treebank.

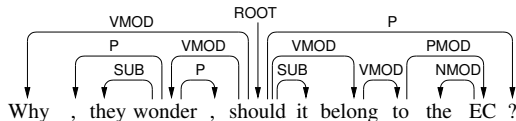


Figure 2: Dependency tree by PENN2MALT.



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Constituents vs Dependencies

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References

- ▶ Constituents
 - ▶ phrase structure
 - ▶ words building blocks of larger units
- ▶ Dependencies
 - ▶ syntactic dependencies
 - ▶ grammatical functions of words



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Annotation

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Treebank
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<http://spraakbanken.gu.se/korp/annoteringslabb/>



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Treebank Quality

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Treebank
examples

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References

► Well-formedness

► Consistency

► Soundness



Treebank Quality

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Treebank
examples

What are
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Creating
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References

- ▶ **Well-formedness**
Each token and each non-terminal node is part of a sentence-spanning tree, and has a label.
- ▶ **Consistency**
The same sequence (of tokens/part-of-speeches/constituents) is annotated the same way given the same context.
- ▶ **Soundness**
Conform to sound linguistic principles.



Quality Control

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Trebank
examples

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References

- ▶ Errors create problems for computational and theoretical linguistic uses of corpora
 - ▶ unreliable training and evaluation of NLP
 - ▶ detrimental to queries for rare linguistic phenomena
 - ▶ error propagation through layers
- ▶ Both automatic and human annotation contains errors
- ▶ Good guidelines, well-trained annotators, easy-to-use annotation tools, search tools etc
- ▶ Inter-annotator agreement should be monitored throughout the project
- ▶ Detecting annotation errors using NLP tools
- ▶ Feedback from the user



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Corpus Development

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Treebank
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References

- ▶ Treebanking is
 - ▶ time-consuming
 - ▶ labour-intensive
- ▶ Most applications require large amounts of data



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Treebank
examples

What are
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Creating
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References

- ▶ Treebanking is
 - ▶ time-consuming
 - ▶ labour-intensive
- ▶ Most applications require large amounts of data
- ▶ Use automatic annotation methods to reduce manual work
 - ▶ **enlarge** annotated data
 - ▶ **guide** quality checking
 - ▶ **improve** annotation before quality checking



Why manual work?

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Treebank
examples

What are
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Creating
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References

Accuracy of most annotation tools depend on

- ▶ set of labels
- ▶ training data
- ▶ language

Part-of-speech tagging: accuracy normally above 95-96%.
Example: HunPoS 97% accuracy when trained on SUC
(Megyesi, 2009) An error in every second sentence!

Parsing: accuracy varies considerably across languages Example:
CoNLL shared task 2007: LAS 84-90: Catalan, Chinese,
English, Italian LAS 76-80: Arabic, Basque, Czech, Greek,
Hungarian, Turkish



Summary

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What are
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Treekbank
examples

What are
parallel
treebanks?

Creating
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References

- ▶ A treebank is a corpus with grammatical analysis beyond the word level
 - ▶ Often large treebanks are needed
 - ▶ Use automatic tools as much as possible
 - ▶ Add manual work and manual quality checks
 - ▶ Important: text type, language, annotation type
-
- ▶ Next time: Historical corpora



References I

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Treebank
examples

What are
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treebanks?

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References

Leech, G. and Eyes, E. (1997). Syntactic annotation: treebanks. In Garside, R., Leech, G., and McEnery, T., editors, *Corpus Annotation - Linguistic Information from Computer Text Corpora*, chapter 3, pages 34–52. Addison Wesley Longman Limited.

Megyesi, B. (2009). The open source tagger HunPoS for Swedish. In Jokinen, K. and Bick, E., editors, *Proceedings of the Nordic Conference on Computational Linguistics (Nodalida)*, volume 4 of *NEALT Proceedings Series*, pages 239–241, Odense, Denmark.

Nivre, J. (2008). Treebanks (Article 13). In Lüdeling, A. and Kytö, M., editors, *Corpus Linguistics. An International Handbook*. Mouton de Gruyter.

Nivre, J., de Smedt, K., and Volk, M. (2005). Treebanking in Northern Europe: A white paper. In Holmboe, H., editor, *Nordisk Sprogteknologi. Årbog for Nordisk Sprogteknologisk Forskningsprogram 2000-2004*. Museum Tusculanums Forlag, Copenhagen.