# Introduction to Computational Linguistics Grammatical Tagging

Jan-Philipp Söhn

jp.soehn@uni-tuebingen.de

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# Part-of-speech (POS) Tagging

- Part-of-speech tagging refers to the assignment of (disambiguated) morpho-syntactic categories, in particular word class information, to individual tokens.
- Part-of-speech tagging requires a pre-defined tagset and a tagset assignment algorithm.
- Disambiguation of part-of-speech labels takes local context into account.



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## Criteria for the Construction of Tagsets

Geoffrey Leech proposed general guidelines for the design of tagsets:

- **Conciseness:** Brief labels are often more convenient to use than verbose, lengthy ones.
- **Perspicuity:** Labels which can easily be interpreted are more user-friendly than labels which cannot.
- **Analysability:** Labels which are decomposable into their logical parts are better (particularly for machine processing).



#### Standardization

 Cross-linguistic guidelines for tagsets and tagging corpora have been proposed by the Text Encoding Initiative (TEI)
 Link: www.tei-c.org

#### Tagset size

- Trade-off between linguistic adequacy and tagger reliability
- The larger the tagset, the more training data are needed for statistical part-of-speech taggers



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Tagsets are often developed in conjunction with corpus collections.

- The Brown Corpus tagset
  - First used for the annotation of the Brown Corpus of American English
  - Later adapted for the annotation of the Penn Treebank of American English



# Tagsets for English (2)

#### CLAWS

- First designed for the annotation of the Lancaster-Oslo-Bergen corpus (LOB corpus). LOB is the British English counterpart of the Brown Corpus of American English.
- Later adapted for the annotation of the British National Corpus (BNC), the largest corpus of British English with approximately 100 million words of running text.



Example from BNC using C7 (adapted version of CLAWS) tagset: Perdita&NN1-NP0; ,&PUN; covering&VVG; the&AT0; bottom&NN1; of&PRF; the&AT0; lorries&NN2; with&PRP; straw&NN1; to&TO0; protect&VVI; the&AT0; ponies&NN2; '&POS; feet&NN2; ,&PUN; suddenly&AV0; heard&VVD-VVN; Alejandro&NN1-NP0; shouting&VVG; that&CJT; she&PNP; better&AV0; dig&VVB; out&AVP; a&AT0; pair&NN0; of&PRF; clean&AJ0; breeches&NN2; and&CJC; polish&VVB; her&DPS; boots&NN2; ,&PUN; as&CJS; she&PNP; 'd&VM0; be&VBI; playing&VVG; in&PRP; the&AT0; match&NN1; that&DT0; afternoon&NN1; .&PUN;



## Part-of-speech Tagging – An Example

The codes used are:

<u> </u>			
AJ0:	general adjective	POS:	genitive marker
AT0:	article	PNP:	pronoun
	neutral for number		
AV0:	general adverb	PRF:	of
AVP:	prepositional adverb	PRP:	prepostition
CJC:	co-ord. conjunction	PUN:	punctuation
CJS:	subord. conjunction	TO0:	infinitive to
CJT:	that conjunction	VBI:	be
DPS:	possessive determiner	VM0:	modal auxiliary
DT0:	singular determiner	VVB:	base form of verb
NN0:	common noun,	VVD:	past tense form of verb
	neutral for number		
NN1:	singular common noun	VVG:	-ing form of verb
NN2:	plural common noun	VVI:	infinitive form of verb
NP0:	proper noun	VVN:	past participle form of verb



## General Issues Visible in the Example

- Tags are attached to words by the use of TEI entity references delimited by '&' and ';'.
- Some of the words (such as *heard*) have two tags assigned to them. These are assigned in cases where there is a strong chance that there is not sufficient contextual information for unique disambiguation.
- Approximation of a logical tagset (possible trade-off with mnemonic naming conventions).



## Tagsets for other Languages

- MULTEXT-East: Tagsets for Bulgarian, Czech, Estonian, Hungarian, Romanian, Slovene)

Link: www.racai.ro/~tufis/



## The Stuttgart-Tübingen Tagset STTS

- The STTS is a set of 54 tags for annotating German text corpora with part-of-speech labels.
- The STTS guidelines (available on the website) explain the use of each tag by illustrative examples to aid human annotators in consistent corpus annotation by STTS tags.
- It was jointly developed by the Institut für maschinelle Sprachverarbeitung of the University of Stuttgart and the Seminar für Sprachwissenschaft of the University of Tübingen.



## Automatic POS Tagging: Basic Issues

- If there is more than one possible tag for a word, how to select the correct one?
- The unkown word problem: What happens if the word is not in the word-tag list (tagger lexicon)?
- Tagger lexicon: the richer the less need for guessing the right tag
- How rich is the tagset?
  - word = full form (incl. morphological information), or
  - word = lemma (word class information without morphology)?
  - the larger the tagset the more ambiguities and errors



# POS Tagging: Main Approaches

- Rule-based approach:
   Write local disambiguation rules.
- Stastistical approach:

Compile statistics from a corpus to train a statistical model.



### Rule-Based Approach

- Leading ideas:
  - Usually only local context needed for disambiguation.
  - Formulate context-sensitive disambiguation rules.
- Example:
  - ? VBZ  $\rightarrow$  not NNS NNS ?  $\rightarrow$  not VBZ



## Problems with Rule-Based Approach

- Rules can only be used when necessary context is not ambiguous.
- There are too many ambiguous contexts.
- The rules are dependent on the tagset.
- Manual encoding is time-consuming.
- Only local phenomena can be described.



## Statistical Approach

- Annotate item with most probable tag
- Collect table of tag frequencies from hand-annotated training corpus.

• E.g.: freq(DT NN) = 10 171, freq(TO NN) = 5

- But the frequency for rare tags is low.
  - freq(NN POS) = 36, freq(POS) = 71
  - in comparison: freq(NN) = 24 211
- Solution: Compute conditional probability:
  - P(NN|DT) = (P(DET NN))/(P(NN)) = 0.420,
  - P(POS|NN) = (P(NN POS))/(P(POS)) = 0.507



- Conditional probabilities for tag sequences and for word (given a tag) are computed from the frequency tables generated from training corpus.
- The size of the training corpus needed for good results is proportional to the size of the tagset.



## Advantages of Statistical Approach

- Very robust, can process any input strings
- Training is automatic, very fast
- Can be retrained for different corpora/tagsets without much effort



## Disadvantages of Statistical Approach

- Requires a great amount of (annotated) training data.
- The linguist cannot influence the performance of the trained model.
- Changes in the tagset  $\rightarrow$  changes in the word list (+ changes in the morphology) + changes in the corpus
- Can only model local dependencies.



# Freely Available POS Taggers

- TnT Computerlinguistik Saarbrücken, HMM tri-gram tagger, www.coli.uni-saarland.de/~thorsten/tnt/
- Brill Tagger transformation-based error-driven, research.microsoft.com/~brill/

