Parser Evaluation and the BNC

Jennifer Foster and Josef van Genabith

National Centre for Language Technology School of Computing Dublin City University

 $29\mathrm{th}$ May 2008

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BNC Gold Standard

What is this work about?

- 1. Creating a set of gold standard parse trees for 1,000 sentences from the BNC
- 2. Using these trees as a test set to evaluate various parsers

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BNC Gold Standard

Outline

BNC Gold Standard

Parser Evaluation

The Parsers The Metrics Evaluation Results Parser Evaluation and the BNC

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Parser Evaluation The Parsers The Metrics Evaluation Results

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The British National Corpus

The BNC is a one hundred million word balanced corpus of British English (Burnard, 2000)

- ▶ 90% of the BNC is written text
 - ▶ 75% factual
 - \blacktriangleright 25% fiction
- \blacktriangleright The 10% spoken component consists of
 - ▶ informal dialogue
 - business meetings
 - ▶ speeches

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1,000 sentences in test set

- ▶ Not chosen completely at random
- ▶ They are *different* from WSJ training data:
 - ▶ Contain a verb in BNC but not in WSJ2-21
 - 25,874 verb lemmas in BNC but not in WSJ2-21
 - ▶ 14,787 occur only once in BNC (e.g. *jitter*, *unfade*, *transpersonalize*, *kerplonk*)
 - ▶ 537 occur greater than 100 times (e.g. *murmur, frown, damn*)
 - Likely to represent a difficult test for WSJ-trained parsers

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BNC Test Set: Some examples

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Text Type	#	Example
Spoken	10	The seconder of formally seconded
Poem	9	Groggily somersaulting to get air-
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Caption	4	Community Personified
Headline	2	Drunk priest is nicked driving to a fu-
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Average sentence length: 28 words

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BNC Test Set: Annotation Process

- One annotator
- ▶ Two passes through the data
- ▶ Approximately 100 hours
- ▶ As references, the annotator used
 - Penn Treebank bracketing guidelines (Bies et al 1995)
 - 2. Penn Treebank itself
- ▶ Functional tags and traces not annotated

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BNC Gold Standard

What happens when the references clash?

- ► The noun phrase *almost certain death* occurs in BNC gold standard sentence
- According to the guidelines, it should be annotated as (NP (ADJP almost certain) death)
- A search for *almost* in the Penn Treebank yields the following example (NP almost unimaginable speed)
- In such cases, annotator chose the analysis set out in the guidelines

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69 sentences marked as difficult

Attachment ambiguities He has had to come to terms with the tragic loss of friends from the very start of his climbing career.

► Adverbials

a few seats **down** from them

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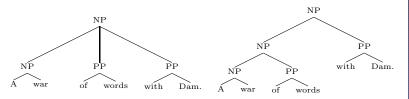
 $a few seats \ down from them$

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Noun phrase structure
a war of words with Damascus



Miscellaneous

- As likely to be queuing at a supermarket checkout as at a communion rail
- day in day out
- Other than that he showed up Giggs..

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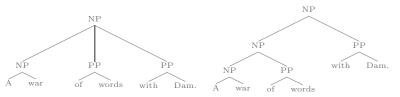
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Parser Evaluation

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- History-based generative statistical parser (Charniak, 2000)
- ▶ Reranking parser (Charniak and Johnson, 2005)
 - ▶ First-stage generative parser
 - Discriminative reranker re-orders n-best list returned by first-stage parser

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▶ NANC self-trained parser (McClosky et al, 2006)

- Reranking parser parses NANC sentences
- First-stage parser is retrained with NANC trees plus WSJ gold standard trees

▶ BNC self-trained parser (Foster et al, 2007)

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Any other parsers? Berkeley parser (Petrov et al, 2006)

- ▶ Unlexicalised PCFG parser
- ► To learn PCFG:
 - 1. Start with x-bar grammar read from Penn Treebank
 - 2. Split each nonterminal category into two subcategories
 - 3. Train a grammar (using Expectation Maximisation learning)
 - 4. For each pair of subcategories
 - ▶ Merge the subcategories
 - Measure the information loss after the merge
 - ▶ If loss is small, keep the merge
 - 5. Repeat steps 2-4
- ► We use PCFG obtained using 5 split/merge iterations

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Evaluation Metrics

Phrase-structure evaluation

- Parseval (evalb implementation) (Black et al, 1991)
- 2. Leaf Ancestor (Sampson and Barbarczy, 2002)
- 3. Tree Distance (Emms, 2008)

Dependency evaluation

Relies on constituent to dependency conversion

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Parseval

- ▶ Tree as a set of *labelled spans*
- Precision, recall and f-score over gold and test sets



Gold: { (S Linguists love grammar), (NP Linguists), (VP love grammar) } Test: { (S Linguists love grammar), (VP Linguists love), (NP grammar) }

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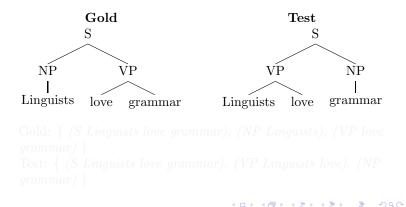
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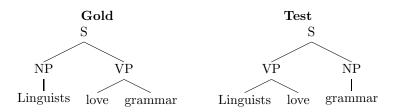
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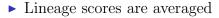
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Parser Evaluation The Parsers **The Metrics** Evaluation Results

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Leaf Ancestor

- ▶ Tree as a set of *lineages*
- ▶ Each lineage in test set assigned a score
- ▶ Score based on edit distance from gold lineage





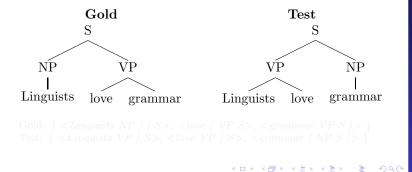
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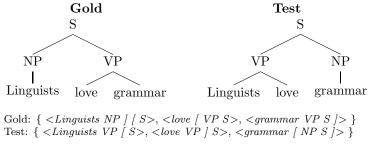
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- Calculate the minimum cost of transforming test tree to gold tree

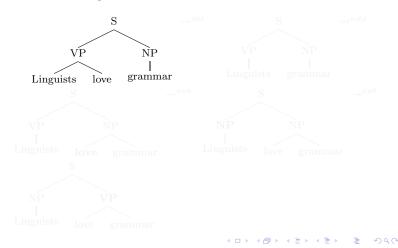


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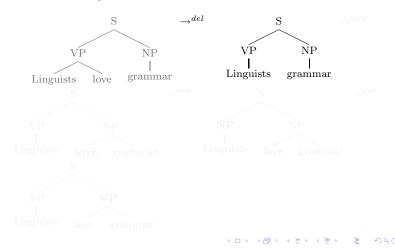


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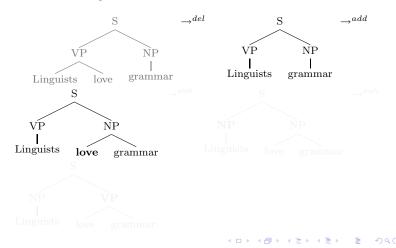


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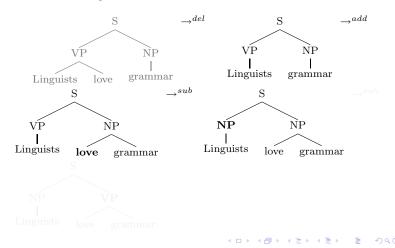


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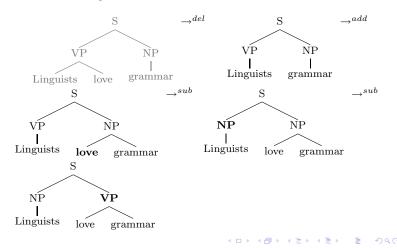


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Dependency Evaluation

- Tree as a set of word-word dependency tuples <word,head,label> (Linguists,love,subj), (grammar,love,obj)
- Automatic conversion procedure (Johansson and Nugues, 2007)
- Works better when Penn-II functional tags are available
- ▶ Use automatic functional tag labeller of Chrupala et al, 2007

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Parser	Parseval	TreeDist	$\mathbf{L}\mathbf{A}$	Dep
Berkeley	82.0	89.8	91.1	81.6
Charniak	82.5	90.0	91.6	82.5
C&J Rerank	83.4	90.3	91.8	82.8
C&J NANC	83.9	90.6	91.7	83.0
$C \mathscr{CJ} BNC$	85.4°	91.3	92.6	84.2

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▶ Approx 7% drop moving from WSJ23 to BNC

- Evaluation metrics tell roughly the same story
- Reranking improves performance
- Best parser on the BNC test data is BNC self-trained parser
- ▶ Using *in*-domain data for self-training appears to be more effective

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C&J Rerank	$83.4\uparrow$	90.3	91.8	82.8
C&J NANC	83.9	90.6	91.7	83.0
C&J BNC	$85.4\uparrow$	91.3	92.6	84.2

▶ Approx 7% drop moving from WSJ23 to BNC

- ▶ Evaluation metrics tell roughly the same story
- ▶ Reranking improves performance
- Best parser on the BNC test data is BNC self-trained parser
- ► Using *in*-domain data for self-training appears to be more effective

Parser Evaluation and the BNC

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BNC Gold Standard

Problematic areas for all parsers

Coordination

The pistol had been a prop in the film in which my father had starred and after filming was over he forgot to return it.

► Adverbs

Incidentally Ciccolini also plays several works for piano 4 hands

▶ Noun/verb confusions

In winter that **walk** back home must have been hell.

This faithful rig has been served to **ground-run** engines.

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More problematic areas

- Fragments
 - Moles burrowing away underground out of sight of each other but with a common purpose.
- Parentheticals
 - ...but and here's the rub-a-dub, it was at least three pits further out.
- Self-training on BNC data gives modest improvements in most areas

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Concluding remarks

Future Work

- ▶ More detailed error analysis
 - ▶ Behaviour of Leaf Ancestor metric
 - Difference between Berkeley and Charniak parser
 - \blacktriangleright Difference between BNC Test Set and WSJ23
- ▶ Annotation of traces and functional tags

Another parsing test set for English - 1,000 BNC sentences

Available at http://nclt.computing.dcu.ie/~jfoster/resources

Thank you for listening

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Workshop at the 3rd International Conference on Linguistic Resources and Evaluation (LREC), Las Palmas, Gran Canaria.

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