Evaluating Syntactic Parsing with Beam Search

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Background

Syntactic parsing

- Syntax tree from natural language
- Parent node of each word
- Part-of-speech tags
- Universal Dependencies treebanks

Arc standard parsing

- Introduced by Nivre (2004)
- Stack, buffer, partial tree
- Utilizes three transitions
 - Shift (SH)
 - Left-arc (LA)
 - Right-arc (RA)



Example of syntax tree from Universal Dependencies

Beam Search

- Explore multiple alternatives
- Beam width of size *n*
- Expands the *n* most promising nodes
- Uses these nodes to generate new alternatives
- Introduce new "transition", error state (ER)
 Model associates incorrect states with ER

Vaswani and Sagae (2016)



Beam Search example (d2l.ai)

Method

Arc standard parser as baseline Beam search during testing, *Vaswani and Sagae (2016)*

Experimentation

- Different seeds
- Error state probability
- Features and parameters
- Beam width



Tag features

Results

Measured and compared unlabeled attachment score (UAS) between baseline and beam search model.

| Baseline | Beam search |
|----------|-------------|
| 0.6568 | 0.6544 |

Choice of seed barely had any impact on results.

Very small difference, even with optimal seed (Picard (2023))

The other experiments rendered more interesting results

Varying Probability of Generating Error States



Beam Width

Beam Width

Effect of Beam Width



Impact of Generating Error States During Training



Effect of feature set

- Loss in UAS score from removing single features
- Choice of features is an important factor in accuracy



Conclusion

- Beam search results in a small increase in UAS which is in line with the findings of *Vaswani and Sagae (2016)*
- Features and model optimization can have a larger impact