

Natural Language Processing (almost) from Scratch

1 Main Idea

The paper [1] attempts to train a generic single learning system for multi-task learning. The tasks include Part-of-Speech (POS) tagging, chunking (CHUNK), Named Entity Recognition (NER) and Semantic Role Labeling (SRL). The authors intend to achieve this without hand-engineering task-specific features, and instead rely on a large amount of unlabeled data. They also wish to avoid baselines that have been created using differently labeled data.

2 Background

- The state-of-the-art (SoTA) system for POS tagging uses bidirectional sequence decoders (Viterbi algorithm) and maximum entropy classifiers to determine, which among a set of pre-defined tags, can be attributed to a token.
- Chunking is essentially the same as POS-tagging, but for phrases instead of single words. SoTA for chunking uses pairwise SVM-classifiers, for which the features were word-contexts. Matrix SVD based methods have also been successful.
- For NER, the SoTA is a linear model combined with Viterbi decoding, where the features include the tokens themselves, the POS tags, CHUNK tags, suffixes and prefixes.
- SRL is similar to obtaining an entity-relation model from unstructured data (text). SoTA on SRL are parse trees, CHUNK and POS tags, voice, types of verb etc. in combination with context-window classifiers.

3 Method

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4 Observations

- One pertinent question is whether multi-task learning is only effective if the sub-tasks are not completely orthogonal to each other.

References

- [1] Ronan Collobert, Jason Weston, Léon Bottou, Michael Karlen, Koray Kavukcuoglu, and Pavel Kuksa. Natural language processing (almost) from scratch. *Journal of Machine Learning Research*, 12(Aug):2493–2537, 2011.