

1 Semantic Parsing

Note: This section is fairly rough. It may or may not be updated in future

Natural language is ambiguous, ambiguity makes computational methods difficult. Therefore a traditional approach for semantic parsing is to first map the natural language to some unambiguous logical statement, e.g. prepositional logic or first order logic.

1.1 Semantic Role Labelling - Shallow Semantic Parsing

SRL is the process of labelling each noun phrase that is an argument to the verb (basically all of them). Some typical roles include:

- agent
- patient
- source
- destination
- instrument

SRL can be useful in assisting question answering, information retrieval, text summarisation, machine translation...

1.1.1 Approaches

1. Hand coded rules based on grammatical knowledge, e.g. (Syntactic) the Agent is often the subject, (Sectional restrictions / Verb constraints) Agents should be animate.. etc
2. Statistical methods as a sequence labelling task (HMM / CRF / Token classifiers)
3. (If a parse tree is available) using a parse tree as features with statistical methods

1.2 Semantic Parsing - Proper

The task of transforming natural language into completely formal meaning representations

1.2.1 Example Formats

- **Predicate Logic Query Language**

"What is the smallest state by area?"

answer(x₁, smallest(x₂, state(x₁), area(x₁, x₂)))

- **Functional Query Language (functional and variable free)**

"What is the smallest state by area?"

answer(smallest_one(area(state(all))))

1.2.2 Approaches

1. Supervised training with annotated pairs
2. Compositional methods building an MR recursively bottom up using a parse tree
3. As a word alignment/machine translation problem (WASP) using e.g. IBM model 5
4. Using CFSG's (Context Free Semantic Grammars) with CKY algorithm:
 - (a) Annotate the data set as necessary, grouping by category (E.g. "I": Person, "like": verb, "milk": food)
 - (b) Define ALL possible rules from the annotations and sentences only ($\$Person \rightarrow I, Mel$)
 - (c) Break into CNF form as needed using placeholder variables
 - (d) Use CKY to build up a semantic tree.

2 Lexical Semantics

2.1 Word Sense Disambiguation

2.1.1 Learning for WSD

1. Treat as a (unsupervised) classification problem, assume that P.O.S. tags have been determined for target word
2. Extract useful features for the classifier:
 - Surrounding bag of words (BOW)
 - P.O.S. of neighbouring words
 - Local co-locations
 - Syntactic relations
3. Annotate a small set of words by hand, and use this to train a semi-supervised classifier using the Yarowski algorithm with expectation maximisation

2.2 Coreference Resolution

Coreference resolution is the task of finding all expressions that refer to the same entity in a body of text.

2.2.1 High level approach

1. Detect "mentions" (not too difficult). Use POS tags, NER extraction, parse trees and cast a wide net
2. Cluster the mentions (tricky) using either a labelled corpus and supervised classifier ("Mention Ranking"), or an unsupervised clustering approach

2.2.2 Mention Pairs and Mention Ranking

Given a mention, we would like to find the most likely entity that it refers to. We assume that there is a labelled corpus (although it is possible to use an unlabelled corpus with EM and counts). To simplify the search space, we apply some simple heuristics:

- Recency (more likely to refer to a recent entity)
- Centering (more likely to refer to the central document entity)
- Gender/number agreement
- Grammatical role
- Parallelism