

Disambiguation

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June 23, 2016

Overview

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- 2 Resolution Techniques
- 3 Machine Learning Approaches
- 4 Reference Resolution

Introduction

Ambiguous Cases

Ambiguities concerning a single word:

- ▶ Homographs (speech generation)
- ▶ Homophones (speech understanding)
- ▶ Homonyms (language understanding)
- ▶ Reference resolution

Multiple words

- ▶ Syntactic ambiguity

Examples

"She lives in New York."

"There is a wooden table."

"There is a bat in my garage."

"He saw that gas can explode." [1]

"Buffalo buffalo Buffalo buffalo buffalo buffalo Buffalo buffalo." [1]

Resolution Techniques

Resolution Overview

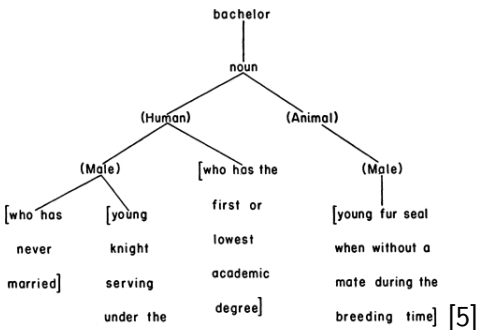
Disambiguation approaches:

- ▶ Part of speech and grammar
- ▶ N-grams
- ▶ Selection restriction

Selection Restriction 1

Using connected words to choose the correct meaning:

- ▶ Every sense has semantic restrictions
- ▶ Linguistic groundwork by Katz and Fodor (1963)



Selection Restriction 2

Limitation: Deliberate violations, "When pigs fly"

Possible solutions

- ▶ No hard restrictions, more probability
- ▶ Resnik's algorithm checks association to hypernyms

Input

First the input format has to be figured out:

- ▶ Feature Vector
- ▶ Words and their part of speech
- ▶ Co-occurrence vector

Supervised approaches

Classification can be done in two different ways:

- ▶ Naive-Bayes classifier
- ▶ Decision lists

Rule		Sense
<i>fish</i> within window	⇒	bass ¹
<i>striped bass</i>	⇒	bass ¹
<i>guitar</i> within window	⇒	bass ²
<i>bass player</i>	⇒	bass ²
<i>piano</i> within window	⇒	bass ²
<i>tenor</i> within window	⇒	bass ²
<i>sea bass</i>	⇒	bass ¹
<i>play/V bass</i>	⇒	bass ²
<i>river</i> within window	⇒	bass ¹
<i>violin</i> within window	⇒	bass ²
<i>salmon</i> within window	⇒	bass ¹
<i>on bass</i>	⇒	bass ²
<i>bass are</i>	⇒	bass ¹

[5]

Unsupervised

Compared to supervised approaches

- ▶ Less preparation work
- ▶ Lack of knowledge to label clusters
- ▶ Hybrid bootstrapping approach:
 - ▶ Start supervised with small labeled training data
 - ▶ Add disambiguated text with high confidence to training data
 - ▶ Usually one sense per discourse and collocation [4]

Reference Resolution

In General

Reference resolution concerns:

- ▶ Pronouns
- ▶ Definite noun phrases
- ▶ Inferrables

The following slides will focus on pronoun resolution.

Agreements

A valid reference has to agree in these aspects:

- ▶ Number
- ▶ Person
- ▶ Gender

Selection restriction can also apply.

Priorities

If multiple entities are valid, the one with the highest priority is the most likely candidate.

Priority depends on

- ▶ Recency
- ▶ Grammatical role
- ▶ Verb semantics

Algorithms

Intuitive algorithm [2]:

- ▶ Keep track of entities and their salience
- ▶ Add references to entity when they appear
- ▶ Update Salience






Other algorithms:

- ▶ Tree search
- ▶ Centering algorithm

Summary

- ▶ Single words can be ambiguous in a lot of cases
- ▶ Rule based systems can disambiguate with grammar and semantics
- ▶ Machine learning approaches can also be effective
- ▶ Reference resolution is important in a discourse
- ▶ Agreements and priorities can help narrow down the reference

References and Literature

-  https://en.wikipedia.org/wiki/List_of_linguistic_example_sentences
-  Speech and Language Processing, Daniel Jurafsky and James H. Martin, 1999
-  A Semantic Process for Syntactic Disambiguation, Graeme Hirst, 1984
-  Unsupervised Word Sense Disambiguation Rivaling Supervised Methods, David Yarowsky, University of Pennsylvania
-  The Structure of a Semantic Theory, Jerrold J. Katz; Jerry A. Fodor, 1963