

NLP U3 Semantic Analysis

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[Introduction, Meaning Representation, Lexical Semantics, Ambiguity, Word sense Disambiguation, Discourse processing : Introduction, Cohesion, Reference Resolution, Discourse Coherence & Structure]

Q # Introduction:

- Semantic analysis subfield of NLP that attempts to understand ~~not~~ meaning of natural language.
- Understanding human language for humans is a straightforward process but for machines it is quite difficult task.
- Captures meaning of given text in concern with context, logical structuring of sentences & grammar rules.

a) Parts of semantic analysis:

- ① Lexical semantic analysis \Rightarrow understands meaning of each word of text individually.
 - fetches dictionary meaning of word.
- ② Compositional semantic analysis \Rightarrow Understands meaning of text which formed by combination of individual words.
 - Example \Rightarrow
 - 1) Students love NLP.
 - 2) NLP loves students.

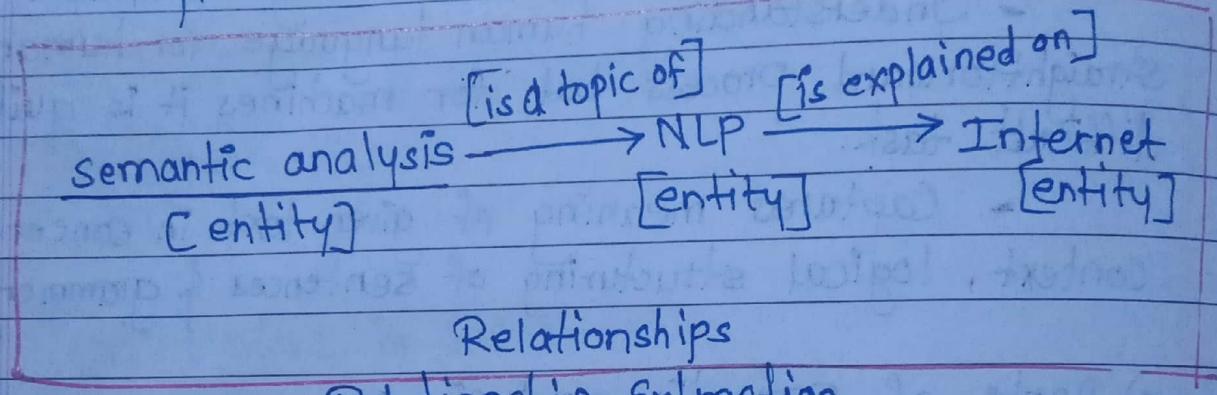
In above two sentences, both have same set of root words but they convey entirely different meanings.

b) Tasks of semantic analysis :

- ① Word Sense Disambiguation
- ② Relationship extraction \Rightarrow first identifies entities present in sentence & then extracts relationships betⁿ those entities.

Ex. \Rightarrow

Semantic analysis is a topic of NLP which is explained on Internet.



ex. Relationship Extraction

c) Elements of Semantic analysis :

- ① Hyponomy \Rightarrow
 - Instance of generic term
 - 'color' is hypernymy & 'red', 'black', 'blue' are its hyponyms.
- ② Homonymy \Rightarrow same spelling but different meanings.
 - 'Rose' (past form of 'rise' or flower).
- ③ Synonymy \Rightarrow diff. spellings but same meanings.
 - (Job, occupation) (large, big)
- ④ Antonymy \Rightarrow pair of terms with contrast meanings.
 - (Hot, cold)
- ⑤ Meronymy \Rightarrow Relationship where one term is a part of larger entity.
 - 'Wheel' is meronym of 'Automobile'.

⑥ Polysemy \Rightarrow Term have same spelling with multiple closely related meanings.

- 'Man' meanings \Rightarrow 'the human species', 'a male human', 'an adult male human'.

d) Applications of semantic analysis :

① Machine Translation \Rightarrow translate text from one language to another

② Information Retrieval \Rightarrow find relevant information from large collection of text.

③ Question Answering \Rightarrow Used to answer the questions about a text.

④ Chatbots \Rightarrow Used to create chatbots which can have natural conversations with humans.

e) challenges :

① Ambiguity

② Polysemy

③ World knowledge (requires knowledge of world)

P. # Meaning Representation :

- Representation of meaning of text in natural language.
- It is easy to understand meaning of text for human but not for machines. So machines tends to represent text in specific format to extract its meaning.
- This is called meaning representation.
- Apps \Rightarrow Machine translation, question answering & NLP.

a) Basic units of meaning representation :

- ① Entity \Rightarrow particular unit or individual in specific text (i.e. person or location).
eg. Australia, Pune, Riyan
- ② Concept \Rightarrow understood as generalization of entities.
eg. City, students, etc.
- ③ Relations \Rightarrow Establish relationships bet' entities & concepts.
eg. Pune is a city.
- ④ predicate \Rightarrow represent verb structure of sentences.

b) Ways of meaning representation :

- ① Symbolic representation \Rightarrow represent meaning of natural language expressions using formal language.
 - More expressive but difficult to develop & maintain

② Statistical representation \Rightarrow uses statistical methods to represent meaning of natural language expressions.

- Less expressive but easy to develop & maintain.

c) Popular approaches to meaning representation :

- ① First Order Predicate Logic (FOPL)
- ② Case grammar
- ③ Semantic nets
- ④ Conceptual dependency (CD)
- ⑤ Conceptual graphs
- ⑥ Frames

d) Examples of meaning representation :

① Logic based representation \Rightarrow uses formal language like first order logic to represent meaning of natural language expressions.

② Frame based representation \Rightarrow uses frames like data structures.

③ Semantic networks \Rightarrow uses network of nodes & edges.

Q. # Lexical Semantics :

- Study of how words & phrases relate to each other & to world.
- Essential for NLP & AI.
- Helps machines to understand meaning & context of human language.
- By using lexical semantics, machines can perform :

- ① machine translation \Rightarrow translate text from one language to another.
- ② Information extraction \Rightarrow extract relevant facts & events from texts or speech.
- ③ Question answering \Rightarrow finds & provide answers to natural language queries.
- ④ dialogue system \Rightarrow helps to engage in natural & interactive conversations with humans.
- ⑤ text summarization \Rightarrow converts long text into shorter one.

a) Some key components :

[elements of semantic analysis write here]

b) challenges :

- ① Ambiguity
- ② Variability
- ③ Creativity
- ④ Evolution of language.

- ① Ambiguity \Rightarrow lexical items have multiple meanings.
depends on context.
- ② Creativity \Rightarrow lexical items can be invented or modified
to create new meanings or effects.
- ③ Variability \Rightarrow lexical items can have different forms
or expressions.
- ④ Evolution \Rightarrow lexical items can change or ~~disappear~~
disappear due to cultural, social or technological
factors.

c) Opportunities :

- ① Semantic representation \Rightarrow lexical items can be encoded
in a way that captures their meanings & relations.
- ② Semantic similarity \Rightarrow lexical items can be compared
or measured in terms of closeness or distance
in their meaning.
- ③ Semantic inference \Rightarrow lexical items can be used
to derive new information.
- ④ Semantic evaluation \Rightarrow lexical items can be assessed
or validated in terms of their accuracy or quality

NLU - Natural Language Understanding

Q # Ambiguity :

- Stylish programming technique to confuse conscious mind.
- Arises when words or phrases have multiple meanings.
- Leads to uncertainty in choosing right meaning of sentence.
 - challenging task in ~~NLU~~ & can be handled by disambiguation process.
- Name entity recognition (NER) eliminates ambiguities.
- Types:
 - Lexical
 - Syntactic
 - Semantic

a) Lexical ambiguity :

- Causes by a word when it have multiple senses (meanings).
- eg ① 'Metal' have two meanings
'a substance' & 'a music genre'.
② 'bat' ⇒ 'an animal' & 'sports bat'.
- Referred as homonymy.

b) Syntactic ambiguity :

- Also referred as structural or grammatical ambiguity.
- occurs when sentence structure have two or more possible meanings.
- eg. ① 'I invited the person with the microphone'
Two meanings: I spoke using the microphone to invite the person.

I invited the person who has the microphone.

c) Semantic ambiguity :

- Occurs when there are more than one way of reading a sentence.
- Word with diff. meanings in text.
- Eg. The old car needed constant attention.
The troops stood at attention.

d) Pragmatic ambiguity

e) Discourse ambiguity

- In ambiguity, Syntactic ambiguity resolves by using POS tagging
Semantic ambiguity resolves using WSD.

Word Sense Disambiguation (WSD) :

- Basically solves ambiguities arises in determining meaning of same word used in diff. situations.
- Subfield of NLP that determines intended (actual) meaning of words from given text.

a) Evaluation of WSD :

- Two inputs are required for evaluation :
 - ① Dictionary
 - ② Text corpus
- ① Dictionary \Rightarrow specify words that needs to be disambiguated.
- ② Text corpus \Rightarrow another input to WSD.
 - Disambiguate small sample of words or all words in given text.

b) Approaches & Methods :

- ① Dictionary-based or knowledge-based methods :
 - method primarily depends on dictionaries, & knowledge base.
 - Uses dictionary to lookup diff. senses of word.
 - The correct sense is then chosen based on context.

- ② Statistical approaches :
 - Uses statistical methods to find probability of word having particular meaning.
 - correct sense is chosen based on highest probability .

③ Hybrid approaches : combination of dictionary-based & statistical approaches

④ supervised methods

⑤ Unsupervised methods

⑥ Semisupervised methods

c) Applications :

① Lexicography \Rightarrow with lexicography, WSD provides statistically significant contextual indicators of sense.

② Text mining & Information extraction \Rightarrow

- Used for accurate analysis of text.
- WSD provide intelligent gathering system for flagging of correct words.
- Eg. In medical, might need 'illegal drugs' than 'medical drugs'.

③ Information retrieval \Rightarrow

WSD used to resolve ambiguities of queries provided by IR system.

④ Machine translation \Rightarrow

most obvious application of WSD.

d) Difficulties in WsD :

- ① Word sense discreteness → words cannot be easily divided into discrete submeanings.
- ② Inter-judge variance ⇒ WsD systems generally tested by their results of task ~~are~~ compared against task of human beings.
- ③ Differences betⁿ dictionaries.
- ④ Different algorithms for different applications.

^{Training part} b) Approaches & methods :

- ④ Supervised methods ⇒ Uses sense-oriented corpora to train.
- ⑤ Semisupervised methods ⇒ Uses secondary source of knowledge like small annotated corpora as seed data in bootstrapping.
- ⑥ Unsupervised methods ⇒ Uses directly from raw unannotated corpora.

Linguistics → grammatical
Utterances → wordings/phrasing/
statements



Q # Discourse Processing :

- There are no. of major problems in NLP, one is Discourse processing.
- It is building of theories & models of how utterances stick together to form coherent discourse.
- Language always consists of allocated, structured & coherent group of sentences, these groups are 'discourse'.

a) Coherence :

- Sequence of sentences is 'text' when there is some dependence betn sentences.
- Task of textual analysis is to identify features caused by this dependence.
- These features are 'cohesion' & 'coherence'.

Cohesion →

- linguistic features that link sentences together & are easy to identify.
- While framing sentences & phrases, cohesion is how you put your ideas & views together.
- Measurable property → measured using grammar rules.
- Quantitative property.

- Coherence concerns to concepts & relation which are mutually accessible & relevant.

Cohherence →

- Evaluates output quality of natural language generation system along with good text property.
- Superset of cohesion which includes cohesive sentences, properties like consistency & understandability of content.
- Qualitative property.
- Abstract which deals with ideas.

b) Discourse Structure :

- Imp question → regarding discourse → what kind of structure it must have.
- Answer → depends on segmentation applied to discourse.
- Discourse segmentations → determines types of structures for large discourse.
- Discourse segmentation → quite difficult to implement but imp for IR, info extraction & text summarization.
- Human discourse exhibits structures that intended indicates common experiences & respond to them.

• Discourse Segmentation :

- Documents are automatically partitioned into fragments i.e. passages, these are discourse segments.
- Techniques to separate doc into passages :
 - ① Rule based systems based on clue words & phrases.
 - ② probabilistic techniques to separate fragments
 - ③ Text filling algorithm uses cohesion to identify segments .

- Algorithms for discourse segmentation :

① Unsupervised discourse segmentation \Rightarrow

- 'linear segmentation.'
- Depends on cohesion which means use of linguistic features to bind textual units together.

② Supervised discourse segmentation \Rightarrow

- Needs boundary labeled training data.
- Discourse marker or cue words plays an imp role.
 - Discourse marker or cue word \Rightarrow word or phrase that functions to signal discourse structure.
 - Discourse markers are domain specific.

c) Reference Resolution :

- Reference \Rightarrow linguistic expression to denote an entity or individual.

Ex. Ram, manager of Kotak bank,
Saw his friend Shyam.

He went to meet him.

Here, Ram, his, he are reference.

- Reference resolution \Rightarrow task of determining what entities referred to by which linguistic expression.

[Discourse processing intro part,

a) coherence part &

b) discourse structure part]

In short you can write here.]