

Natural Language Processing and Machine Translation

Fundamentals of Natural Language Processing

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Beginnings of NLP

- Started in 1940s after WW2
- By 1958, significant issues were discovered with natural language
- Between 1957-1970, researchers split into two divisions of nlp
 - Symbolic approach
 - Stochastic approach

Symbolic approach

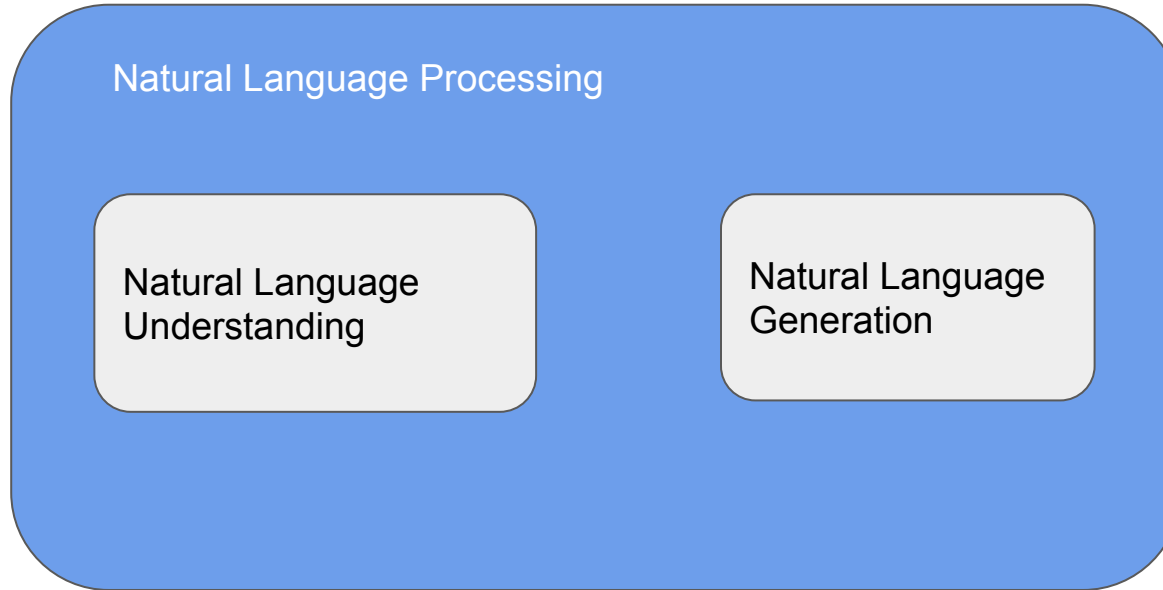
- Rule based approach
- Focused on formal languages and generating syntax

Stochastic approach

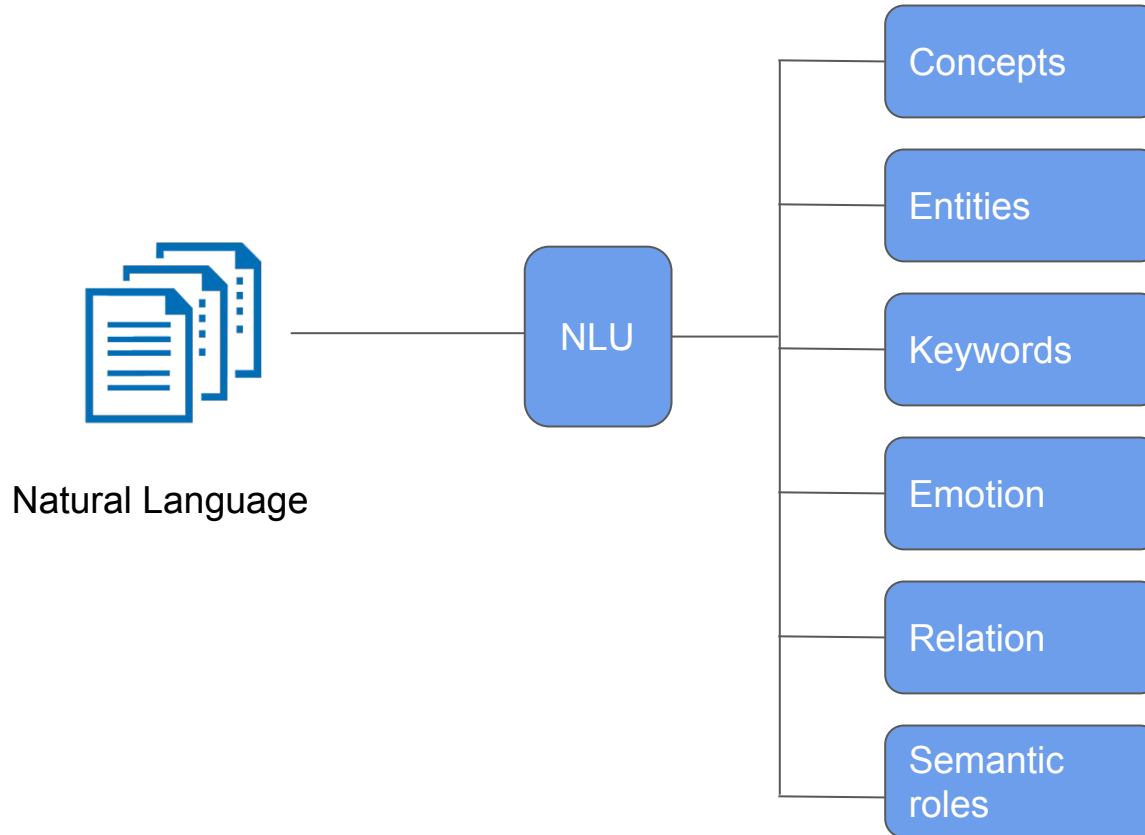
- Statistical and probabilistic methods of NLP

After 1970, **logic-based paradigms**, was embraced, that focused on encoding rules and language in mathematical logic, contributing to development of **Prolog**

Generic NLP systems



Natural Language Understanding



Phases of NLP

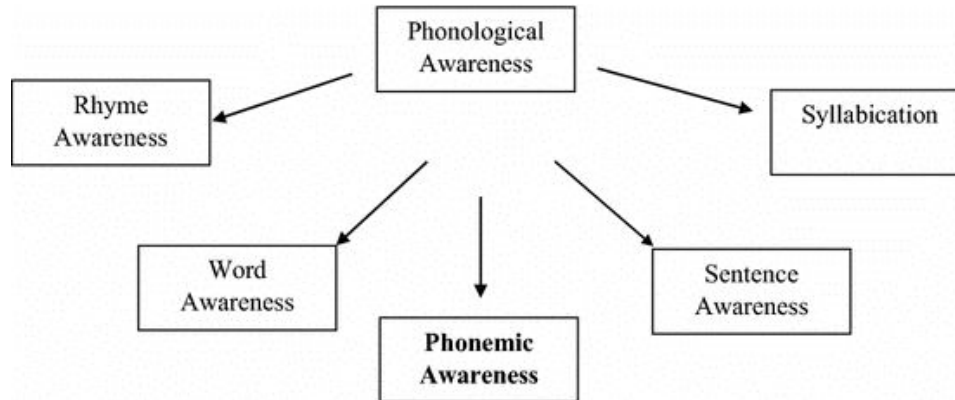
- Phonological Analysis
- Morphological Analysis
- Lexical Analysis
- Syntactic Analysis
- Semantic Analysis
- Discourse Integration
- Pragmatic Analysis

Phonological Analysis

- Study of speech and sounds of a particular language
- Very first component of language

Phonetics

- Study of how speech sounds of human language from the perspective of their production, perception or their physical properties



Morphological Analysis

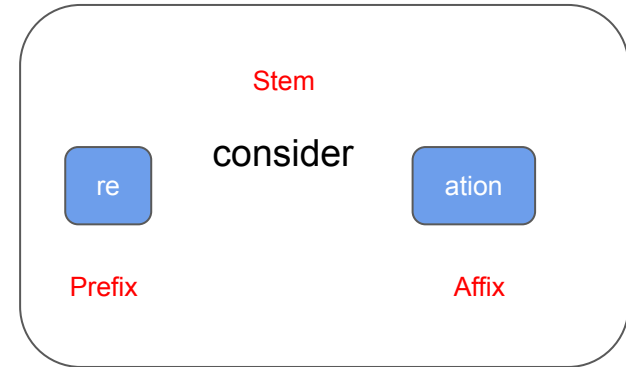
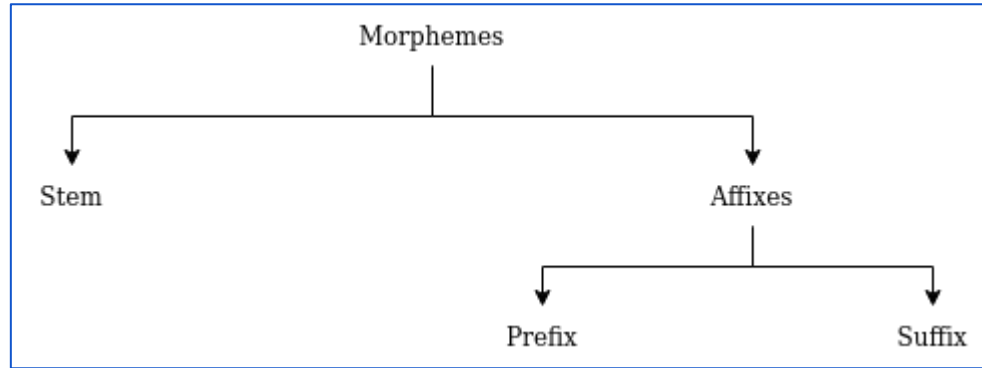
- Study of word formation
- Identification, analysis of root words, affixes, POS

Washing = Wash + ing

Browser = Browse + er

Rats = Rat + s

Morphological Analysis



Morphological Analysis

- Recognized root form of inflected words and construct a standardized representation

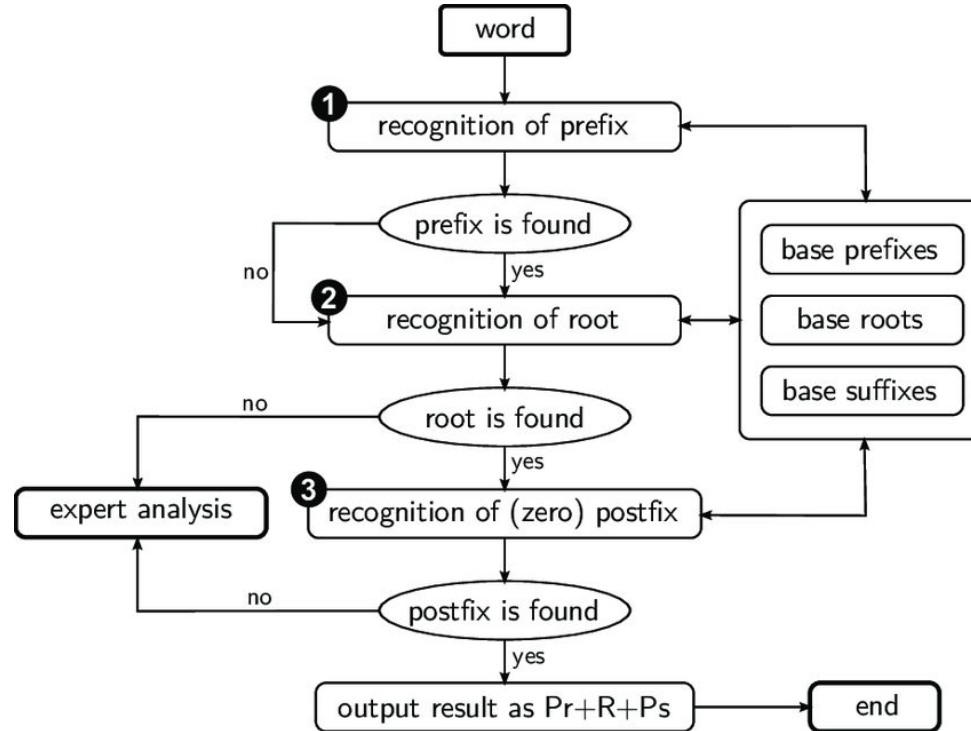
book = book + SG

books = book + PL

ran = run + PAST

Input	Morphological
Cats	Cat + N + PL
Geese	Goose + N + PL
caught	Catch + V + PAST
missed	Miss + V + PAST
cat	cat + N + SG

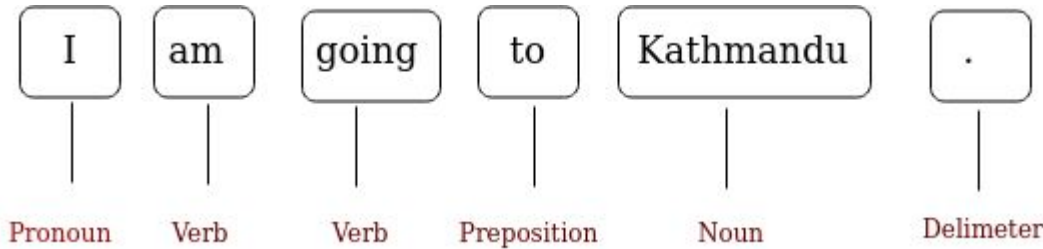
Morphological Analysis



Kovár, V., Horák, A., & Jakubíček, M. (2010, December). How to Analyze Natural Language with Transparent Intensional Logic?. In *RASLAN* (pp. 69-76).

Lexical Analysis

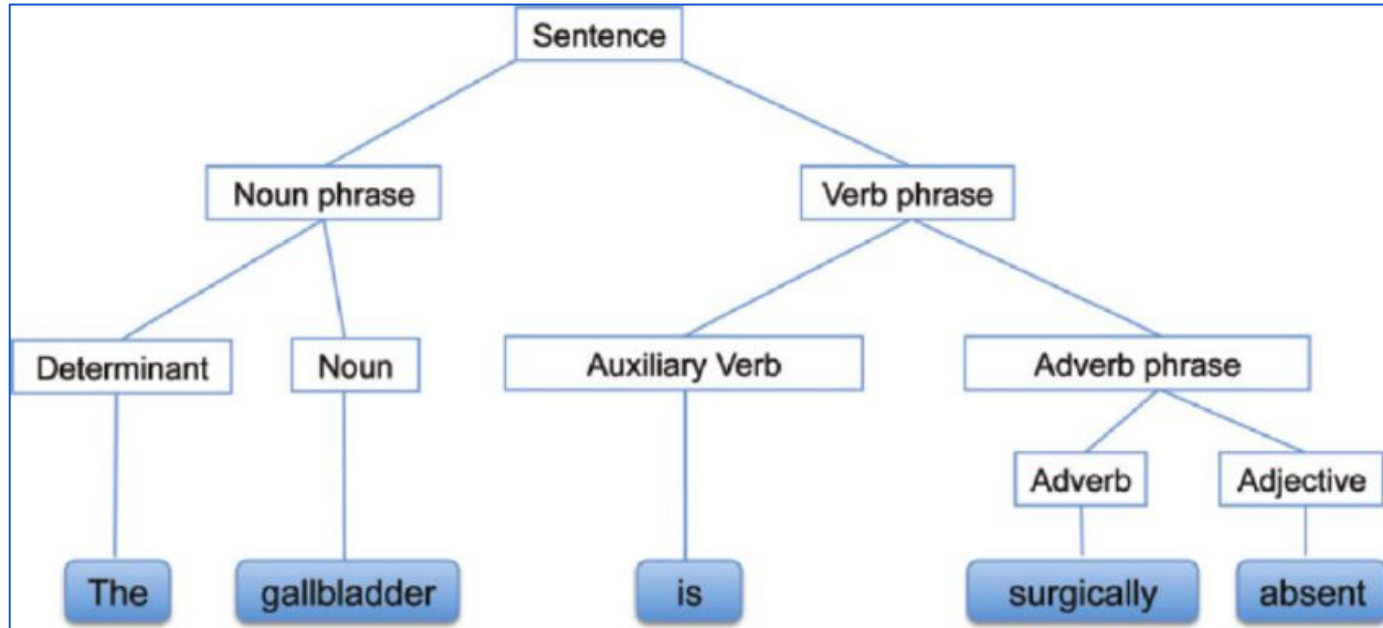
- Understand what the word means
- Understand the context
- Note the relationship of one words to others
- Lexeme vs Tokens



Lexeme	Tokens
<i>I</i>	PRONOUN
<i>am</i>	VERB
<i>going</i>	VERB
<i>to</i>	PROPOSITION
<i>Kathmandu</i>	NOUN
<i>.</i>	DELIMITER

Syntactic Analysis

- Check syntactic structure and its components
- Generates a parse tree



Cai, T., Giannopoulos, A. A., Yu, S., Kelil, T., Ripley, B., Kumamaru, K. K., ... & Mitsouras, D. (2016). Natural language processing technologies in radiology research and clinical applications. *Radiographics*, 36(1), 176.

Context Free Grammar

Consists of a finite set of grammar rules represented as a quadruple (N, T, P, S) where

N = set of non terminal symbols

T = set of terminal symbols

P = set of rules, $P : N \rightarrow (N \cup T)^*$

S = start symbol

Syntactic Analysis

Context Free Grammar

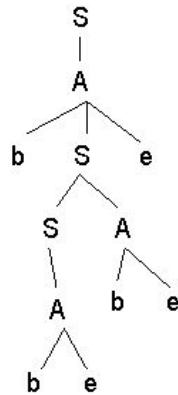
- $S \rightarrow SA$
- $S \rightarrow A$
- $A \rightarrow bSe$
- $A \rightarrow be$

Example: b and e matched
as parentheses

derivation of bbebee

S
A
bSe
bSAe
bAAe
bbeAe
bbebee

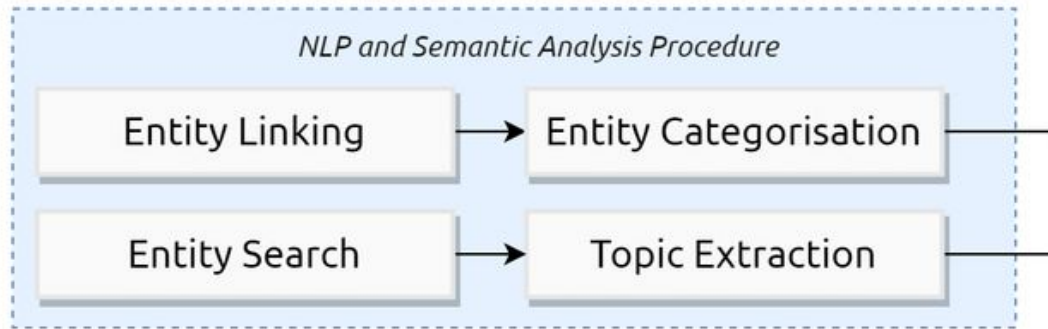
hierarchical
parse tree



<https://courses.cs.washington.edu/courses/csep521/99sp/lectures/lecture13/sld028.htm>

Semantic Analysis

- Helps in understanding the context
- Understanding the emotions that might be depicted in the sentence
- Extracting information from text
- Commonly used in translation, chatbots and search engines



López-Martínez, A., Carrera, Á., & Iglesias, C. A. (2020). Empowering museum experiences applying gamification techniques based on linked data and smart objects. *Applied Sciences*, 10(16), 5419.

Semantic Analysis

Parts of semantic analysis

- ❑ Lexical Semantic Analysis
- ❑ Compositional Semantic Analysis

Tasks involved in Semantic analysis

- ❑ Word Sense Disambiguation
- ❑ Relationship Extraction

Semantic Analysis

Elements of Semantic Analysis

- ❑ Hyponymy

Color -> grey, blue, white, black

- ❑ Homonymy

Rose, bank

- ❑ Synonymy

(large, big) (tall, gigantic)

- ❑ Antonymy

(hot, cold), (tall, short)

Semantic Analysis

Elements of Semantic Analysis

- ❑ Polysemy

Man -> “human species” , “male human” , “adult male”

- ❑ Meronymy

Wheel -> Automobile

Basic building blocks of semantic system

- ❑ Entities
- ❑ Concept
- ❑ Relations
- ❑ Predicates
- ❑ Case grammar

Approaches of Semantic analysis

❑ First order predicate logic

I love pizza. $\rightarrow \text{love}(\text{I}, \text{pizza})$

Jack studies english and mathematics $\rightarrow \text{studies}(\text{Jack}, \text{english}) \wedge \text{studies}(\text{Jack}, \text{mathematics})$

Jill takes biology or physics $\rightarrow \text{takes}(\text{Jill}, \text{biology}) \vee \text{takes}(\text{Jill}, \text{physics})$

❑ First order predicate logic

- All students taking AI are genius.

$$\forall x: \text{students}(x) \wedge \text{taking AI}(x) \rightarrow \text{genius}(x)$$



- Some students are taking AL are genius and hardworking.

$$\exists x: \text{students}(x) \wedge \text{taking AI}(x) \rightarrow \text{genius}(x) \wedge \text{hardworking}(x)$$

- Hiba takes DM and AI.

$$\exists x: \text{hiba}(x) \wedge \text{takes}(x, \text{DM}) \wedge \text{takes}(x, \text{AI})$$

[https://www.slideshare.net/HabibaSaeed5/first-order-predicat
e-logic-examples-different-examples](https://www.slideshare.net/HabibaSaeed5/first-order-predicat-e-logic-examples-different-examples)

❏ First order predicate logic

- Brothers are siblings.

$\forall x \forall y: \text{brother}(x) \rightarrow \text{Siblings}(x, y)$



- Nida has no sister.

$\sim \exists x: \text{Sister.Of}(x, \text{Nida})$

- Every student smiles.

$\forall x: \text{student}(x) \rightarrow \text{smile}(x)$

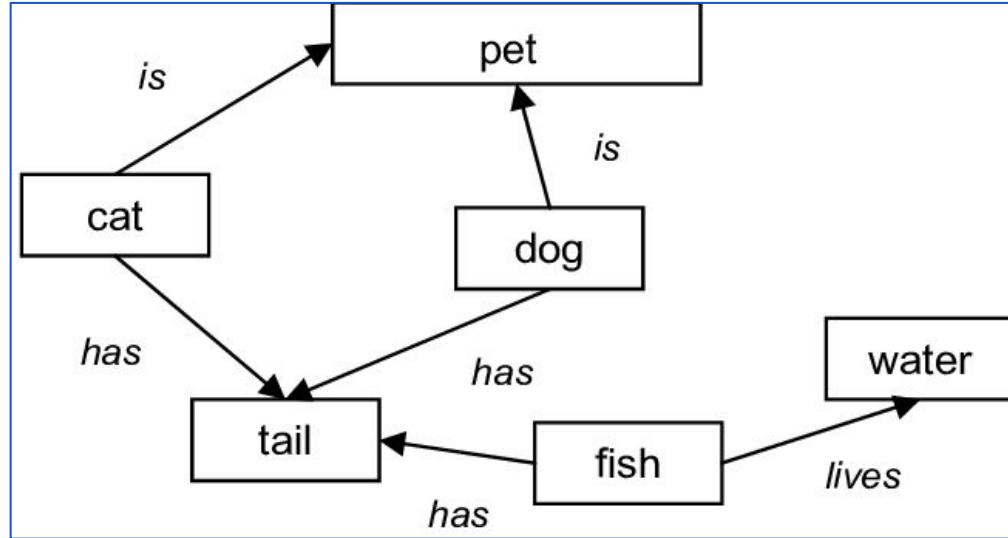


<https://www.slideshare.net/HabibaSaeed5/first-order-predicate-logic-examples-different-examples>

Semantic Analysis

Approaches of Semantic analysis

❑ Semantic nets

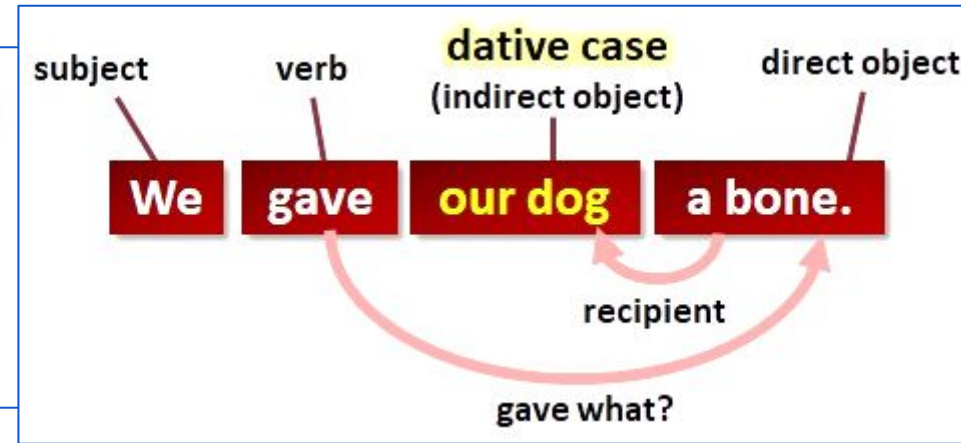
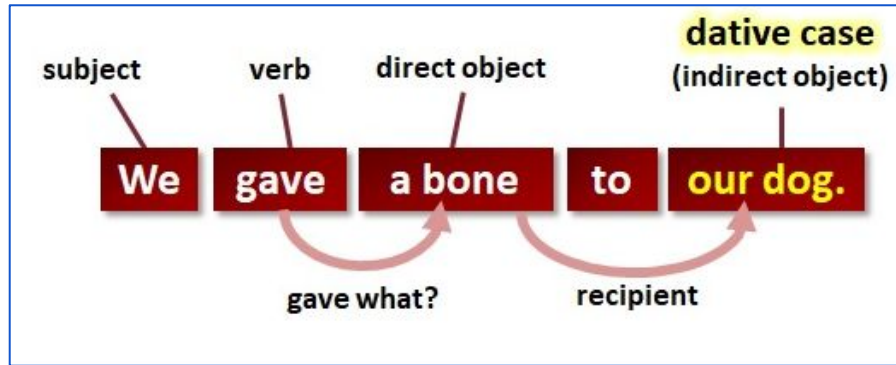


Lula, P., Morajda, J., Paliwoda-Pękosz, G., Stal, J., Tadeusiewicz, R., & Wilusz, W. (2014). Computer Methods of Data Analysis and Processing. *Computer Methods of Data Analysis and Processing, Cracow University of Economics*.

Semantic Analysis

Approaches of Semantic analysis

❑ Case Grammar



https://www.grammar-monster.com/glossary/dative_case.htm

Discourse Integration

- ❑ Makes a sense of the context
- ❑ Deals with how the immediately preceding sentence can affect the interpretation of next
- ❑ who/when/where/what are involved in an event

Bill had a red balloon.
John wanted **it**.

What is **it** in this context ?

Pragmatic Analysis

- ❑ Study of language that is not directly spoken, instead hinted

Turn the heat on. It's getting cold

What does the user mean by
"turning the heat on"?

Literally turning on the
heat

Turning on the heater

Aspects of Pragmatics

❑ Deixis

Word or phrases that cannot be fully understood without additional information.

Eg. Meet me here. (Meet where exactly?)

❑ Implicature

❑ Conversational Implicature

Agent 1: I am hungry

Agent 2: There is a restaurant nearby

Aspects of Pragmatics

❑ **Presupposition**

Based on speaker's assumption prior to making an utterance.

Eg. John's brother is buying two mercedes

❑ **Speech text**

Eg. I smashed the potato

Ambiguities in NLP

❑ **Morphological ambiguity**

❑ Word category ambiguity

book -> Noun, book -> Verb

bank -> Noun, bank -> Verb

❑ **Syntactic Ambiguity**

Ambiguity in grammar structure.

Eg. Visiting relatives can cause problems.
can be interpreted as

- 1) Relatives who visit can cause problems
- 2) When we visit relatives, there can be problems

❑ Semantic Ambiguity

- ❑ Word sense disambiguation

Each word in a sentence has more than one meaning.

Eg. Kanchan is currently in a terrible state

❑ Discourse Ambiguity

- ❑ Anaphoric ambiguity

- 1) Monkey eats banana, when they wake up
Who is they here? -> Monkey
- 2) Monkey eats banana, when they are ripe
Who is they here? -> Banana

Challenges in NLP

- ❑ **Elongated words**
- ❑ **Shortcuts**
- ❑ **Handling emojis**
- ❑ **Mix use of language**
- ❑ **Ellipsis**
- ❑ **Punctuational ambiguity**

Programming languages for NLP

- ❑ **Python**

- ❑ **Java**

- ❑ **R**

Applications of NLP

- ❑ Sentiment analysis
- ❑ Text Classification
- ❑ Chatbots and virtual assistants
- ❑ Text Extraction
- ❑ Machine Translation
- ❑ Text Summarization
- ❑ Market Intelligence
- ❑ Auto-correct / Suggestions
- ❑ Intent Classification
- ❑ Speech recognition

