

Introduction to Natural Language Processing

Introduction

book

https://web.stanford.edu/~jurafsky/slp3/ed3book_dec302020.pdf

Hit record

Syllabus

The semester



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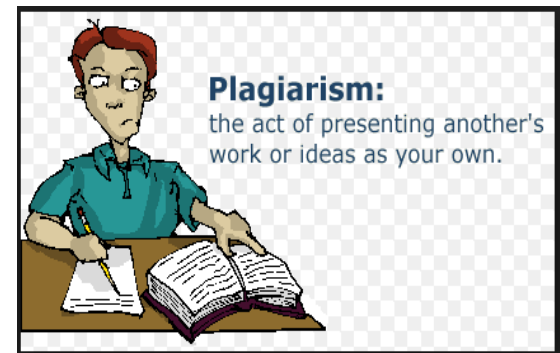
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Small Lecture

What is Natural Language Processing?

- The study of human languages and how they can be represented computationally and analyzed and generated algorithmically
 - Understanding:
 - *The cat is on the mat.* --> on (cat, mat)
 - Generation:
 - on (cat, mat) --> *The cat is on the mat.*
 - on (dog, couch) -> *The dog is on the couch.*
- Studying NLP involves studying natural language, formal representations, and algorithms for their manipulation

What *is* Natural Language Processing?

Building computational models of natural language comprehension and production

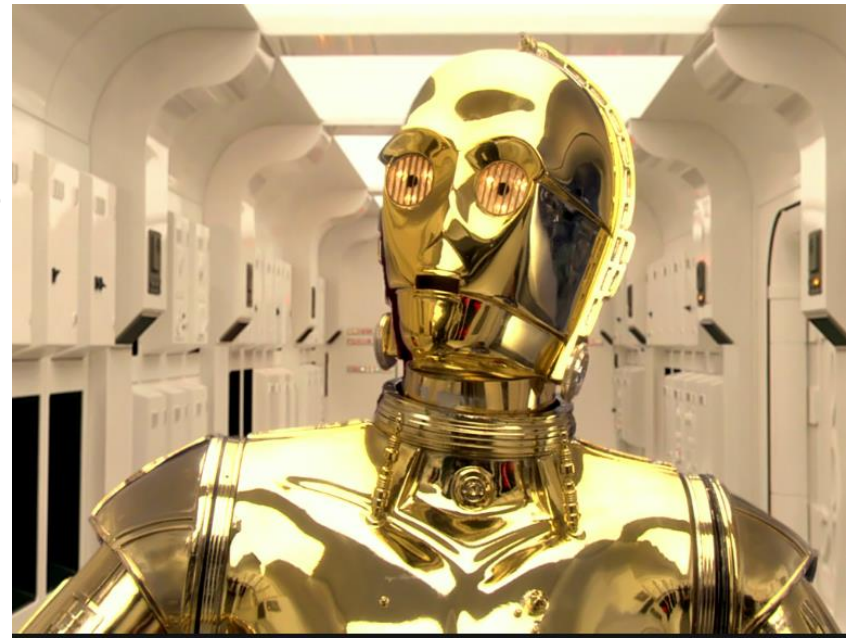
Other Names:

- Computational Linguistics (CL)
- Human Language Technology (HLT)
- Natural Language Engineering (NLE)
- Speech and Text Processing

Perspectives

- Engineering Perspective
- Cognitive Science Perspective
- Theoretical Linguistics Perspective

Engineering Perspective



Use CL as part of a larger application:

- Spoken dialogue systems for telephone based information systems
- Components of web search engines or document retrieval services
 - Machine translation
 - Question/answering systems
 - Text Summarization
- Interface for intelligent tutoring/training systems

Emphasis on

- Robustness (doesn't collapse on unexpected input)
- Coverage (does something useful with most inputs)
- Efficiency (return an answer in a timely manner)

Cognitive Science Perspective



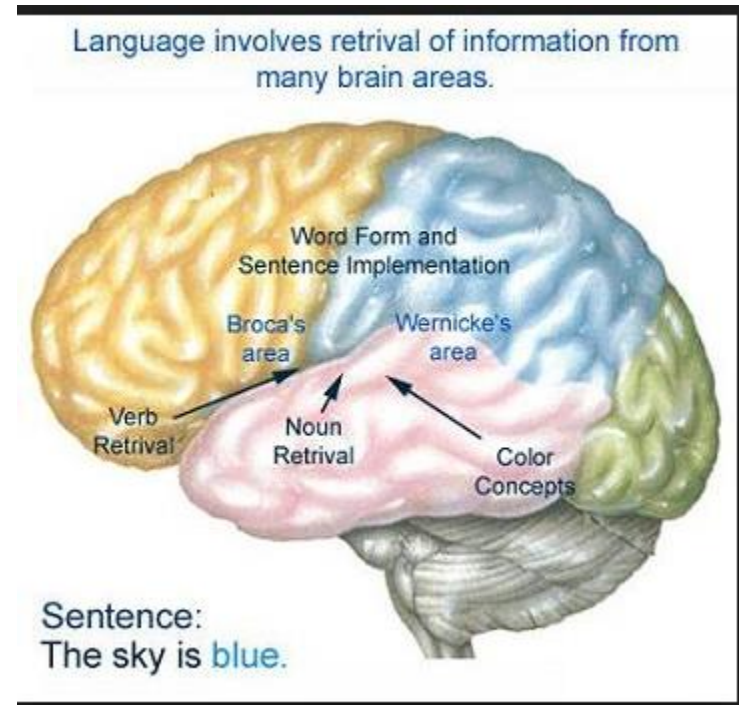
Goal: gain an understanding of how people comprehend and produce language.

Goal: a model that explains actual human behaviour

Solution must:
explain psycholinguistic data
be verified by experimentation

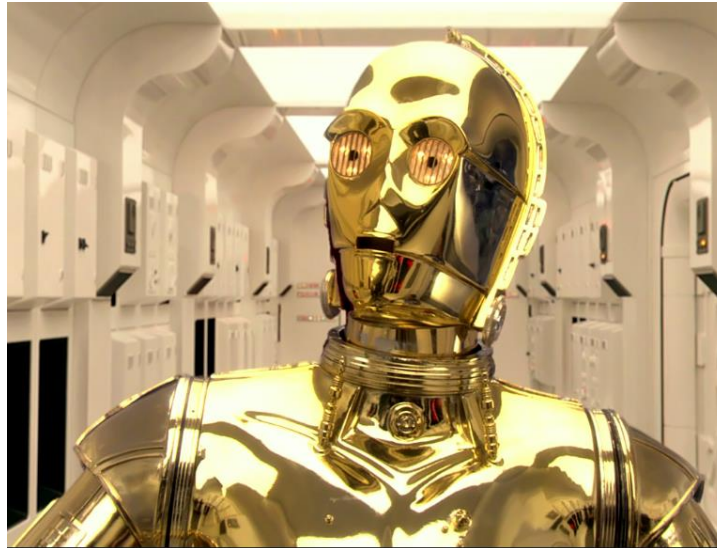
Theoretical Linguistics Perspective

- In principle, coincides with the Cognitive Science Perspective
 - CL can potentially help test the empirical adequacy of theoretical models.
- Building computational models of the theories allows them to be empirically tested.
 - E.g., does your grammar correctly parse all the grammatical examples in a given test suite, while rejecting all the ungrammatical examples?



Orientation of this Class

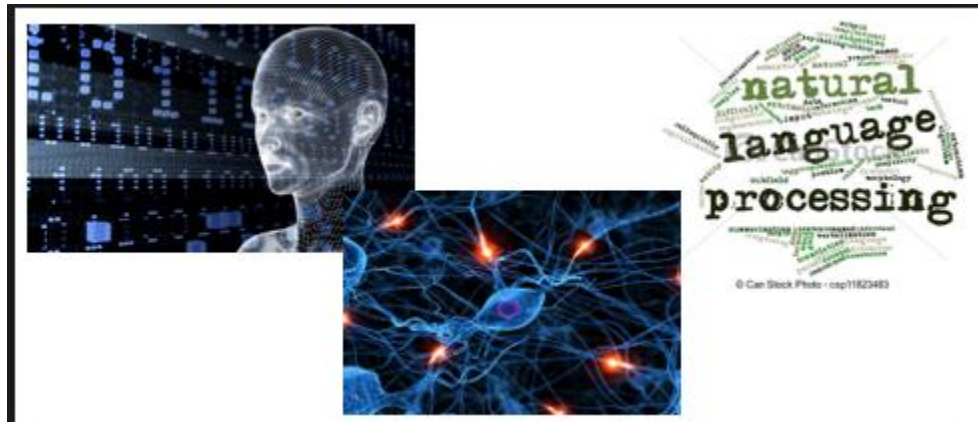
- Emphasis on principles and techniques
- Emphasis on processing textual input (as opposed to speech)
- Oriented towards both symbolic and statistical approaches



Why Should You Care?

Trends:

1. An enormous amount of knowledge is now available in machine readable form as natural language text
2. Conversational agents are becoming an important form of human-computer communication
3. Much of human-human communication is now mediated by computers



Knowledge needed to understand and produce language

- *Phonetics and phonology:*
 - how words are related to sounds that realize them
- *Morphology:*
 - how words are constructed from more basic meaning units
- *Syntax:*
 - how words can be put together to form correct utterances
- *Lexical semantics:*
 - what words mean
- *Compositional semantics:*
 - how word meanings combine to form larger meanings
- *Pragmatics:*
 - how situation affects interpretation of utterance
- *Discourse structure:*
 - how preceding utterances affects processing of next utterance

Phonetics and Phonology

speech sounds, their production, and the rule systems that govern their use

^{/ɑ:f/} ^{/ə/}
laughter

^{/ɔ:/} ^{/ə/}
daughter

^{/t/}
baked

^{/θ:z/}
Thursday

^{/ʌ/} ^{/ə/}
London

^{/ʃə/}
patient

^{/wɪdʒ/}
language

^{/ph/} ^{/ə/}
haphazard

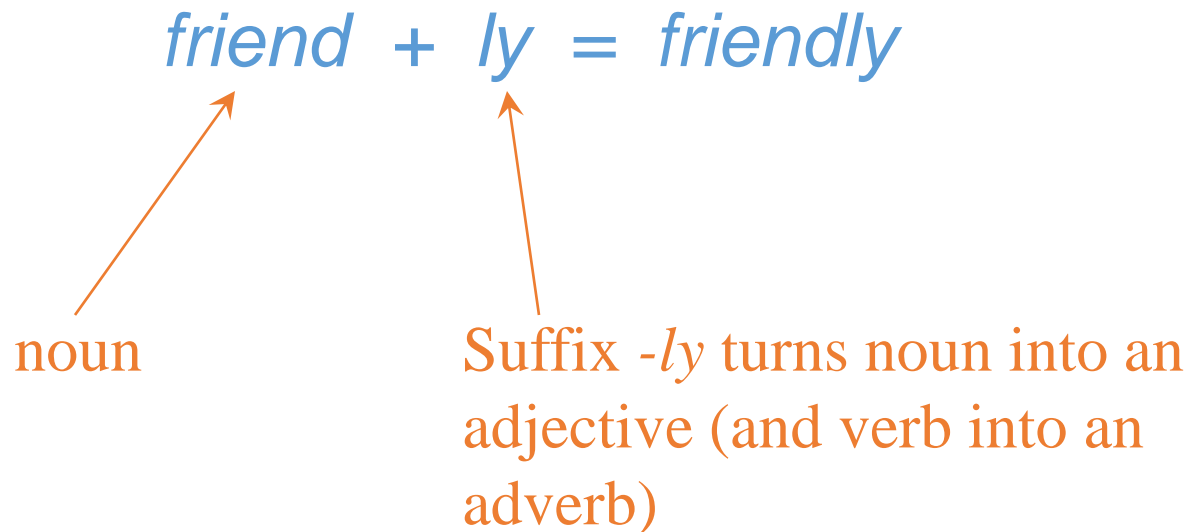
^{/e/}
friend

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Morphology

- How words are constructed from more basic units, called *morphemes*



Morphology

- Words and their composition can be tricky
 - Pluralization:
 - cat -> cat**s**
 - dog -> dog**s**

and then we have:

- child -> child**ren**
- mouse -> m**ice**



mouse



mouses

Morphology

- Words and their composition can be tricky

- Pluralization:

- cat -> cat**s**
- dog -> dog**s**

and then we have:

- child -> child**ren**
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- Suffixes (or not)
 - **undo**, **union**

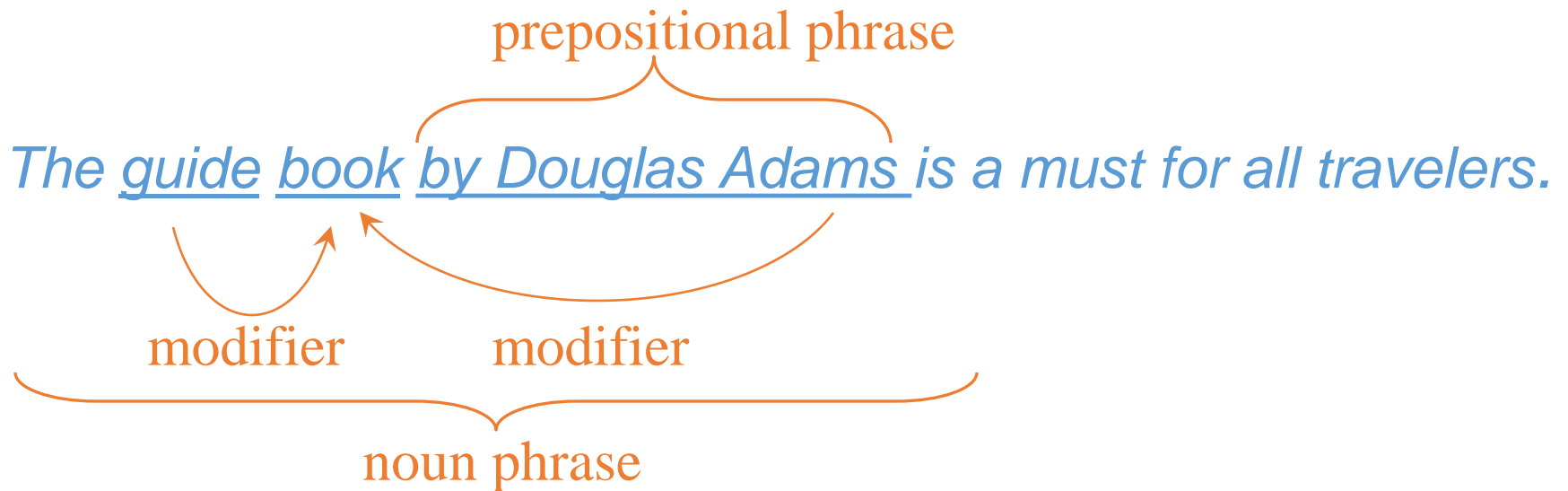


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Syntactic Knowledge

- how words can be put together to form legal sentences in the language
- what structural role each word plays in the sentence
- what phrases are subparts of other phrases



- Syntax: the structuring of words into larger phrases
 - Number of ways to structure a phrase and achieve the same meaning
 - John hit Bill (active)
 - Bill was hit by John (passive)
 - Bill, John hit (preposing)
 - Who John hit was Bill (wh-cleft)

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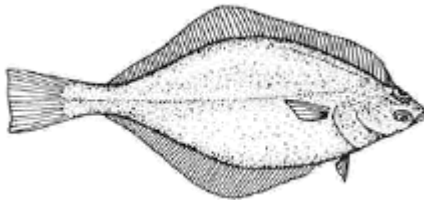
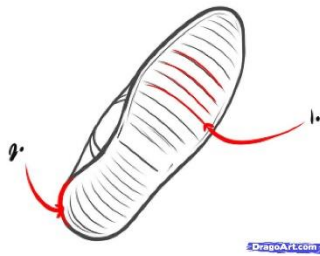
Semantic Knowledge

- What does a word mean?

bat



sole



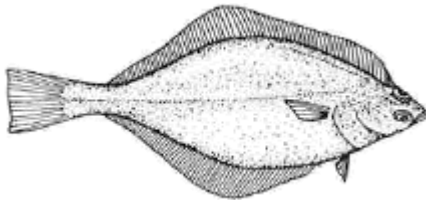
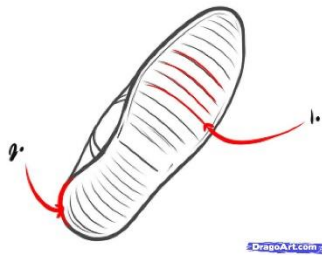
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Semantic Knowledge

- What does a word mean?

sole



I ate sole for dinner.

bat



The bat flew.

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Pragmatics and Discourse: The influence of Context on language

“Going Home” – A play in one act; five scenes
by Bonnie Dorr

- **Scene 1:** Pennsylvania Station, NY
 - Bonnie: Long Beach?
 - Passerby: Downstairs, LIRR Station.
- **Scene 2:** Ticket Counter, LIRR Station
 - Bonnie: Long Beach?
 - Clerk: \$4.50.

- **Scene 3:** Information Booth, LIRR Station
 - Bonnie: Long Beach?
 - Clerk: 4:19, Track 17.
- **Scene 4:** On the train, vicinity of Forest Hills
 - Bonnie: Long Beach?
 - Clerk: Change at Jamaica.
- **Scene 5:** On the next train, vicinity of Lynbrook
 - Bonnie: Long Beach?
 - Clerk: Right after Island Park.

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- 1. Bonnie has a limited vocabulary*
- 2. Context is important*

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Discourse

- Relationships we infer between discourse entities
- Not expressed in either of the propositions, but from their juxtaposition

Friend 1: I'm hungry.

Friend 2: Let's go to the Fuji Gardens.



Discourse

- Relationships we infer between discourse entities
- Not expressed in either of the propositions, but from their juxtaposition

Friend 1: It's a beautiful day.

Friend 2: Let's go to the Fuji Gardens.



Discourse and Temporal Interpretation

Max fell. John pushed him.



Syntax and semantics: “him” refers to Max

Lexical semantics and discourse: the pushing occurred before the falling.

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World knowledge

- What we know about the world and what we can assume our hearer knows about the world is intimately tied to our ability to use language

I took the cake from the plate and ate it.

World knowledge

- What we know about the world and what we can assume our hearer knows about the world is intimately tied to our ability to use language

*I took the **cake** from the plate and ate it.*



World knowledge

- What we know about the world and what we can assume our hearer knows about the world is intimately tied to our ability to use language

*I took the **fugu** from the plate and ate it.*

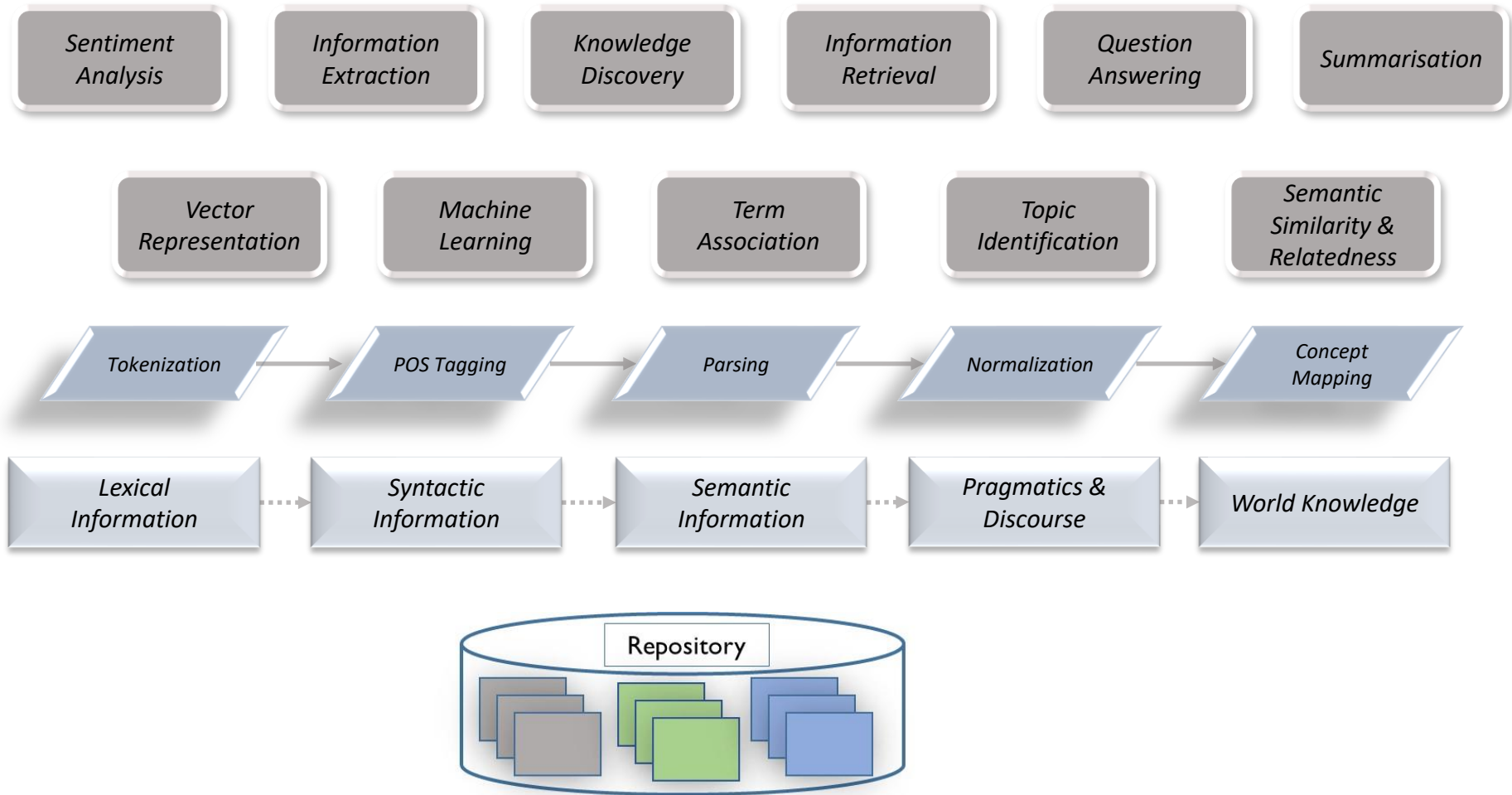
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*I took the **fugu** from the plate and ate it.*



Natural language processing stack



Questions?