

# NATURAL LANGUAGE PROCESSING (NLP) FUNDAMENTALS

## INTRODUCTION

# About Me



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- Senior Lecturer
- Department of Information Systems and Analytics
  
- Teaches Courses on:
  - ▣ Analytics
  - ▣ Software Engineering
  
- Undergraduates, Graduates, and Executives

# About Me

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Did PhD in the area Natural Language Processing (Sentiment Analysis)

# Contact



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# Introduction to NLP

# What is NLP?

- Natural Language = Human Language
  - ▣ Can be in the form of text and speech
- Natural Language Processing (NLP)
  - ▣ Subfield of linguistics, computer science, and artificial intelligence
  - ▣ Focusing on **giving computers the ability to understand human language**
  - ▣ Will focus on text for this course

# What is NLP?

## □ Another definition:

- ▣ Application of computational techniques to **analyze** and **synthesize** human language

Converting natural language into an abstract representation to be stored in machine where we can apply algorithms for processing

The diagram consists of two blue rectangular boxes at the bottom. The left box contains the text 'Converting natural language into an abstract representation to be stored in machine where we can apply algorithms for processing'. The right box contains the text 'Machines generate human language'. Two blue lines originate from the top of these boxes and point towards the words 'analyze' and 'synthesize' in the list item above. The line from the left box points to 'analyze', and the line from the right box points to 'synthesize'.

Machines generate human language

# Why NLP?

- Theoretically speaking:
  - ▣ Natural language understanding has been a major goal of AI Research
- Practically speaking:
  - ▣ Many practical applications that we see in our lives



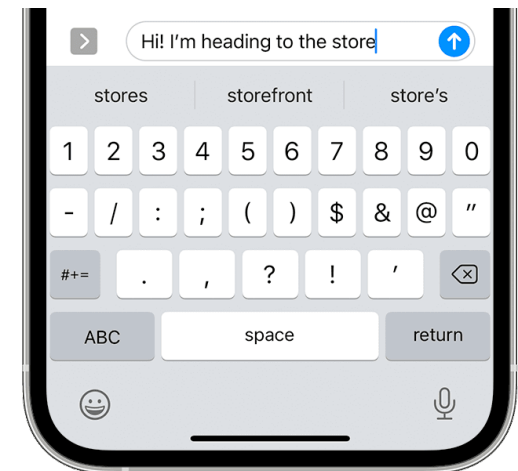
Siri



Google  
Translate



Spelling & Grammar  
Correction



Next/Current  
Word Prediction



# Applications of NLP



And how we achieve these applications from a high-level perspective?

# Applications of NLP

## □ Information Extraction (IE)



### INVOICE

Turnpike Designs  
156 University Ave, Toronto  
ON, Canada M5H 2H7

416-555-1212

BILL TO  
**Jiro Doi**  
1954 Floor Street West  
Toronto, ON, M6P 3K9  
Canada

J\_doi@example.com  
416-555-1212

Invoice Number: 14  
PO./S.O. Number: AD29094  
Invoice Date: 2018-09-25  
Payment Due: Upon receipt

Amount Due (USD): \$2,608.20

Services	Quantity	Price	Amount
<b>Platinum web hosting package</b> Down 35mb, Up 100mb	1	\$65.00	\$65.00
<b>2 page website design</b> Includes basic wireframes, and responsive templates	3	\$2,100.00	\$2,100.00
<b>Mobile designs</b> Includes responsive navigation	1	\$250.00	\$250.00

Subtotal: \$2,145.00

Tax 8%: \$193.20

Total: \$2,608.20

Amount due (CAD): \$2,608.20

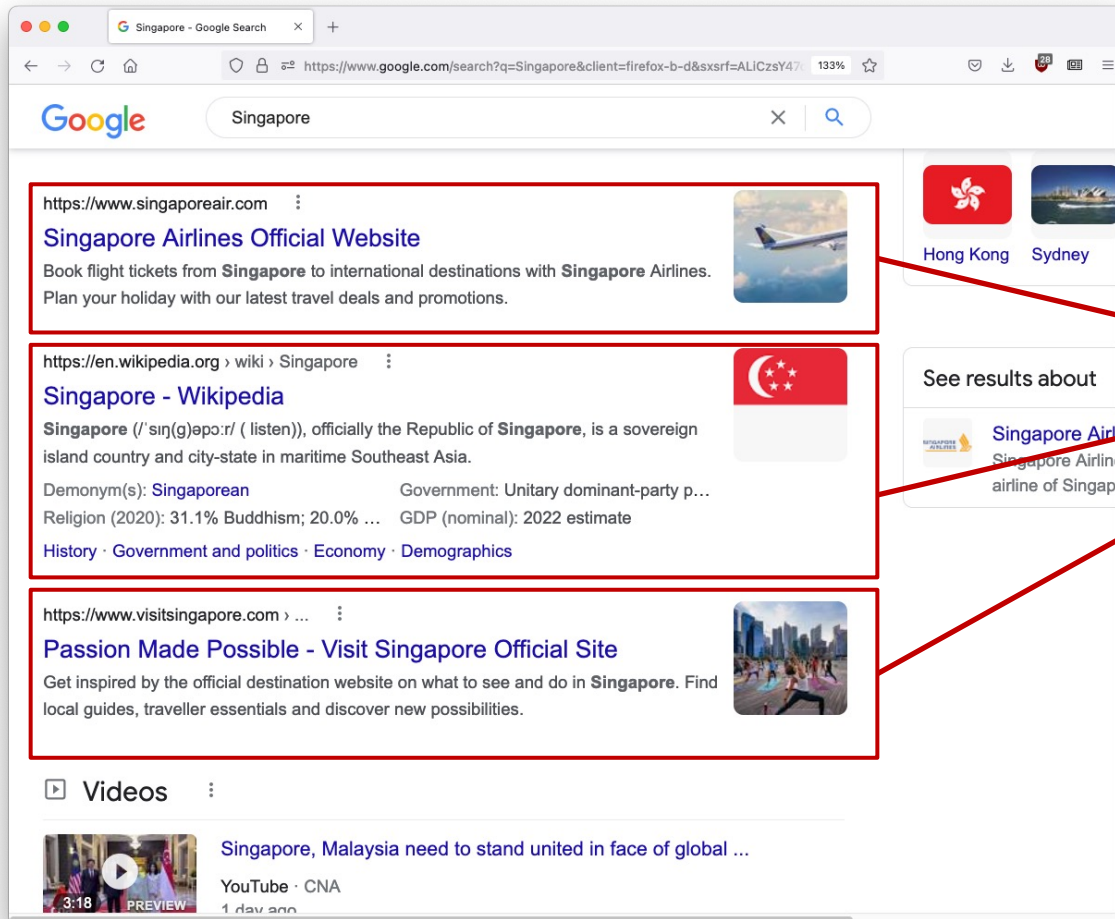
Source: <https://nanonets.com/blog/information-extraction/>

# Applications of NLP

- How do we achieve Information Extraction (IE)?
  - **Rule-based**
    - Learn extraction rules
  - **Classification-based**
    - Use machine learning techniques
    - Treat the IE task as a classification task
    - Assign classes to each token
    - Combine consecutive tokens into entities

# Applications of NLP

## □ Information Retrieval (IR)



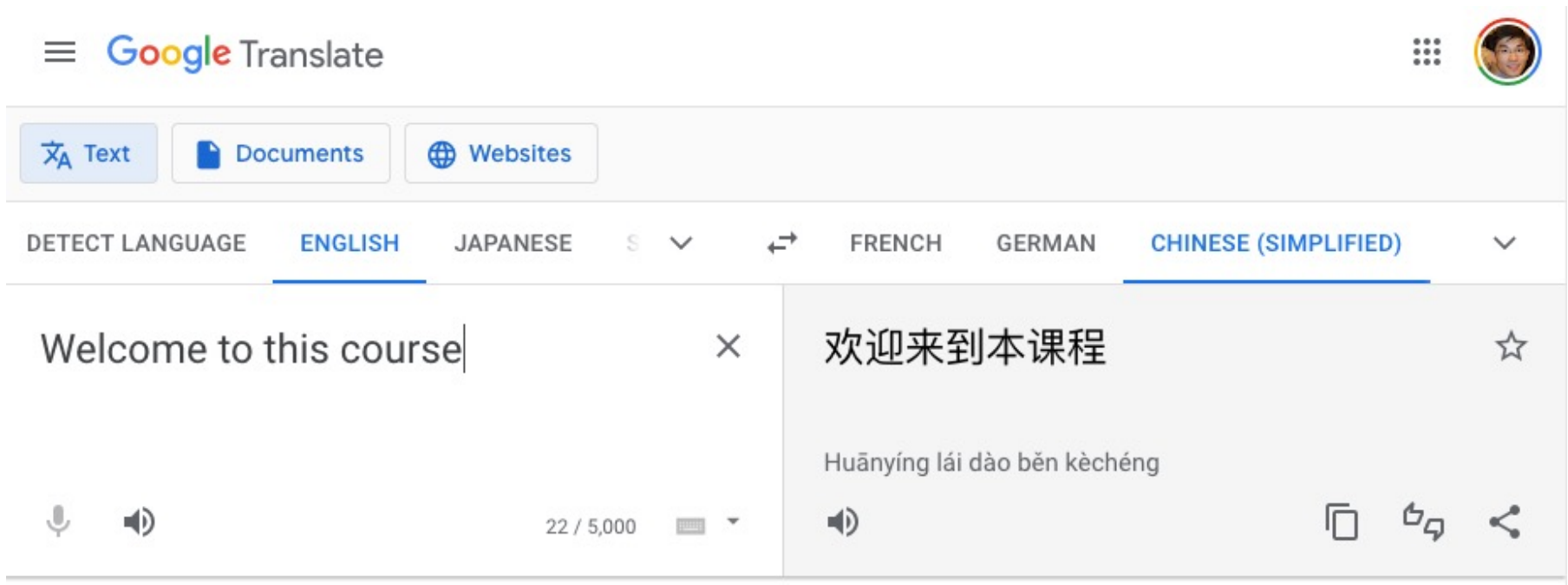
Relevant or Not  
Relevant?

# Applications of NLP

- How do we achieve Information Retrieval (IR)?
  - ▣ **Vector Space Model** Approach
    - Represent documents and query as vectors
    - Calculate the cosine similarity between the vectors
    - Vector of document should be similar to the vector of query
    - Rank the documents based on the similarity value between document and query and choose top n most similar documents

# Applications of NLP

## □ Language Detection & Machine Translation (MT)



# Applications of NLP

- How do we achieve Machine Translation (MT)?
  - **Rule-based**
    - Make use of many linguistic rules and bilingual dictionaries for each language pair
  - **Statistical-based**
    - Make use of multilingual corpora
    - E.g. European parliament minutes are written in all European Union (EU) official languages
    - Does not need to know the grammar

# Applications of NLP

## □ Text Summarization

World

### EU to propose price cap on Russian gas, von der Leyen says



European Commission President Ursula von der Leyen speaks during a news conference on the energy crisis, in Brussels, Belgium, on Sep 7, 2022. (Photo: REUTERS/Johanna Geran)

BRUSSELS: The European Commission will propose a price cap on Russian gas, alongside measures including a mandatory EU cut in electricity use and a ceiling on the revenue of non-gas power generators, the bloc's chief said on Wednesday (Sep 7).

Power and fuel prices have soared as Russia has cut the amount of gas it sends to Europe, with European leaders accusing Moscow of weaponising its energy supplies. Russia has blamed the supply cuts on technical issues and Western sanctions imposed over its invasion of Ukraine.

"We will propose a price cap on Russian gas ... We must cut Russia's revenues which Putin uses to finance this atrocious war in Ukraine," European Commission President Ursula von der Leyen told reporters.

President Vladimir Putin said on Wednesday that Russia will stop supplying gas and oil if price caps are imposed.

Some EU countries - which would need to approve the EU proposals - are wary of a cap on Russian gas prices if it puts at risk the dwindling supply they still receive from Moscow.

07 Sep 2022 11:37PM  
(Updated: 07 Sep 2022 11:40PM)



#### Also worth reading



Malaysia lifts indoor mask mandate, excluding...



Commentary: Shutting down Nord Stream L...

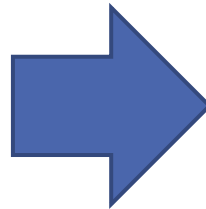


Pheon Chiu Yide seeks court's green light to...



Najib issued cheques totalling RM8.4 million...

The European Commission will propose a price cap on Russian gas, alongside measures including a mandatory EU cut in electricity use and a ceiling on the revenue of non-gas power generators. Power and fuel prices have soared as Russia has cut the amount of gas it sends to Europe. EU energy ministers will discuss emergency plans to lower gas and power prices on Friday. Germany's Energy Minister Ursula von der Leyen said the EU wants to cap the revenue of non-gas fuelled generators and channel "unexpected profits" into measures to support households and businesses.





# Applications of NLP

## □ How do we achieve Text Summarization?

### ▣ **Extractive Text Summarization**

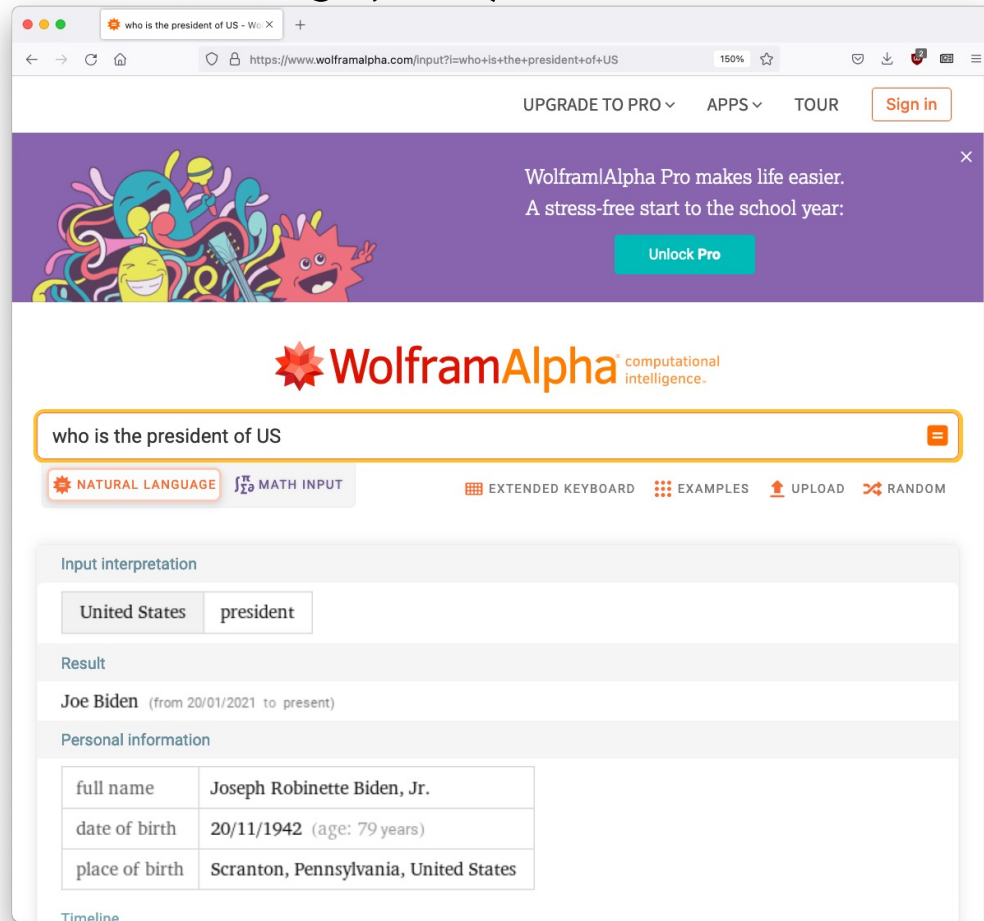
- Identify the significant sentences of text and combine them into a summary

### ▣ **Abstractive Text Summarization**

- Interpret the context and generate new sentences from the original content

# Applications of NLP

## □ Question Answering (QA)



The screenshot displays the WolframAlpha website interface. At the top, there's a navigation bar with links for 'UPGRADE TO PRO', 'APPS', 'TOUR', and a 'Sign in' button. Below this is a purple banner with a colorful, abstract illustration and text promoting 'WolframAlpha Pro' as a stress-free start to the school year, with an 'Unlock Pro' button. The main content area features the WolframAlpha logo and a search bar containing the query 'who is the president of US'. Below the search bar are tabs for 'NATURAL LANGUAGE' (selected) and 'MATH INPUT'. To the right of these tabs are links for 'EXTENDED KEYBOARD', 'EXAMPLES', 'UPLOAD', and 'RANDOM'. The search results are organized into sections: 'Input interpretation' showing 'United States' and 'president'; 'Result' showing 'Joe Biden (from 20/01/2021 to present)'; and 'Personal information' which includes a table with details about Joe Biden.

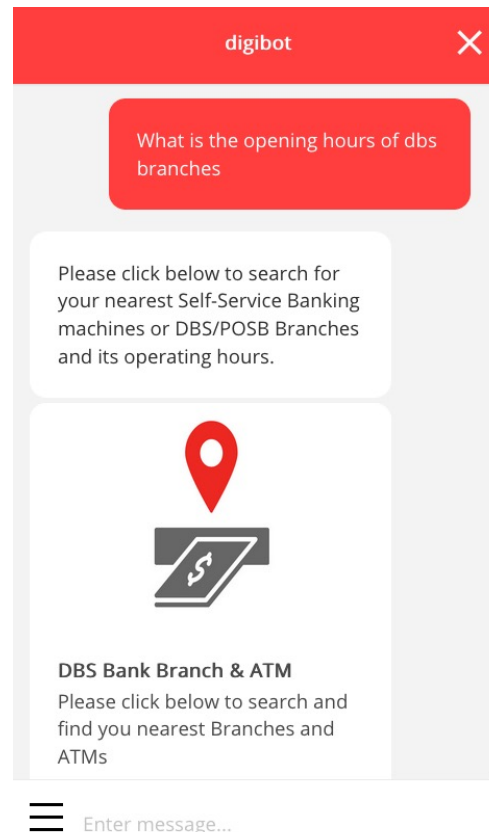
full name	Joseph Robinette Biden, Jr.
date of birth	20/11/1942 (age: 79 years)
place of birth	Scranton, Pennsylvania, United States

# Applications of NLP

- How do we achieve QA?
  - ▣ Consist of many components such as:
    - Question Parser
    - Query Generator
    - Searcher
    - Answer Candidates Extractor
    - Answers Ranker

# Applications of NLP

## □ Conversational Agents (e.g. Chatbots)



# Applications of NLP

- How do we build a chatbot?
- Depends what the chatbot is used for:
  - ▣ If meant to be used for answering questions, essentially it is similar to QA
  - ▣ If meant to be used to maintain a conversation with the user, need to be able to connect **multiple chat messages** and build up **context**
- The major NLP task is **intent classification**
  - ▣ i.e. understanding the intent of an input message

# Applications of NLP

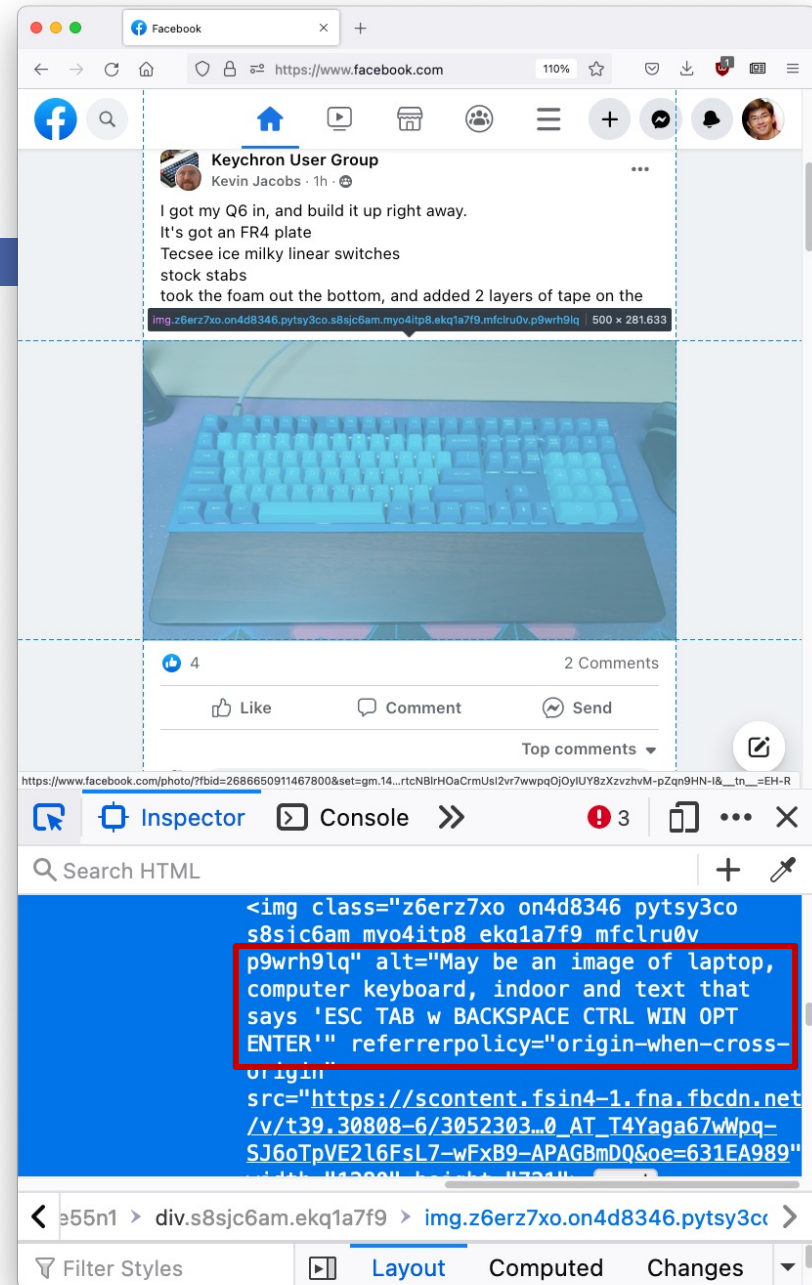
- Document/Text Classification
  - ▣ Spam Detection
  - ▣ Categorizing the topic of a document
  - ▣ Sentiment Analysis

# Applications of NLP

- How do we achieve document/text classification?
  - Need to convert text (which is in unstructured form) into a structured form
    - **Feature Engineering**
    - **Tokenization**
    - **Feature Vector Generation**
  - Apply Machine Learning classification on the **feature vector**
- Will cover this in more detail in the next course (Sentiment Analysis Fundamentals)

# Applications of NLP

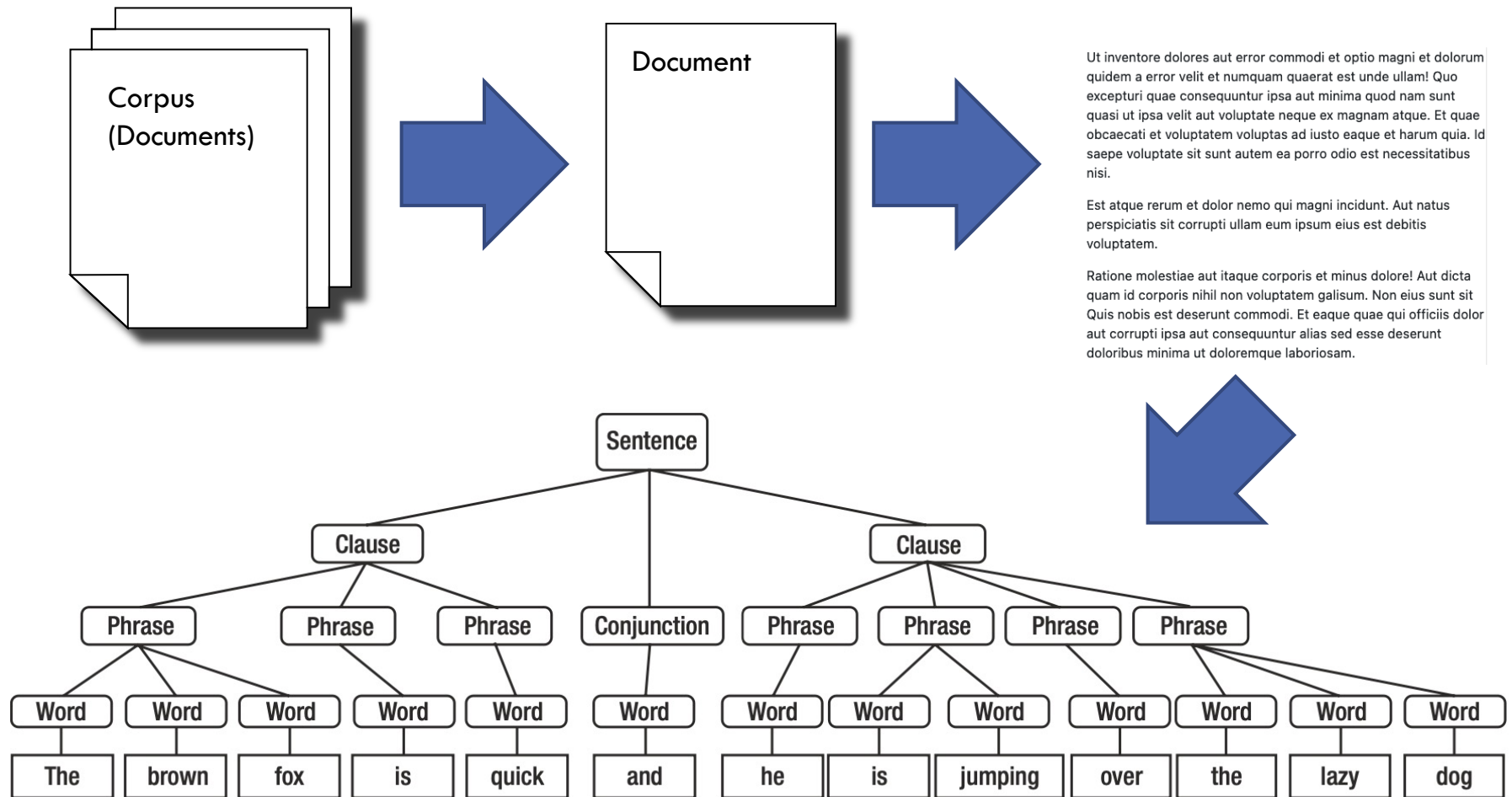
- Image Captioning
  - ▣ Uses both NLP and **Computer Vision** to generate the captions





# Language Processing

# Language Processing



# Types of Analysis

# Types of Analysis

1. **Lexical Analysis**
  - ▣ Understanding the structure & meaning of words
2. **Syntactic Analysis**
  - ▣ Organization of words based on their structure/ordering in the sentence
3. **Semantic Analysis**
  - ▣ Meaning of words, phrases and sentence
4. **Discourse Analysis**
  - ▣ Works with multiple consecutive sentences to interpret things such as pronouns
5. **Pragmatic Analysis**
  - ▣ Understanding and interpretation of language in real-world context

# 1. Lexical Analysis

# Lexical Analysis

- *“Understanding the structure & meaning of words”*
- Core Concepts:
  - ▣ **Sentence Segmentation**
  - ▣ **Tokenization**
  - ▣ **Text Normalization** (e.g. Stemming , Lemmatization)

## 2. Syntactic Analysis

# Syntactic Analysis

- “Organization of words based on their structure/ordering in the sentence”
- Core Concepts:
  - ▣ **Part-of-Speech (POS) Tagging**
  - ▣ **Shallow Parsing (Chunking)**
  - ▣ **Dependency Parsing**



# 3. Semantic Analysis

# Semantic Analysis

- *“Meaning of words, phrases and sentence”*
- Core Concepts:
  - ▣ **Word Sense Disambiguation (WSD)**
  - ▣ **Named Entity Recognition (NER)**
  - ▣ **Semantic Role Labeling (SRL)**

## 4. Discourse Analysis

# Discourse Analysis

- *“Works with multiple consecutive sentences to interpret things such as pronouns”*
- Core Concepts:
  - ▣ **Coreference Resolution**
  - ▣ **Ellipsis Resolution**

# Coreference Resolution

## □ Coreference Resolution

- ▣ Task of identify expressions that refer to the same entity in text
- ▣ Entities can be named entities, noun phrases, pronouns, etc

*"I voted for Nader because he was most aligned with my values," she said.*

The diagram illustrates coreference resolution in the sentence: "I voted for Nader because he was most aligned with my values," she said. Arrows indicate the following coreference relations: an arrow from "I" to "she", an arrow from "Nader" to "he", and an arrow from "my" to "Nader".

# Ellipsis Resolution

## □ Ellipsis Resolution

- ▣ Task of inferring the ellipses using the surrounding context
- ▣ Ellipsis = ... (words appear to be missing)

Lauren can play something, but I don't know what



Lauren can play something, but I don't know what **Lauren can play**

Lauren can play the guitar and Mike can, too



Lauren can play the guitar and Mike can **play the guitar**, too

## 5. Pragmatic Analysis

# Pragmatic Analysis

- *“Understanding and interpretation of language in real-world context”*
- Core Concepts:
  - ▣ **Textual Entailment**
  - ▣ **Intent Classification**



# Textual Entailment

## □ Textual Entailment

- Task of determining the directional relation between text fragments
- Given text  $t$  and hypothesis  $h$ ,  $t$  entails  $h$  ( $t \Rightarrow h$ )
  - A human reading  $t$  would infer that  $h$  is most likely true

$t$ : If you help the needy, God will reward you

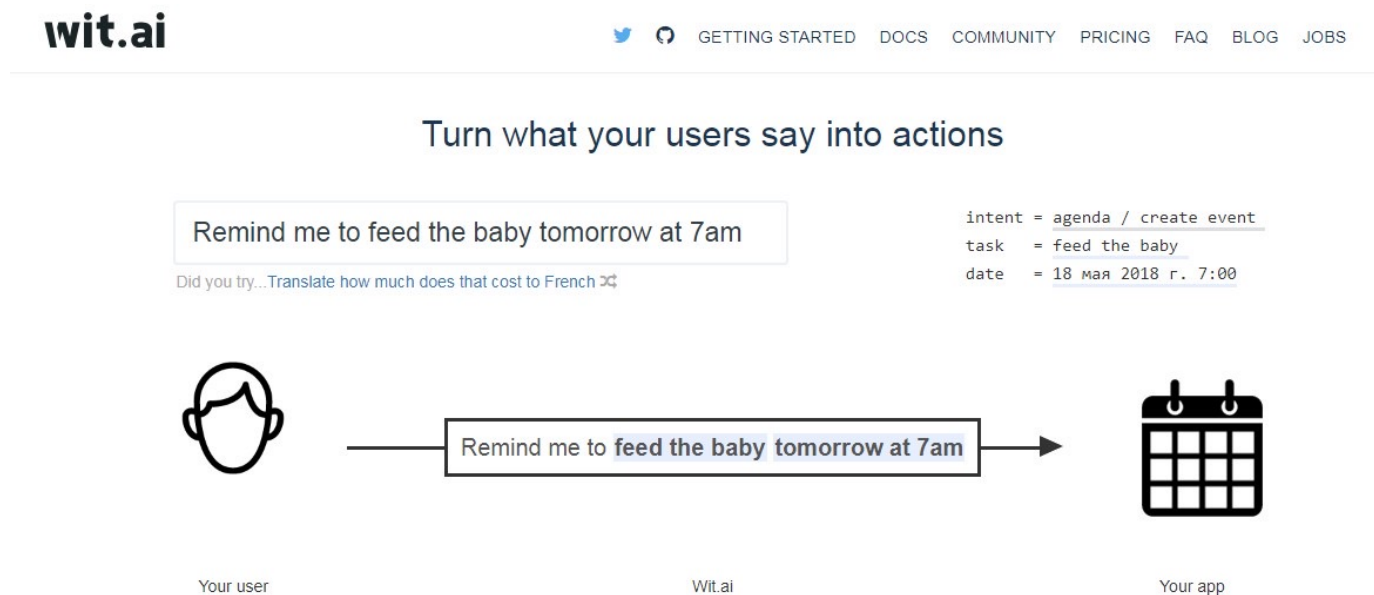
$\Rightarrow$

$h$ : Giving money to a poor man has good consequences

# Intent Recognition

## □ Intent Classification

- ▣ Task of determining the intent of the written/spoken input
- ▣ Recall: this is a major task in chatbots



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## INTRODUCTION