



# Natural Language Processing (NLP)





- Relationships may hold between phrases and parts of their discourse contexts, including:
- **Identical entities.** Consider the text:
  - Bill had a red balloon.
  - John wanted it.
  - The word "it" should be identified as referring to red balloon.
    This type of references are called anaphora.





- **Parts of entities.** Consider the text:
  - Rahul opened the book he just bought.
  - The **title page** was torn.
  - The phrase "title page" should be recognized as part of the book that was just bought.



- **X** Parts of actions. Consider the text:
  - +Sunil went on a business trip to New York.
  - +He left on an early morning flight.
  - + Taking a flight should be recognized as part of going on a trip.





- **Entities involved in actions**. Consider the text:
  - **They** took the TV and the stereo.
  - ❖My house was broken into last week.

The pronoun "they" should be recognized as referring to the burglars who broke into the house.





- **Elements of sets.** Consider the text:
  - +The designs on the shirts, we have in stock are stars, the moon, item and a flag.
  - +I'll take two moons.
  - +Moons means shirts having moon design.





- **★** Names of individuals:
  - +Dave went to the movies.
- **X** Causal chains
  - +There was a big snow storm yesterday.
  - +The schools were closed today.





- **★** Planning sequences:
  - +Sally wanted a new car
  - +She decided to get a job.
- **★** Implicit presuppositions (take for granted):
  - +Did Mack fail IT980?





- We focus on using following kinds of knowledge:
  - The current focus of the dialogue
  - A model of each participant's current beliefs
  - The goal-driven character of dialogue
  - The rules of conversation shared by all participants.

### **Text Mining**



- Unstructured text is present in various forms, and in huge and ever increasing quantities:
  - books,
  - financial and other business reports,
  - various kinds of business and administrative documents,
  - news articles,
  - blog posts,
  - wiki,
  - messages/posts on social networking and social media sites,
- It is estimated that ~80% of all the available data are unstructured data

# **Text Mining (TM)**





- The use of supervised machine learning (ML) methods for TM is often very expensive
  - This is caused by the need to prepare high number of annotated documents to be used as the training dataset
  - Such a training set is essential for, e.g., document classification or extraction of entities, relations and events from text
- **High-dimension of the attribute space:** 
  - Documents are often described with numerous attributes, which further impedes (hinders) the application of ML methods
  - Most often, attributes are either all terms or a selection of terms and/or phrases from the collection of documents to be analyzed



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#### **Bag Of Words Representation Of Text**

- Considers text a simple set/bag of words
- Based on the following (unrealistic) assumptions:





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#### **Bag Of Words Representation Of Text**

- Considers text a simple set/bag of words
- Based on the following (unrealistic) assumptions:
  - words are mutually independent,
  - word order in text is irrelevant
- But, highly effective, and is often used in TM





- BOW extracts features from text documents.
- These features can be used for training machine learning algorithms.
- It creates a vocabulary of unique words occurring in all the documents in the training set.
- it's a collection of words to represent a sentence with word count and mostly disregarding the order in which they appear.

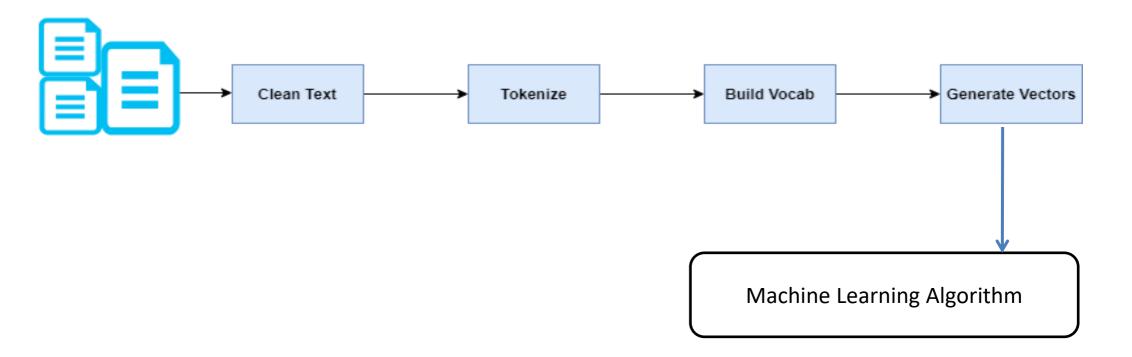




BOW is an approach widely used with:

- Natural language processing
- Information retrieval from documents
- Document classifications









Consider the below two sentences.

- 1. "John likes to watch movies. Mary likes movies too."
- 2. "John also likes to watch football games."





These two sentences can be also represented with a collection of words.

- 1. ['John', 'likes', 'to', 'watch', 'movies.', 'Mary', 'likes', 'movies', 'too.']
- 2. ['John', 'also', 'likes', 'to', 'watch', 'football', 'games']



Remove multiple occurrences and use the word count.

```
 {"John":1,"likes":2,"to":1,"watch":1,"movies":2,"Mary"
 :1,"too":1}
```

```
2. {"John":1,"also":1,"likes":1,"to":1,"watch":1,"football":1, "games":1}
```





> Tabular form for all documents

Words	Frequencies
John	2
Likes	3
То	2
Watch	2
Movies	2
Mary	1
Тоо	1
also	1
Football	1
games	1





Create a vector whose length is equals to total length of vocabulary

"John likes to watch movies. Mary likes movies too"

[1, 2, 1, 1, 2, 1, 1, 0, 0, 0]

"John also likes to watch football games"

Words	Frequencies
John	2
Likes	3
То	2
Watch	2
Movies	2
Mary	1
Тоо	1
also	1
Football	1
games	1





Which is incorrect entry? For given sentences

"The black cat is happy"

"The black cat and dog are friends"

A.Rows 1, 2, 7

B.Rows 1,2,3,4

C.Rows1,2,5,6

D.All of these

Words	Frequencies
The	2
black	3
То	1
cat	2
is	1
happy	1
dog	1
are	1
friends	1
games	1





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