

# Lecture 10

- NLP is all about words, their arrangement and their meaning*
- NLP is a branch of AI that tries to emulate/understand the way a human speaks to another human*
- Lecture 10 is about N-gram features for text classification



# N-gram

- Sequence of N-tokens,  $N=1,2,\dots$
- Concept of a phrase containing N tokens or words
- Example of unigram (or 1-gram): “Operating”
- Example of bigram: “Operating system” “Operating theater”
- Example of trigram: “Natural Language Processing”
- Some researchers use mix of unigram, bigram and trigram for their text classification projects (concatenation)



# Example of bigram extraction

- Text doc 1: She sells sea shells on the sea shore
- Bigrams: (7 unique bigrams – arrange along the columns (BoW))
- she sells sea shells on the sea shore
- she sells sea shells on the sea shore
- she sells sea shells on the sea shore
- she sells sea shells on the sea shore
- she sells sea shells on the sea shore
- she sells sea shells on the sea shore
- she sells sea shells on the sea shore

BoW\_features= [ 1 1 1 1 1 1 1 ]  
(One-hot)



# Order of bigram features (feature columns)

- she sells
- sells sea
- sea shells
- shells on
- on the
- the sea
- sea shore



# Example of bigram extraction

- Text doc 2: On the sea shore, she sells.
- Bigrams:
  - on the sea shore she sells
  - on the sea shore she sells
  - on the sea shore she sells
  - on the sea shore she sells
  - on the sea shore she sells



# Order of 7 bigram features (feature columns)

- she sells 1
- sells sea
- sea shells
- shells on
- on the 1
- the sea 1
- sea shore 1



# Example of bigram extraction

- Text doc 2: On the sea shore, she sells.
- Bigrams:
  - on the sea shore she sells
  - on the sea shore she sells
  - on the sea shore she sells
  - on the sea shore she sells [shore she is not a known bigram –so?]
  - on the sea shore she sells

BoW\_features= [ 1 0 0 0 1 1 1]  
(One-hot)



# When you encounter unknown bigrams.....

- Two options:
  - 1) Add the new bigram in the feature list (8 bigram features for all documents)
  - 2) Note that above action is possible only while training (After all training documents are processed and feature vectors are extracted, the order of features is freezed)
  - 3) Create a feature column for <UNK> unknown bigrams that occur in the test document





# Supervised learning (Training, Testing phases)

**Training :** feature matrix ; target column vector  $[1,1,...,2,2]^T$



([.....]<sup>T</sup> : Transpose of a vector (since it is vertically arranged))

**Testing:** Test doc → Test feature vector (same feature columns as in training) → Trained **Classifier** model → Class label of Test doc

Ex – Sentiment Analysis project where Class 1 is positive sentiment and Class 2 is negative sentiment

Ex – NER project where Class 1 is Delhi and Class 2 is Trump

