

# QA Session

(SNLP tutorial)

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21st July 2021

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  - ▶  $S$  is a sequence of length 25

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- Flip-Flop for clustering (???)

# Conditional Random Fields

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- Suppose you have a sequence of length  $M$  and tagset of size  $T$ , what would be the complexity of the normalization factor  $Z(x)$  in this case?

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- Exercise 12 from 2020 exam

## Naive Bayes - Code

```
for each class  $c \in C$                                 # Calculate  $P(c)$  terms
     $N_{doc}$  = number of documents in D
     $N_c$  = number of documents from D in class c
     $logprior[c] \leftarrow \log \frac{N_c}{N_{doc}}$ 
     $V \leftarrow$  vocabulary of D
     $bigdoc[c] \leftarrow$  append(d) for  $d \in D$  with class c
    for each word  $w$  in  $V$                                 # Calculate  $P(w|c)$  terms
         $count(w, c) \leftarrow$  # of occurrences of  $w$  in  $bigdoc[c]$ 
         $loglikelihood[w, c] \leftarrow \log \frac{count(w, c) + 1}{\sum_{w' \text{ in } V} (count(w', c) + 1)}$ 
return  $logprior, loglikelihood, V$ 
```



# Naïve Bayes

- Algorithm: Continuous-valued Features
  - Numberless values for a feature
  - Conditional probability often modeled with the normal distribution

$$\hat{P}(X_j | C = c_i) = \frac{1}{\sqrt{2\pi}\sigma_{ji}} \exp\left(-\frac{(X_j - \mu_{ji})^2}{2\sigma_{ji}^2}\right)$$

$\mu_{ji}$  : mean (average) of feature values  $X_j$  of examples for which  $C = c_i$

$\sigma_{ji}$  : standard deviation of feature values  $X_j$  of examples for which  $C = c_i$

- Learning Phase:** for  $\mathbf{X} = (X_1, \dots, X_n)$ ,  $C = c_1, \dots, c_L$   
 Output:  $n \times L$  normal distributions and  $P(C = c_i) \quad i = 1, \dots, L$
- Test Phase:** Given an unknown instance  $\mathbf{X}' = (a'_1, \dots, a'_n)$ 
  - Instead of looking-up tables, calculate conditional probabilities with all the normal distributions achieved in the learning phase
  - Apply the MAP rule to make a decision

# Significance Testing

- How to use Chi-Square?

# Resources

- [https://miro.medium.com/max/1400/1\\*neaBooRXSloZAz6A2XfHJA.png](https://miro.medium.com/max/1400/1*neaBooRXSloZAz6A2XfHJA.png)
- <https://image.slidesharecdn.com/naive-bayes-150514165844-lva1-app6891/95/naive-bayes-15-638.jpg?cb=1431622795>