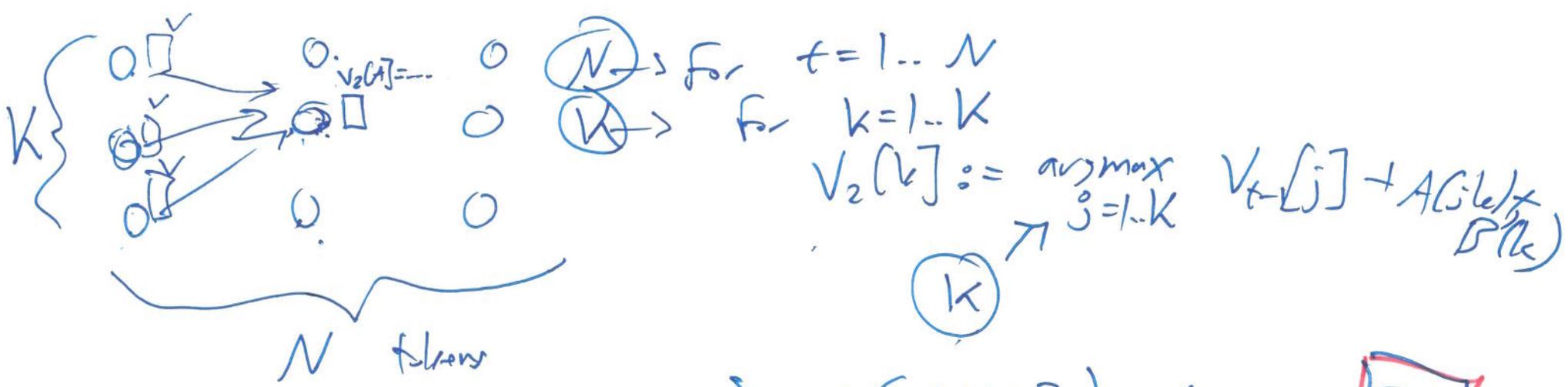


# Midterm Review Session

10/24/17

UMass CS 585

Questions from practice midterm questions



$\Rightarrow O(NK^2)$  time 2.1

⑥  $O(NK)$  vs  ~~$K$~~

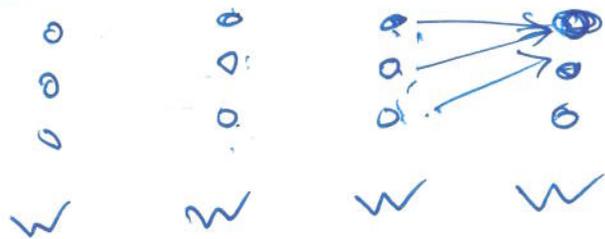
$B_1(A_i)$   $B_2(A_i)$  ...  $B_N(A)$ 
  
 $B_1(N_{in})$   $B_2(N_{in})$  ...  $B_N(N_{in})$

⑦ Enumeration:  $O(K^N)$

$\underbrace{K}_{\text{pos}}$ 
  
 $\underbrace{K}_{\text{le}}$ 
  
 $\underbrace{K}_{\text{le}}$ 
  
 $\underbrace{K}_{\text{le}}$ 
  
 $\underbrace{K}_{\text{le}}$

Decoder Runtime

# Viterbi = Why optimal?



$$\max_{\vec{y}} P(y_1, y_2, y_3, y_4 | \vec{w})$$

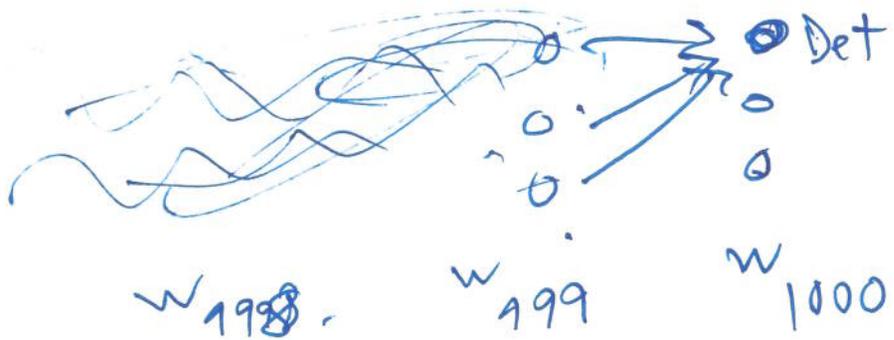
$$\max_{y_1, y_2, y_3} \max_{y_4} P(y_1, y_2, y_3, y_4 | \vec{w})$$

$$G(\vec{y}) = A(y_1, y_2) + A(y_2, y_3) + A(y_3, y_4) \quad \neq \cancel{B(y_1)} + \cancel{B(y_2)} + \cancel{B(y_3)} + \cancel{B(y_4)}$$

Given

~~$$(y_1^*, y_2^*) = \arg \max_{(y_1, y_2)} A(y_1, y_2)$$~~

$$y_3, y_4 = \arg \max_{y_3, y_4} A(y_1^*, y_2^*) + A(y_2^*, y_3) + A(y_3, y_4)$$



Why is Viterbi optimal?  
Attempt #2

Best  $\vec{y}$ , where  $y_{1000} = \text{Det}$  ?

$$V_{1000} [N_{\text{em}}] = \dots$$

$$V_{1000} [A_{d_i}] = \dots$$

$$\max_{y_1 \dots y_{999}} G(y_1, \dots, y_{999}, y_{1000} = \text{Det}) = V_{1000} [\text{Det}]$$

$$\dots A(y_{998}, y_{999}) + \dots B_{999}(y_{999}) + A(y_{999}, y_{1000} = \text{Det}) + B_{1000}(\text{Det})$$

$$= \max_{y_1 \dots y_{998}} \max_{y_{999}} G(\vec{y})$$

$$= \max_{y_1 \dots y_{998}} \left[ A(y_1, y_2) + \dots + A(y_{997}, y_{998}) + \left( \max_{y_{999}} A(y_{999}, y_{1000} = \text{Det}) + B_{1000} \right) \right]$$

$y_1^* = \text{Det}$     $y_2^* = \text{Adj}$     $y_3^* = ?$

the happy dog

# Greedy vs. Viterbi

$y_3 = \text{Noun} \Rightarrow A(\text{Adj}, \text{Noun}) + B_3(\text{Noun})$   
 $y_3 = \text{Det} \Rightarrow A(\text{Adj}, \text{Det}) + B_3(\text{Det})$

argmax  
k ∈ 1..K

N? (V?) Proton

Attack him

Viterbi: optimal

(P/O)

$$f_{\text{vit}}(\vec{x}) \Rightarrow \vec{y}^*$$

$$\vec{y}^* = \underset{\vec{y}}{\text{argmax}} G(\vec{y})$$

(N) ~~(V)~~  
Attack

(V)  
was

(con) of Viterbi?

parse?	Vit time = $NK^2$	Vit Space = $NK$
	Greedy time = $NK$	Greedy Space = $N+K$

$$P(w_0 = \text{START}, w_1 = A, w_2 = B, w_3 = B, w_4 = \text{END})$$

# N-Gram LM

$$= P(A | \text{START}) P(B | A) P(B | B) P(\text{END} | B) \quad \leftarrow \text{Model Assump.}$$

$$= \frac{\#(\text{START}, A)}{\#(\text{START})} \frac{\#(A, B)}{\#(A)} \frac{\#(B, B)}{\#(B)} \dots$$

$$= \left(\frac{1}{1}\right) \left(\frac{1}{2}\right) \left(\frac{0}{2}\right) \left(\frac{1}{1}\right)$$

$$= 0$$

③ Pseudo counts

$$= \left(\frac{1+\alpha}{1+\alpha V}\right) \left(\frac{1+\alpha}{2+\alpha V}\right) \left(\frac{0+\alpha}{2+\alpha V}\right) \left(\frac{0+\alpha}{2+\alpha V}\right) \quad V=4$$

$V = \{A, B, C, \text{END}\}$

