# Lecture 24

-Hidden Markov Model (HMM)

#### **HMM**

- HMM: Hidden Markov Model
- Hidden states q (POS) and observed states o (output/words)
- o<sub>1</sub>,o<sub>2</sub>,....o<sub>T</sub> constitute the output sentence
- q<sub>1</sub>,q<sub>2</sub>,....q<sub>T</sub> constitute the hidden states at the back-end that produce the output sentence
- Transition probabilities (between hidden states)
- Output probabilities (for each output)
- Task: there are different candidate output sentences (eg. Chatbot application) and you have to find the best sentence of all. The sentence with the maximum probability wins

# HMM probability calculations

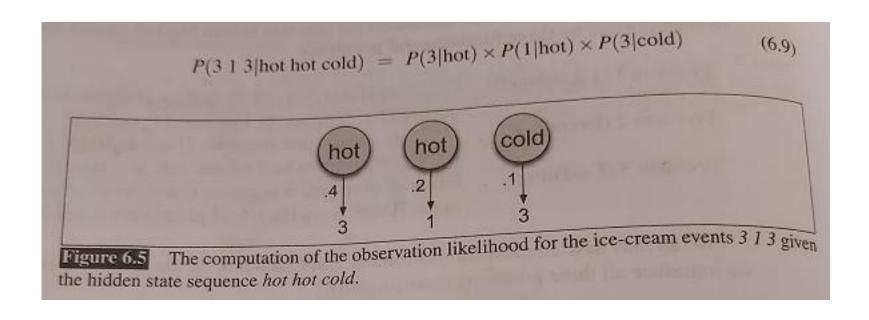
Joint probability

$$P(O,Q) = P(O|Q) \times P(Q) = \prod_{i=1}^{n} P(o_i|q_i) \times \prod_{i=1}^{n} P(q_i|q_{i-1})$$

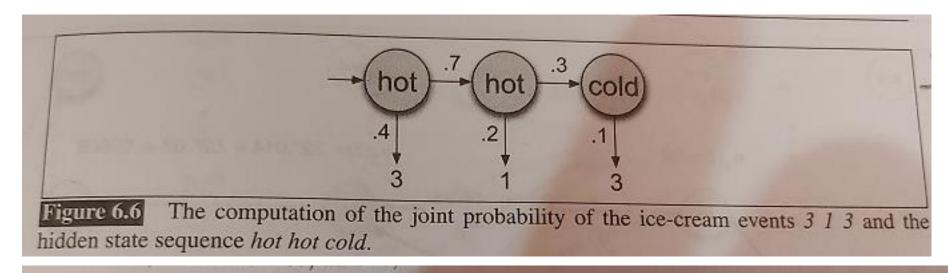
Probability of the output sentence

$$P(O) = \sum_{Q} P(O,Q) = \sum_{Q} P(O|Q)P(Q)$$

### Demo 1

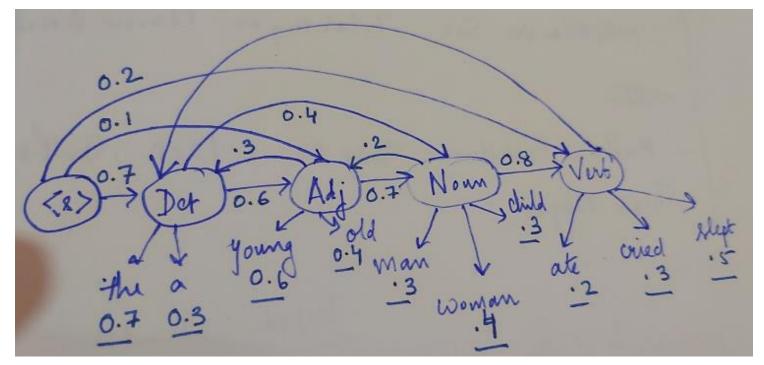


### Demo 2



 $P(3 \ 1 \ 3) = P(3 \ 1 \ 3, \text{cold cold cold}) + P(3 \ 1 \ 3, \text{cold cold hot}) + P(3 \ 1 \ 3, \text{hot hot cold}) + \dots$ 

## Assignment



• Find the best output sentence: O: the old woman ate /the young child slept

Q: <s>Det Adj Noun Verb