# CS6320, Spring 2019 Dr. Mithun Balakrishna Homework 3 Due Sunday, March 10<sup>th</sup>, 2019 11:59pm

#### A. Submission Instructions:

- Submit your solutions via eLearning.
- Please submit a single zip file containing **ALL** the relevant homework solution files. The zip filename should follow the pattern "HW#\_FirstnameLastname.zip" (Example: HW3\_Claire Underwood.zip)
  - o **Penalty of 5 points** if not followed
- For all non-programming questions:
  - o Please include **ALL** the solutions in a **single** PDF/Doc/PS/Image file
  - The filename should follow the pattern "HW#\_FirstnameLastname.FileExtension" (Example: HW3\_Claire Underwood.pdf)
  - o **Penalty of 5 points** if not followed
- For programming questions:
  - Write the programming solutions in C/C++, Java, or Python. For using any other programming language, please get prior approval from the TA.
  - Include a Readme file with instructions on how to build and run your programming question solution
    - Instructions should be very simple:
      - python bigram.py input\_arguments

OR

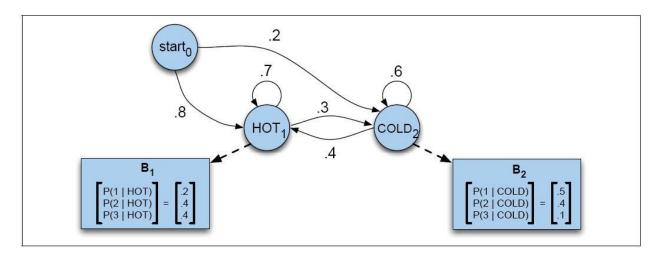
python bigram.py (if the input arguments are hard coded)

- Hard coding the input arguments to your program is fine unless the TA cannot run your code directly. Do NOT include instructions such as: "Please modify the path in my main function. Then copy the training data in the same folder."
- Provide your training data together unless the dataset is too large.
- Penalty of 10 points if not followed
- Submit ALL your source code files
  - Do not write your solutions in the readme file
  - Penalty of 10 points if not followed
- Late Submission Penalty:
  - o up to 2 hours late 10% deduction
  - o 2 4 hours late 20% deduction
  - o 4 12 hours late 35% deduction
  - o 12 24 hours late 50% deduction
  - o 24 48 hours late 75% deduction
  - o more than 48 hours late 100% deduction (zero credit)

#### **B. Problems:**

### 1. HMM Decoding: Viterbi Algorithm (75 points):

For the HMM shown below, please perform the following:



- a. (25 points) Manually build the Viterbi trellis to compute the most likely weather sequences for each of the two observation sequences, 331122313 and 331123312.
- b. **(50 points)** Programmatically implement the Viterbi algorithm to compute the most likely weather sequence and probability for any given observation sequence. Example observation sequences: *331*, *122313*, *331123312*, etc.

## 2. Maximum Entropy Modeling (25 points):

Consider the following Maximum Entropy features and weights:

$$f_1(c, x) = \begin{cases} 1 \text{ if } word_i = \text{"race" & } c = NN \\ 0 \text{ otherwise} \end{cases}$$

$$f_2(c,x) = \begin{cases} 1 \text{ if } t_{i-1} = \text{ TO } c = \text{VB} \\ 0 \text{ otherwise} \end{cases}$$

$$f_3(c,x) = \begin{cases} 1 \text{ if } t_{i-1} = \text{ DT } c = \text{NN} \\ 0 \text{ otherwise} \end{cases}$$

$$f_4(c, x) = \begin{cases} 1 \text{ if is\_lower\_c ase}(word_i) = \text{"race" & } c = VB \\ 0 \text{ otherwise} \end{cases}$$

$$f_5(c, x) = \begin{cases} 1 \text{ if } word_i = \text{"race" } \& c = \text{VB} \\ 0 \text{ otherwise} \end{cases}$$

$$f_6(c, x) = \begin{cases} 1 \text{ if } t_{i-1} = \text{TO & } c = \text{NN} \\ 0 \text{ otherwise} \end{cases}$$

		Weights					
		f1	f2	f3	f4	f5	f6
Tags	VB	0	0.75	0	0.10	0.15	0
	NN	0.3	0	0.9	0	0	-0.2

Compute the best tag for the word "race" in the following sentences:

- a. Secretariat/NNP is/VBZ expected/VBN to/TO race/?? tomorrow/NN
- b. the/DT race/?? for/IN outer/JJ space/NN