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## CS 585 Spring 2024 Written Assignment #02

Due: Sunday, February 11, 2024, 11:59 PM CST

Points: 30

### Objectives:

1. (10 points) Demonstrate your understanding of Minimum Edit Distance algorithm.
2. (10 points) Demonstrate your understanding of the N-gram language modeling.
3. (10 points) Demonstrate your understanding of an HMM POS tagger.

### Problem 1 [10 pts]

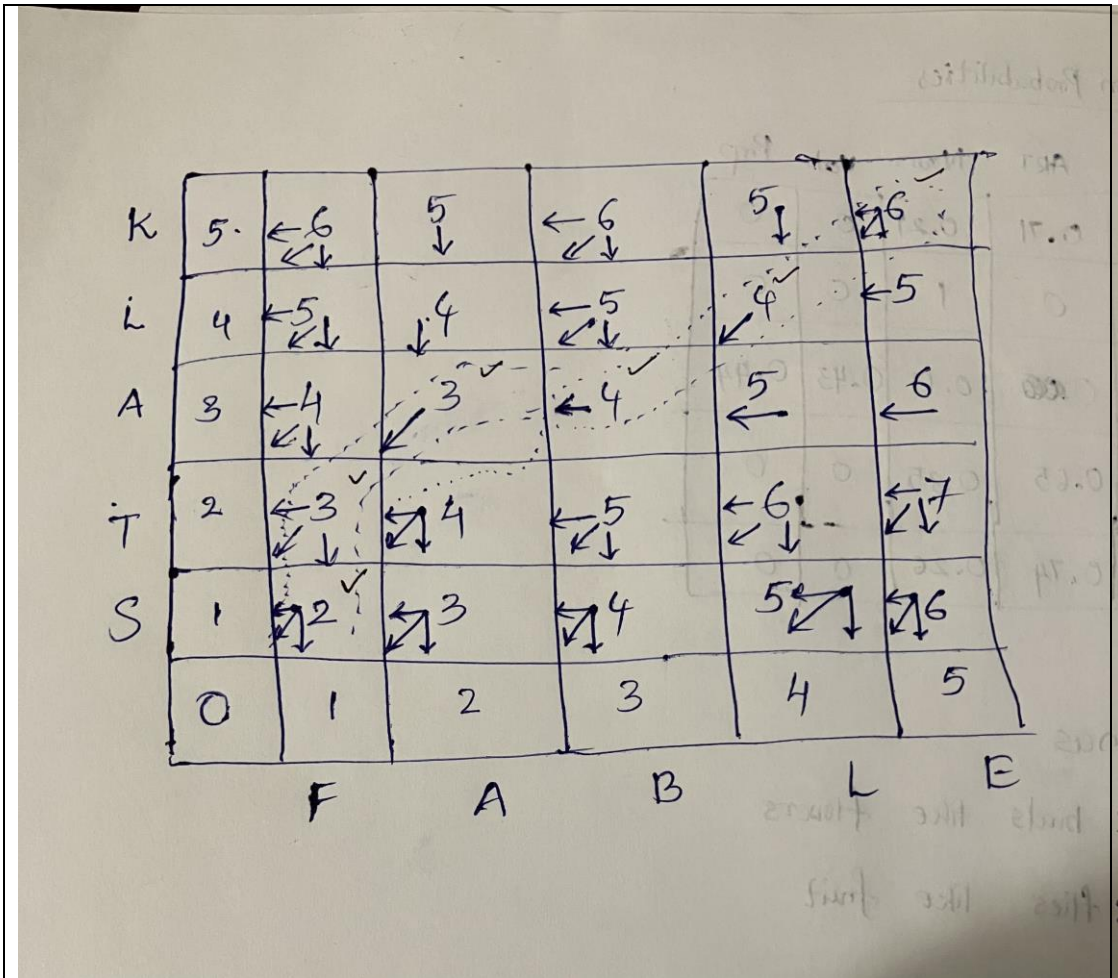
What is the **Minimum Edit Distance** between words STALK and FABLE (assume that insertion / deletion cost is 1, substitution cost is 2)? Populate the table below to find the MED. Include back pointers.

|   |   |   |   |   |   |   |
|---|---|---|---|---|---|---|
| K |   |   |   |   |   |   |
| L |   |   |   |   |   |   |
| A |   |   |   |   |   |   |
| T |   |   |   |   |   |   |
| S |   |   |   |   |   |   |
| # |   |   |   |   |   |   |
|   | # | F | A | B | L | E |

Solution:

|   |   |   |   |   |   |   |
|---|---|---|---|---|---|---|
| K | 5 | 6 | 5 | 6 | 5 | 6 |
| L | 4 | 5 | 4 | 5 | 4 | 5 |
| A | 3 | 4 | 3 | 4 | 5 | 6 |
| T | 2 | 3 | 4 | 5 | 6 | 7 |
| S | 1 | 2 | 3 | 4 | 5 | 6 |
| # | 0 | 1 | 2 | 3 | 4 | 5 |
|   | # | F | A | B | L | E |

**Minimum Edit Distance:**



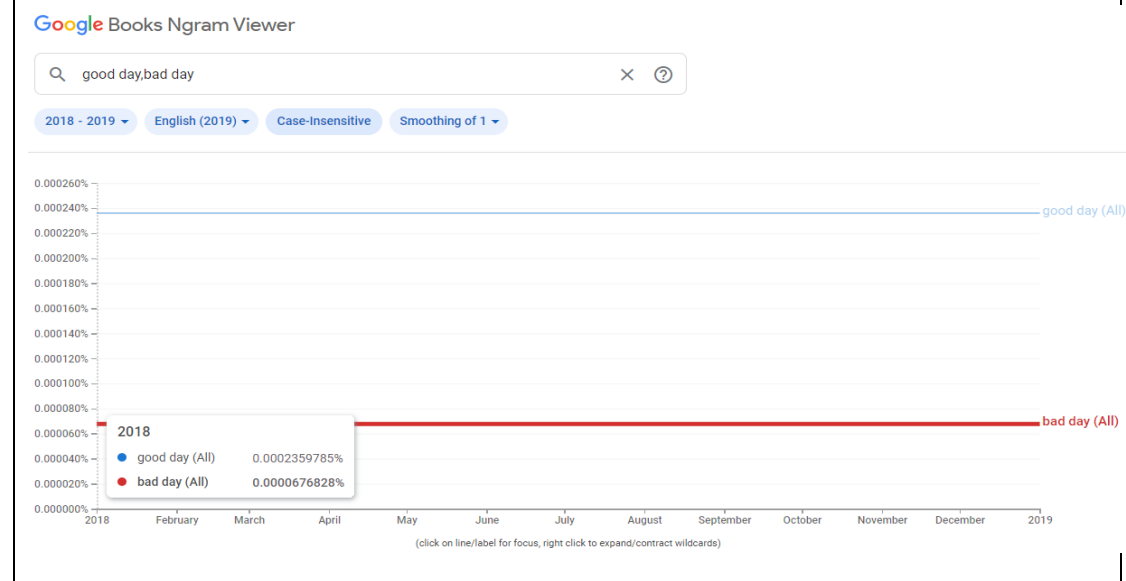
Minimum Edit Distance = 6

## Problem 2 [10 pts]

Your task is to calculate probabilities of selected sentences in English using a language model (based on Google Books N-gram corpus). Use the Google N-Gram Viewer website (<https://books.google.com/ngrams>) to collect all necessary data (NOTE: Google provides N-gram **PERCENTAGES** – those are **NOT COUNTS!** and not exactly **probabilities!**) and calculate sentence probability.

### NOTES:

- assume that probability of a any bigram starting or ending a sentence is 0.25.
- use the settings shown below (2018 probabilities, English (2019), case insensitive, Smoothing of 1)



A) [5 pts] Probability of a sentence:

*Today is a good day*

### Relevant bigram **probabilities** [1 pt]:

(<s>, today) – 0.25  
 (Today, is) –  $0.00039373768/100 = 0.399376 \cdot 10^{-5}$   
 (is, a) –  $0.0562696642/100 = 0.005626 = 0.562696642 \cdot 10^{-5}$   
 (a, good) –  $0.013680092/100 = 13.6860092 \cdot 10^{-5}$   
 (Good, day) –  $0.0002368249/100 = 0.2368249 \cdot 10^{-5}$   
 (day, </s>) – 0.25

### Probability of a sentence formula [2 pt]:

$$P(<s>, \text{Today}) * P(\text{Today}, \text{is}) * P(\text{is}, a) * P(a, \text{good}) * P(\text{Good}, \text{day}) * P(\text{day}, </s>)$$

**Probability of a sentence (calculations and value) [2 pt]:**

$$(250 * 0.3993768 * 56.2696642 * 13.6860092 * 0.2368249 * 250) * 10^{-5} = 4.552 * 10^{-5}$$

B) [5 pts] Probability of a sentence:

*Today is a bad day*

**Relevant bigram probabilities [1 pt]:**

$(<s>, \text{Today}) = 0.25$   
 $(\text{today}, \text{is}) = 0.3993768 * 10^{-5}$   
 $(\text{is}, a) = 56.2696642 * 10^{-5}$   
 $(a, \text{bad}) = 1.963926 * 10^{-5}$   
 $(\text{bad}, \text{day}) = 0.0680989 * 10^{-5}$   
 $(\text{day}, </s>) = 0.25$

**Probability of a sentence formula [2 pt]:**

$$P(<s>, \text{Today}) * P(\text{Today}, \text{is}) * P(\text{is}, a) * P(a, \text{bad}) * P(\text{bad}, \text{day}) * P(\text{day}, </s>)$$

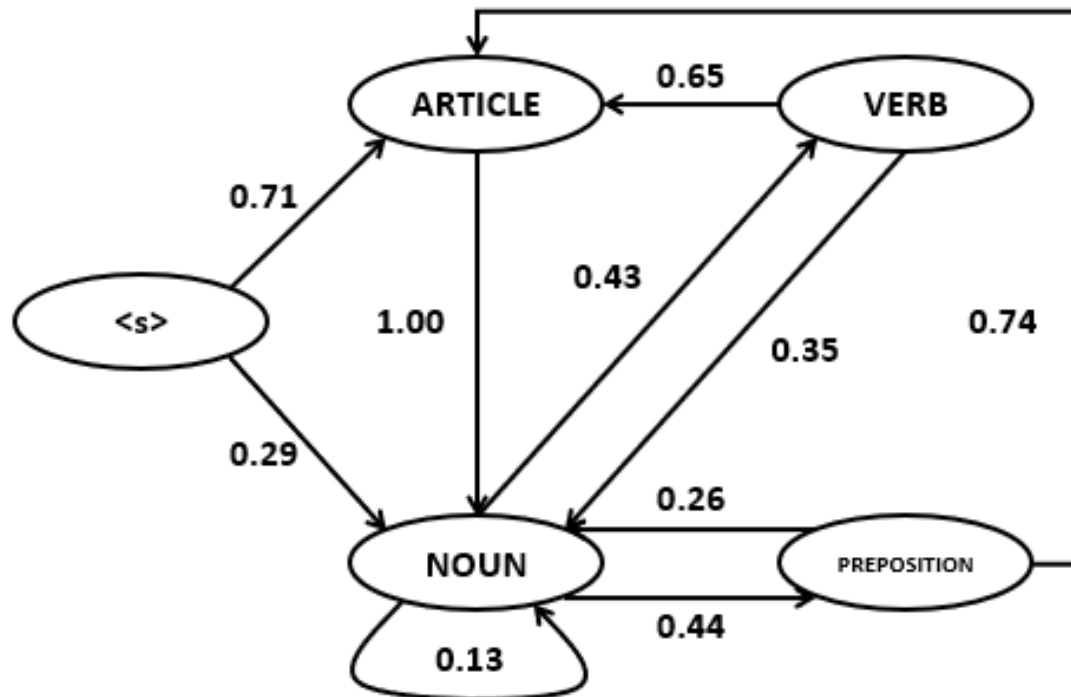
**Probability of a sentence (calculations and value) [2 pt]:**

$$(250 * 0.3993768 * 56.2696642 * 1.963926 * 0.0680989 * 250) * 10^{-5}$$

**= 0.188 \* 10<sup>-5</sup>**

### Problem 3 [10 pts]

Given the following Hidden Markov model (transition probabilities shown; emission probabilities to be determined by you using corpus C data) based on corpus C:



And the following table of selected word counts from some corpus C:

| Word/Tag       | N   | V   | ART | P   | TOTAL |
|----------------|-----|-----|-----|-----|-------|
| <i>flies</i>   | 21  | 23  | 0   | 0   | 44    |
| <i>fruit</i>   | 49  | 5   | 1   | 0   | 55    |
| <i>like</i>    | 10  | 30  | 0   | 21  | 61    |
| <i>a</i>       | 1   | 0   | 201 | 0   | 202   |
| <i>the</i>     | 1   | 0   | 300 | 2   | 303   |
| <i>flower</i>  | 53  | 15  | 0   | 0   | 68    |
| <i>flowers</i> | 42  | 16  | 0   | 0   | 58    |
| <i>birds</i>   | 64  | 1   | 0   | 0   | 65    |
| <b>others</b>  | 592 | 210 | 56  | 284 | 1142  |
| <b>TOTAL</b>   | 833 | 300 | 558 | 307 | 1998  |

Using the approach presented during the lecture, decide which sentence, S1:

*birds like flower*

or S2:

*flies like fruit*

is **more likely to be labeled with a sequence of tags N, V, N**. Show all your work.

Answer:

Second word is most likely to be labelled with sequence of tags because of the probability of 2<sup>nd</sup> sentence is greater than probability of first sentence.

## Transition Probabilities-

|        | <S> | ART  | Noun | Verb | Prep. |
|--------|-----|------|------|------|-------|
| <S>    | 0   | 0.71 | 0.29 | 0    | 0     |
| <ART>  | 0   | 0    | 1    | 0    | 0     |
| <Noun> | 0   | 0.44 | 0.13 | 0.43 | 0.44  |
| <Verb> | 0   | 0.65 | 0.35 | 0    | 0     |
| <Prep> | 0   | 0.74 | 0.26 | 0    | 0     |

Given sentences

S1: birds like flowers

S2: flies like fruit

required:  $P(\text{birds, like, flower} \mid N, V, N)$

$$\text{we know } P(w_1, w_2, \dots) = \prod_{i=1}^T P(w_i \mid c_i) * P(c_i \mid c_{i-1})$$

using ①, calculating probability  $P(S_1)$

$$P\left(\frac{\text{birds}}{\text{Noun}}\right) P\left(\frac{\text{like}}{V}\right) P\left(\frac{\text{flower}}{N}\right) * P\left(\frac{N}{<S>}\right) P\left(\frac{V}{N}\right) P\left(\frac{N}{V}\right)$$

$$= \left(\frac{64}{833} * 0.1 * \frac{58}{833}\right) * (0.29 * 0.43 * 0.35)$$

$$\approx (0.0768 * 0.1 * 0.0636) * (0.29 * 0.43 * 0.35)$$

$$\approx 4.8 * 10^{-4} * 0.044$$

Using ① Calculating for  $S_2$ .

$$= \left( P\left(\frac{\text{flies}}{N}\right) \times P\left(\frac{\text{like}}{V}\right) \times P\left(\frac{\text{fruit}}{N}\right) \times P\left(\frac{N}{257}\right) P\left(\frac{V}{N}\right) P\left(\frac{N}{V}\right) \right)$$

$$= \left( 0.025 \times 0.1 \times \frac{49}{833} \right) \times (0.29 \times 0.43 \times 0.35)$$

$$= (0.025 \times 0.1 \times 0.0588) (0.29 \times 0.43 \times 0.35)$$

$$= 1.47 \times 10^{-4} \times 0.044$$

Clearly  $P(S_1) > P(S_2)$ . So there are  $S_1$  is the suitable sentence