## Homework 1

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## Question 1. Their vs There

Answer a): Unigram model

The probability of a sentence,  $w_1, w_2, ..., w_n$  is given by:

$$p(w_1, w_2, ..., w_n) = \prod_{i=1}^{n} p(w_i | w_1^{i-1})$$

In the unigram model we assume  $p(w_i|w_1^{i-1}) = p(w_i)$ , i.e. we assume that words are independent of each other. Therefore,

$$p(w_1, w_2, ..., w_n) = \prod_{i=1}^{n} p(w_i)$$

The approach to attempt to solve the *their* vs *there* in terms of a unigram model is a bad idea for the following reason. When evaluating a probability of a sentence;  $p(w_1, w_2, ..., w_n)$  which contains either *their* or *there* and we want to see which sentence is more likely, we compare their probabilities and choose the one with higher probability. Namely:

$$argmax_{their,there} \{p(w_1, w_2, ..., w_{n-1}) * p(their), p(w_1, w_2, ..., w_{n-1}) * p(there)\} = argmax_{their,there} \{p(their), p(w_1, w_2, ..., w_{n-1}) * p(there)\} = argmax_{their,there} \{p(their), p(w_1, w_2, ..., w_{n-1}) * p(there)\}$$

That is, we always pick the word (out of there/their) which has higher probability. That is, the more occurring word will always be considered the "correct" word.

## **Answer b):** Bigram model

When using a bigram we assume;  $p(w_i|w_1^{i-1}) = p(w_i|w_{i-1})$ , that is, the probability of a word depends on the preceding word. Thus, the formula is:

$$p(w_1, w_2, ..., w_n) = \prod_{i=1}^{n} p(w_i | w_{i-1})$$

The bigram model would do a lot better as it can account for the fact that a noun is more frequently preceded by *their*, rather than *there*. Similarly, a verb is more frequently preceded by *there*, rather than *their*. The language model does not know what a "noun" or a "verb" is, but it knows the probability over all words preceding *their* and *there*, which will have this structure.

Question 2. Independence assumption

Answer a): The strange man

Answer b):

Answer c):

Question 3. Hidden Markov Model and Named Entity Recognition

**Answer a):** Transition matrix

The matrix is represented s.t. we go from row to column, therefore if we sum up the probabilities of a row we get 1.

Table 1: Transition matrix

	Per	Org	end
start	$\frac{3}{4}$	$\frac{1}{4}$	0
Per	$\frac{3}{6}$	$\frac{3}{6}$	0
Org	0	$\frac{11}{15}$	$\frac{4}{15}$

Answer b):

Answer c):

Answer d):