# CS221 Fall 2018 Homework [Reconstruct]

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By turning in this assignment, I agree by the Stanford honor code and declare that all of this is my own work.

### Problem 1

(a) Greedy algorithm, since it's inclined to make a choice that seems best for that particular moment, focuses on choosing the minimum cost path for the given model at the every state it visits. Since it does not consider future costs, therefore, the greedy algorithm is suboptimal for such problems. Consider a corpus "In the last test, antioxidants were found to be present. This result is anti-intuitive, since for earlier cases, oxidants were not present". Assuming that the language model is a uni-gram model. Total cost assigned to words  $[w_1, w_2...w_n]$  is defined as  $\sum_{i=1}^{n} u(w_1)$ , where

$$u(w) = \begin{cases} c, & \text{if w in given corpus, } c > 0 \\ P, & \text{if w not given corpus, } P \text{ significantly larger than } c \end{cases}$$

Running greedy algorithm on "antioxidantswerepresent" will pick up words occuring in the corpus one by one. The exact result will be "anti", "oxidants", "were" and "present". This will cost 4c, whereas an optimal solution of lower cost is 3c ("antioxidants", "were" and "present").

## Problem 2

(a) The approach of greedy algorithm is the same as described in 1a above, that it chooses a path which has minimum cost for that moment, and doesn't consider future costs. Consider a corpus "He booked ticket. He baked cookies. He baked sandwiches.". Let the possible insertions be defined as an object with key as query and value being the different possible words with vowels:

possible insertions = 
$$\{h : ['he'], bkd : ['baked', 'booked'], cks : ['cookies'], ...\}$$

And let the bigram cost be defined as inverse of all the counts of different bigrams in the given text, and for those which do not exist, let's assume  $\infty$ . Let the input list be: ['h', 'bkd', 'cks']. The different paths are: ['he', 'booked', 'cookies'] and ['he', 'baked', 'cookies']. For the greedy algorithm, since the count of ["he", "booked"] is higher, the cost is lesser, therefore it takes this path. But this will cause the algorithm

to add up infinitely large cost when evaluating ["booked", "cookies"] bigram, since this doesn't exist in the bigrams for the above corpus. Whereas, an optimum solution would consider taking ['he', 'baked'], in order to reduce the future cost (['baked', 'cookies'] bigram exists in corpus).

#### Problem 3

(a) Since the cost function is a bi-gram model, our state should contain just enough information to find the cost of going to the next state (here in cost of next possible fill given the previous fill). Therefore, it should contain the previous fill, and the begin index of the next string.

#### state = PREVIOUS WORD, BEGIN INDEX

Start state would be previous word as sentence begin word, and begin index of the next string to be zero .

$$startState = SENTENCE BEGIN, 0$$

Each of the actions would be the next word from the possible fills of vowels for the next substring. Cost at any point will be computed through bigram cost function which takes **PREVIOUS WORD** and next possible fill as the input.

Finally, the end state would be when our **BEGIN INDEX** has visited the end of the query string, therefore:

$$endFn(state) => state[1] == len(query)$$

(c) Since we need to define  $u_b(w)$  as a cost function for the relaxed problem which is also a heuristic for the overall problem, it should return a cost less than or equal to the bi-gram cost function  $b_(w', w)$ . Therefore, for every input w, if  $u_b$  returns the minimum value of all the possible costs returned by b(w', w), when  $w'\epsilon$  all possible states/words that can be at current deand w is the next word.

$$u_b^d(w) = min\{b(state_0, w), b(state_1, w)...b(state_{d'}, w)\}$$

where  $state_0$ ,  $state_1$ .... $state_{d'}$  are all the possible states at d, which is the "end index of the query string".

Our state will only consist of end index of the query string, action will be next vowel inserted word, cost will be  $u_b^d(action)$ , start state will be 0 and end state would be when the end index is equal to the length of the query. h(s) consistency condition are two:

1. Cost(s, a) + h(Succ(s, a)) > h(s)

For this problem, h(s) will have the lowest cost to reach the endpoint from any given state, since we are summing the minimum costs while taking actions. For the overall problem, the cost from this point can be minimum or can be more than that. Therefore the above inequality holds true.

- 2.  $h(s_{end}) = 0$  This is true since if we are already at the end node, there won't be any cost for the next state.
- (d) Yes, UCS is a special case of  $A^*$  search. Since  $A^*$  explores in the order of sum of past and future costs, and UCS explores states in the order of past costs, therefore when the future cost (or heuristic value) is zero,  $A^*$  is same as UCS.

Yes, BFS is a special case of UCS as just like UCS, it tends to explore the states which take same costs to reach, but unlike UCS, BFS assumes that the cost for each action is the same for every state. Therefore, BFS is UCS with an assumption that all the costs are equal and positive. UCS is more generic and is used where the cost of actions are not equal. Both assume that the costs are positive.