EECS 340, Breakout Session Notes, November 18, 2019

- 1. As usual, begin by handing out the quiz and collect it quiz at 3:40.
- 2. Place the students into groups and give them this problem: Many programs that you enter text on (messaging apps, a word processors) compare the words you enter to a dictionary. If the word is not found, the program assumes it is a typographical error and presents the user with a list of possible alternatives. The goal is to find words that are "close" to the word the user entered. One way to define "close" is with *edit distance*.

The edit distance between two strings s1 and s2 is the minimum number of changes that you must make to s1 for it to become s2. There are three types of changes:

- You can remove a character of s1.
- You can add a character to s1.
- \bullet You can replace a character of s1 with a different character.

Design an algorithm that takes two strings, s1 and s2, s1 had n characters and s2 has m characters, and gives the (minimum) edit distance between them.

- 3. The first thing the students should ask is if it feels like an NP-hard problem or a polyomial time problem. One thing that should jump out at them is that we are minimizing a metric and we have choices. That suggests dynamic programming.
- 4. The next question is whether we want the minimum subproblem from each choice. To answer that, we have to think about what is the subproblem.
- 5. A useful hint is to think about the change needed to match that last character of s1 to the last character of s2.
- 6. They should hopefully start to realize that there are three choices, and depending on the choice, we have a different subproblem. That subproblem can be solved optimally, and we then do the last step to match the strings.
- 7. The next step is to use that insight to create the recurrence relation. What information do we need to know at each step? Which prefix of s1 we need to match to which prefix of s2.
- 8. Here is a possible solution and proof:

Create a table T[i, j] to store the minimum edit distance between the first i characters of s1 and the first j characters of s2.

 $T[i,j] = \min\{T[i-1,j-1] + c(i,j), T[i-1,j] + 1, T[i,j-1] + 1\}$ where c(i,j) is 0 if s1[i] = s2[j] and 1 if $s1[i] \neq s2[j]$. We initialize the table with T[0,0] = 0.

Proof by induction. The base case is trivial.

Assume T[i-1, j-1] stores the minimum edit distance between the first i-1 characters of s1 and the first j-1 characters of s2.

Assume T[i, j-1] stores the minimum edit distance between the first i characters of s1 and the first j-1 characters of s2.

Assume T[i-1,j] stores the minimum edit distance between the first i-1 characters of s1 and the first j characters of s2.

Consider T[i,j]. We have four choices for our "last" conversion to get s1[1..i] to be equal to s2[1..j]

• We match the *i*th character of s1 with the *j*th character of s2 (only if they are the same). In this case, we had to previously convert the i-1 characters of s1 to equal the j-1 characters of s2.

- We replace the *i*th character of s1 with the *j*th character of s2. In this case, we had to previously convert the i-1 characters of s1 to equal the j-1 characters of s2.
- We remove the *i*th character of s1. In this case, we had to previously convert the i-1 characters of s1 to the j characters of s2.
- We add the jth character of s2 to s1. In this case, we had to previously conver the first i characters of s1 to the first j-1 characters of s2.

For each of these choices, it does not matter how we match the resulting prefixes because those choices do not affect our last choice. Therefore, to get the shortest edit distance, we should match them optimally. By the induction hypotheses, T[i-1,j-1], T[i,j-1], and T[i-1,j] store the minimum edit distance for each of the possible prefix cases above. That completes the proof.

How do we get the solution? For this proboem, we only want the minimum edit distance between s1 and s2, and that will be the value stored in T[n, m]

The running time is $\Theta(nm)$ because we have to fill a $n \times m$ table, and it takes constant time for each entry.