# CS161 Spring 2013 Project

SUNet ID: agiel ankitk hkader

Name: Andrew Giel Ankit Kumar Hussain Kader

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

### 1

Given two strings A and B of length m and n, create a new letter not in the alphabet of either string, which we will denote \*. Now, append a min(m,n) + 1 = l-length string of \*s to both strings to create  $A^*$  and  $B^*$ . We feed  $A^*$  and  $B^*$  into CLCS and receive  $Z^*$  as the returned sequence; i.e,  $Z^*$  is the matches in  $CLCS(A^*, B^*)$ . First, we claim that  $Z^*$ must contain at least one \*. Proof: say this was not the case, and say  $Z^*$  was the longest valid CLCS, but it has no \*s. Then  $Z^*$  contains only letters, and so  $Z^*$  can be at most size min(m,n), as surely only min(m,n) letters can be matched in the original string. But there were min(m,n) + 1 > min(m,n) \*s added, and matching each of these \*s to each other is possible; hence, we have a contradiction, as we assumed  $Z^*$  was the longest valid CLCS, but it is shorter than simply matching all \*s. Now, note that  $Z^*$ , since it's a CLCS output, must correspond to some procedure which mimics the behavior of  $LCS(cut(A^*,i),cut(B^*,j))$  for some i,j. Note that  $CLCS(A^*, B^*)$  can be of length LCS(A, B) + l by simply cutting at 0 and matching A to B and then all l stars to each other; therefore, any  $Z^*$  must be length greater than or equal to that. There are four ways that the strings  $A^*, B^*$  can look after a cut: \*s, letters, \*s; letters, \*s, letters; \*s, letters; or letters, \*s. We claim that, in  $Z^*$ , by starting at the first letter after the first sequence of \*s, and wrapping around the end of the string if necessary, we obtain LCS(A, B). We will prove this by (many) cases.

- 1. The two cuts were such that  $A^*$ ,  $B^*$  both looked like \*s, letters. The only way for this to happen is if both were cut right before the \*s; hence, the strings look like l\*s then the original A, and l\*s then the original B. Thus, the LCS of this cut is to match all the \*s and then match the original strings A and B to each other. Therefore, starting after the last matched \*, we obtain the LCS of A and B.
- 2. The two cuts were such that  $A^*$ ,  $B^*$  both looked like letters, \*s. Then both were cut at 0, and the LCS is to match the original A to the original B and then all the \*s. Again, if we start at the end of the \*s (instantly wrapping around to the start), we obtain the LCS of A and B in order.
- 3. The two cuts were such  $A^*$ ,  $B^*$  both looked like letters, \*s, letters. Note that if any of the letters match to a letter in the other string that is on the other side of the \*s, none of the \*s can match to each other as there would then be a crossing of matches. The maximum length of matching in this case is min(m, n), which is less than l, so this could not happen in a CLCS output. Therefore, letters on either side of the \*s only match to each other, implying that all the \*s match to each other, since this maximizes the LCS length. So, starting after the last \* matched, we see that the matches correspond to matches between the start of A

- and B, and then wrap around to matches between the end of A and B. Finally, since this is a CLCS output with l matching \*s, the size of the matching between A and B must be  $\geq LCS(A, B)$ , but the matches are exactly in order and thus cannot be  $\geq LCS(A, B)$ , so in fact these matches are LCS(A, B).
- 4. The two cuts were such  $A^*, B^*$  both looked like \*s, letters, \*s. If any of the \*s on one side of the letters matched to any \*s on the other side, none of the letters could match to each other; thus the size of the CLCS output would be at most l. This would imply that LCS(A, B) is 0, as otherwise simply cutting at 0 and taking the output size LCS(A, B) + l would be bigger. Thus, the LCS would be the empty string, which is what we'd return as there are no letters in the CLCS output. Otherwise, the \*s on either side of the letters match to each other only, and the letters match to each other in the middle. But note that the letters are now perfectly in order as they were in A and B, so these matches are indeed LCS(A, B), and we obtain them by again starting at the the last \* in the first sequence of \*s and reading the letters in the matching in order (note that there must be a match in \*s before the first letter, else the size of the CLCS output would be LCS(A, B) + l' where l' < l, since a \* is not being matched at the beginning.
- 5. The two cuts were such  $A^*$ ,  $B^*$  looked like letters, \*s and \*s, letters. Note that all letters are in order of the original A, B here. Thus, if we match NO \*s, the best we can get is LCS(A, B), as we'd be matching the letters in order. However, this is surely less than LCS(A, B) + l, so this wouldn't happen. Therefore, we must match the \*s, and subsequently we cannot match any of the letters, as there would then be a crossing of matches. Therefore, in order for this to be a valid CLCS output, LCS(A, B) must equal 0, and thus the LCS is the empty string, as we would return.
- 6. The two cuts were such  $A^*$ ,  $B^*$  looked like letters, \*s and \*s, letters, \*s. If any of the first \*s in the second string matched to the last \*s in the first, none of the letters would be able to match, implying that LCS(A, B) equals and that the LCS is the empty string, which we'd return. Otherwise, this formation could not correspond to a CLCS output, as the best matching we could get is A matched with B and then the final l' < l stars matched to each other, giving a length of LCS(A, B) + l' < LCS(A, B) + l.
- 7. The two cuts were such  $A^*$ ,  $B^*$  looked like letters, \*s, and letters, \*s, letters. If any \*s are matched to each other, only the letters at the beginning of both cuts could be matched to each other. But note these blocks of letters are sequential as they appear in A, B, so the length of this match is  $\leq LCS(A, B)$ , as LCS(A, B) could still take these matches. If that  $\leq$  is equality, then we have a valid LCS(A, B) as the matches are sequential as they appear in A, B, and starting at the end of the sequence of matched \*s (instantly wrapping around), we'll obtain this LCS. Otherwise, the  $\leq$  is a <, and therefore this isn't a valid CLCS output, as the size is less than LCS(A, B) + l. If, on the other hand, none of the \*s are matched to each other, we can only match the letters giving a maximum match length of min(m, n), which is < l, so again this isn't a valid CLCS output.
- 8. The two cuts were such  $A^*, B^*$  looked like \*s, letters and \*s, letters, \*s If any of the last block of \*s in the second match to the \*s in the first cut, none of the letters can match, implying LCS(A, B) equals 0 and the LCS is the empty string, which we would return.

Otherwise, this formation couldn't lead to a valid CLCS, as only l' < l \*s would match, and other than that the letters would match sequentially to each other, leading to a match size of LCS(A, B) + l', which is less than LCS(A, B) + l.

- 9. The two cuts were such  $A^*$ ,  $B^*$  looked like \*s, letters, and letters, \*s, letters. If the \*s match to each other, the only other matches can be the second set of letters in the second cut (which is the beginning of the string B) and the letters in A. This matching is  $\leq LCS(A, B)$ , as in case 7. Again, if we have equality, we'll return a valid LCS by starting after the end of the first sequence of \*s; otherwise, it is strictly less than, and therefore the output would not be a valid CLCS output, as the length would be  $\leq LCS(A, B) + l$ .
- 10. The two cuts were such  $A^*$ ,  $B^*$  looked like letters, \*s, letters and \*s, letters, \*s. If any of the first sequence of \*s in the second cut matches to the \*s in the first cut, none of the letters can match and therefore LCS(A, B) would have to be 0 for this to be a valid output, and we would return the empty string as required. Otherwise, none of these first \*s match, and thus the output length is < LCS(A, B) + l, and so this would not be a valid CLCS output.

We need not consider any other cases, as they would be the symmetric opposite of one of the above cases and thus fall under the same proof. Note that this proof is certainly cumbersome and there is probably a more elegant way. However, this way is correct. We want to clarify that the strategy of this proof is as follows: given an output  $Z^*$  from the black-box CLCS implementation, we claim that we can obtain the LCS of A,B from starting at the first letter after the first sequence of \*s in  $Z^*$ , and wrapping around if necessary, then stopping at the next \*. To prove this claim, we note that  $Z^*$  MUST correspond to  $LCS(cut(A^*,i),cut(B^*,j))$ . We then show that for any combination of cuts, starting at the first letter after the first sequence of \*s in the matching and wrapping around if necessary correctly finds the LCS. In these cases, we often use the fact that  $Z^*$  is a valid CLCS output and thus it's length must be  $\geq LCS(A, B) + l$ .

### 2

Take any i, j. We claim  $\exists k$  such that  $LCS(cut(A, i), cut(B, j)) \leq LCS(cut(A, k), cut(B, 0))$ . Label the letters in the original arrangement of A, B as  $a_1, a_2, ..., a_m$  and  $b_1, b_2, ..., b_n$ . Label the matches of LCS(cut(A, i), cut(B, j)) as  $(a_x, b_y)$  for  $x \in \{1, ...m\}, y \in \{1, ...n\}$ . Split the strings cut(A, i) and cut(B, j) into 2 regions each:  $A_1 = \{a_1, ...a_i\}, A_2 = \{a_i + 1, ...a_m\}$  and  $B_1 = \{b_1, ...b_j\}, B_2 = \{b_i + 1, ...b_n\}$  Note that in cut(A, i) there is, sequentially,  $A_2$  then  $A_1$ , and in cut(B, j) there is, sequentially,  $B_2$  then  $B_1$ . There are three cases; in all of them, we prove that there is a k such that all the LCS(cut(A, i), cut(B, j)) matches are valid:

- 1. In LCS(cut(A, i), cut(B, j)), there are only matches between  $A_1$  and  $B_1$  and between  $A_2$  and  $B_2$ . Then all of these matches are valid in LCS(cut(A, 0), cut(B, 0)), as these two regions are sequential in A and B, so these matches will have no crosses. Thus  $LCS(cut(A, 0), cut(B, 0)) \ge LCS(cut(A, i), cut(B, j))$
- 2. There are matches between  $B_2$  and  $A_1$ ,  $B_2$  and  $A_2$ , and  $B_1$  and  $A_1$ . Then let  $(a_x^*, b_y^*)$  by the match with the largest value y\* given that  $x* \in A_1$  and  $y* \in B_2$ . Let k = x\*+1. Then

note that cut(A, k) has, sequentially,  $a_x \in A_1$  such that x > x\*, then  $A_2$ , then the rest of  $A_1$ . B has, sequentially,  $B_1$  then  $B_2$ . Note that any letter in  $B_1$  can only match to letters  $a_x \in A_1$  such that x > x\*, else there would be a crossing of matches in LCS(cut(A, i), cut(B, j)). Letters in  $B_2$  sequentially match with  $A_2$ , then  $a_x \in A_1$  such that x < x\* as this is how the matches must have been in LCS(cut(A, i), cut(B, j)). Thus, all original matches are valid, so  $LCS(cut(A, k), cut(B, 0)) \ge LCS(cut(A, i), cut(B, j))$ .

3. There are matches between  $A_2$  and  $B_1$ ,  $B_2$  and  $A_2$ , and  $B_1$  and  $A_1$ . Then let  $(a_x^*, b_y^*)$  by the match with the smallest value y\* given that  $x* \in A_2$  and  $y* \in B_1$ . Let k = x\*-1. Then note that cut(A, k) has, sequentially,  $a_x \in A_2$  such that  $x \geq x*$ , then  $A_1$ , then the rest of  $A_2$ . B has, sequentially,  $B_1$  then  $B_2$ . Note that letters in  $B_1$  match sequentially to the letters  $a_x \in A_2$  such that  $x \geq x*$ , then letters in  $A_1$ , sequentially, as this is how it was in LCS(cut(A,i),cut(B,j)). Then, letters in  $B_2$  must only match to letters  $a_x \in A_2$  such that x < x\*, else there'd be a crossing of matches in LCS(cut(A,i),cut(B,j)). Thus, again, all original matches are valid, so  $LCS(cut(A,k),cut(B,0)) \geq LCS(cut(A,i),cut(B,j))$ 

Finally note that we cannot have matches between  $A_2$  and  $B_1$  and matches between  $A_1$  and  $B_2$ , else there'd be a crossing of matches. Thus the above 3 cases are all the possible cases, and in each we may find a k such that  $LCS(cut(A, k), cut(B, 0)) \ge LCS(cut(A, i), cut(B, j))$ . Thus, it suffices to only try cuts of the form cut(A, k), cut(B, 0), as CLCS returns the largest possible LCS(cut(A, i), cut(B, j)), and for every LCS(cut(A, i), cut(B, j)) such that  $j \ne 0$ , there is a LCS(cut(A, k), cut(B, 0)) greater than or equal to it.

## 3

Given a path  $(m_0, n_0), ..., (m_x, n_x)$  such that  $(m_0, n_0) = (0, 0)$  and  $(m_x, n_x) = (m, n)$ , the corresponding common subsequence is  $A[m_x + 1]$  for all pairs such that  $(m_x + 1, n_x + 1) = (m_{x+1}, n_{x+1})$  (i.e all diagonal edges).

Thus, given a shortest path from  $(0,0) \to (m,n)$ , the corresponding common subsequence as defined above will be the longest common subsequence as long as we can prove that the shortest path from  $(0,0) \to (m,n)$  contains the maximum number of diagonal edges. To see this, note that there is never an edge that goes back, i.e there is no edge  $(m_1, n_1) \to (m_2, n_2)$  such that  $m_1 > m_2$  or  $n_1 > n_2$ . Further note that no edge has length more than 1; i.e, given an edge  $(m_1, n_1)$  to  $(m_2, n_2)$ ,  $m_2 = m_1$  or  $m_1 + 1$ , and  $n_2 = n_1$  or  $n_1 + 1$ . Therefore, the length of any path from  $(0,0) \to (m,n)$  will be m+n-d, where d is the number of diagonal edges, as every time there is a diagonal edge we save one move, and otherwise we must go from 0 to m and 0 to n in 1 move increments. Thus, the shortest path will maximize d and thus have the maximum number of diagonal edges, and therefore be a longest common subsequence.

### 4

By contradiction. Let  $P_1, ..., P_x$  be  $p_i$ , so  $P_1 = (i, 0)$  and  $P_x = (m + i, n)$ . Let  $s = s_1, ..., s_y$  be the shortest path from  $(j, 0) \to (m + j, n)$  in  $G_{L_i} \cup p_i$ , and let  $\rho = \rho_1, ..., \rho_z$  be a shorter path that goes through  $x \in G_{U_i}$ . Since  $\rho$  starts in  $G_{L_i} \cup p_i$  and touches  $x \in G_{U_i}$ , there must be some  $\rho_a, ..., \rho_{a+q}$  such that  $\rho_a = P_k$  and  $\rho_{a+q} = P_{k+w}$  for some k, w, as  $p_i$  is the boundary between the two regions. Now, since  $p_i$  is itself a shortest path, it must be that  $w \leq q$ . Thus, consider the new path  $\gamma = \rho_1, ..., \rho_{a-1}, P_k, P_{k+1}, ..., P_{k+w}, \rho_{a+q+1}..., \rho_z$ . Since  $w \leq q$ ,  $len(\gamma) \leq len(\rho)$ . But note that now  $\gamma$  does not go through x; in fact it is contained strictly in  $G_{L_i} \cup p_i$ , and thus by s a shortest path,  $len(s) \leq len(\gamma) \leq len(\rho) \implies len(s) \leq len(\rho)$ , a contradiction.

### 5

SINGLESHORTESTPATH(A, B, p, p[l], p[u]) uses DP to compute the shortest path in region bounded by p[l] and p[u]. The number of nodes in this region is not (u-l)n, as the paths p[l] and p[u] can look many different ways. However, note that the two calls to SINGLESHORTESTPATH in the two recursive calls to FINDSHORTESTPATHS inside a call to FINDSHORTESTPATHS(A, B, p, p[l], p[u]) can look at at most the number of nodes in the region bounded py p[l] and p[u], plus the number of nodes in the path p[mid], as the two calls will be SINGLESHORTESTPATH(A, B, p, p[l], p[mid])and SINGLESHORTESTPATH(A, B, p, p[mid], p[u]), and thus the nodes looked at are bounded by p[l] and p[u], with the path p[mid] being double counted. In particular, this implies that every level of recursion looks at at most the number of nodes looked in the level of recursion above it plus the  $\frac{x}{2}(m+n)$ , where x is the number of nodes at that level of recursion. This is because there are  $\frac{x}{2}$  double-countings of paths, and every path is at most size m + n. This leads to the following sum for the total amount of work done by SINGLESHORTESTPATH:  $\sum_{i=0}^{\lg m} 2mn + 2^{i-1}(m+n) = \sum_{i=0}^{\lg m} 2mn + \sum_{i=0}^{\lg m} 2^{i-1}(m+n) = 2mn \lg m + O(m^2 + mn)$ , as there are  $\lg m$  levels and  $2^{i-1}$  double countings for level i (with root = 0), and the amount of work done at level 0 is at most 2mn. Finally, note that  $m \leq n$ , so  $O(m^2 + mn) = O(mn)$ , so the overall work done is  $O(2mn \lg m + O(mn)) = O(mn \lg m)$ as required.