## Project 2 Report

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### 1 Breaking Down Problems

Insertion, deletion, and substitution can be solved using a simple recurrence that can be easily memoized. Transposition proved to be more involved. We separate the transpositions from all other typo forms. By first keeping a record of where possible transpositions can occur (and each permutation of possible propagation lengths), we vastly simplify the recurrence. In the memoized solution, we also separate the initial table fill from backtracking.

#### 2 Parameters for the recursion

The two arrays p and t (pattern and typo) and indexes i and j representing the positions in p and t currently being compared

## 3 What recurrence can you use

The naive recurrence we came up with was:

$$C(p,t) = \begin{cases} C(p[1..m-1],t) + insertCost(p[m],p[m-1]), \\ C(p,t[1..n-1]) + deleteCost(t[n],t[n-1]), \\ C(p[1..m-1],t[1..n-1]) + substituteCost(p[m],t[n]), \\ C(p[1..m-1],t[1..n-2] \mid\mid^1 t[n]) + transposeCost(t[n-1],t[n]) \end{cases}, \quad m > 1, n > 1$$

$$C(p[1..m-1],t) + insertCost(p[m],p[m-1]), \quad m = 1, n > 1$$

$$C(p,t[1..n-1]) + deleteCost(t[n],t[n-1]), \quad m > 1, n = 1$$

$$0, \quad m = 1, n = 1$$

where 
$$m = length(pattern)$$
,  
 $n = length(typo)$ 

This ended up being extremely inefficient in practice: the transposition operator doesn't allow us to memoize the main function using simply a 2d array, since transposing affects the typo string when recursing. We can't simply assume that the typo string and pattern strings are simply truncated between calls.

#### 4 What are the base cases

Whenever i or j are equal to 1. If i = 1, the remaining characters in t[1..j-1] were trivially all insertions at the beginning. If j = 1, the remaining characters in p[1..i-1] were deleted. If both i = 1 and j = 1, there are no further characters to compare.

<sup>&</sup>lt;sup>1</sup>Note that || is the string concatenation operator here

#### 5 What data structure would you use

A map from pairs of (i, j) to the cost of the recurrence for (i, j), as well as a map from pairs of (i, j) to a set of numbers of transpositions k such that for each a chain of transpositions may have occurred in p[(i - k)..i] and t[(j - k)..j].

We found that the best structure to use for memoizing would be 2D array with each cell containing the lowest cost typo, the overall cost of accumulated typos, and the index to the lowest cost next cell.

As well, a hash table is kept, indexed by the squashed coordinates of our 2D array to store possible transposition sites. This hash table contains arrays of size 12, where the distance into the table is the number of propagating transpositions, the contents of which is the cost to perform that chain of transpositions.

#### 6 Pseudocode for a memoized dynamic programming solution

```
Input: data: Table containing the memoized data
  Input: transposes: Set of possible transpositions
  Input: correct: The correct string
  Input: actual: The actual string with typos
  Input: i: Current position into the correct string
  Input: j: Current position into the actual string
  Output: Running cost of typos
1 Algorithm FindTypos:
     Fill the parents of data with (-1, -1)
     find_transposes (correct, actual, transposes)
3
     Fill (corect, actual, data, transposes i, j)
4
     Let p be (i, j)
5
     until p == (-1, -1):
6
         Record the error made at data[p]
7
         p = data[p]'s parent
8
     return the recorded errors
```

```
1 def find_transposes (correct, actual, transposes):
      for i from length (correct) to 1:
 2
          for j from length (actual) to 1:
3
             Let correct char be correct[i]
4
             Let current\_char be actual[j]
5
             Let left char be actual[j-1]
6
             if left\_char == correct\_char and current\_char! = correct\_char:
7
                Start the running cost at transpose_cost(left char, current char)
8
                for k from 1 to 12:
9
                   Let correct char be correct[i-n]
10
                   Let left char be actual[j-1-n]
11
                   if current char == correct char:
12
                       Add a possible transposition to transpoes[i, j] with the current running cost
13
                   if correct\_char! = left\_char or i - n == 1 or j - 1 - n == 1:
14
                       break the innermost loop
15
                    Add transpose_cost(left char, current char) to the running cost
16
```

```
1 def Fill(correct, actual, data, transposes i, j):
       if data[i, j] has a value:
 2
          return
 3
       elif i == 1 and j == 1:
 4
          return 0
 5
       elif i == 1:
 6
          Fill(correct, actual, data, transposes, i, j-1)
 7
          Let the cost be insert\_cost(i, j) + data[i, j - 1]
 8
           Store the cost in data[i, j]
 9
           Set the typo of data[i, j] to Insert
10
          Set the parent of data[i, j] to (i, j - 1)
11
          return the cost
12
       elif j == 1:
13
          Fill(correct, actual, data, transposes, i - 1, j)
14
          Let the cost be delete\_cost(i, j) + data[i - 1, j]
15
           Store the cost in data[i, j]
16
           Set the typo of data[i, j] to Delete
17
           Set the parent of data[i, j] to (i - 1, j)
18
          return the cost
19
       else:
20
          Fill(correct, actual, data, transposes, i, j - 1)
\mathbf{21}
          Fill(correct, actual, data, transposes, i - 1, j)
22
          Fill(correct, actual, data, transposes, i - 1, j - 1)
23
          Let options be a list of possible errors.
\mathbf{24}
          Add an Insert error to options with cost insert_cost(i,j) + data[i,j-1] and parent (i,j-1)
25
26
          Add a Delete error to options with cost delete_cost(i, j) + data[i - 1, j] and parent (i - 1, j)
          if correct[i] == actual[j]:
27
              Add a None error with cost data[i-1, j-1] and parent (i-1, j-1)
\mathbf{28}
          else:
29
              Add a Substitute error to options with cost substitute_cost(i,j) + data[i-1,j-1] and
30
               parent (i - 1, j - 1)
          if There are transpositions in transpose [i, j]:
31
              for t in transpoes[i, j]do
32
                  Fill(correct, actual, data, transposes, i - t.length, j - t.length)
33
                  Add a Transpose error with cost t.cost + data[i - t.length, j - t.length] and parent
\bf 34
                   (i-t.length, j-t.length)
          Pick the minimum option in options
35
           Store the cost, error type, and parent in in data[i, j]
36
          return that minimum cost
37
```

## 7 Worst case time complexity

The worst-case of our algorithm will encompass:

- O(n \* m) Transposition identification.
- O(n \* m) Fill table pass
- O(n + m) Backtracking pass

So, as a whole, the algorithm takes O(n \* m) time complexity.

#### 8 Pseudocode for nested loop

```
Input: data: Table containing the memoized data
   Input: transposes: Set of possible transpositions
   Input: correct: The correct string
   Input: actual: The actual string with typos
   Output: Running cost of typos
 1 def find_transposes ():
       for i from 1 to length(correct):
 2
          for j from 1 to length(actual):
 3
   def FindTypos(correct, actual):
       Let data be a new typo array with dimensions (length(correct), length(actual))
 5
       for i from 1 to length(correct):
 6
          for j from 1 to length(actual):
 7
              if i = 1 and j \neq 1:
 8
                 Let the cost be insert\_cost(i, j) + data[i, j - 1]
 9
                 Store the cost in data[i, j]
10
                  Set the typo of data[i, j] to Insert
11
                 Set the parent of data[i, j] to (i, j - 1)
12
              elif i \neq 1 and j = 1:
13
                 Let the cost be delete\_cost(i, j) + data[i - 1, j]
14
                 Store the cost in data[i, j]
15
                 Set the typo of data[i, j] to Delete
16
                 Set the parent of data[i, j] to (i - 1, j)
17
              else:
18
                 Let options be a list of possible errors.
19
                  Add an Insert error to options with cost insert_cost(i, j) + data[i, j-1] and parent
\mathbf{20}
                  Add a Delete error to options with cost delete_cost(i, j) + data[i-1, j] and parent (i-1, j)
\mathbf{21}
                 if correct[i] == actual[j]:
22
                     Add a None error with cost 0 and parent (i-1, j-1)
\mathbf{23}
                  else:
^{24}
                     Add a Substitute error to options with cost substitute_cost(i, j) + data[i - 1, j - 1]
25
                      and parent (i-1, j-1)
                 if There are transpositions in transpoes[i, j]:
^{26}
                     for t in transpoes[i, j]:
27
                         Add a Transpose error with cost t.cost + data[i - t.length, j - t.length] and parent
28
                          (i-t.length, j-t.length)
                 Pick the minimum option in options
29
30
                 Store the cost, error type, and parent in in data[i, j]
          return the cost in data[length(correct), length(actual)] and the chain of parents starting in that
31
           cell
```

# 9 Can the space complexity of the iterative algorithm be improved relative to the memoized algorithm

No, because the iterative algorithm has to build up every case from the base cases regardless of if that case will be used to compute the final result. The memoized algorithm, on the other hand, will only used enough space to store the results of the cases used.

# 10 Describe one advantage and disadvantage of the iterative algorithm

One advantage is improved performance: there is no overhead on the runtime stack due to recursion. A disadvantage in general is that it is more complex to determine the correct order to iterate over the array. However, since this algorithm has a very simple pattern of dependencies, choosing the right order to solve the sub-problems is also very simple. In this case the call to (i,j) depends on (i-1,j), (i,j-1), and (i-1,j-1).