# Design and Analysis of Algorithms: Homework #3

Due in class on March 1, 2018

Professor Kasturi Varadarajan

Alic Szecsei

You and your eight-year-old nephew Elmo decide to play a simple card game. At the beginning of the game, the cards are dealt face up in a long row. Each card is worth a different number of points. After all the cards are dealt, you and Elmo take turns removing either the leftmost or rightmost card from the row, until all the cards are gone. At each turn, you can decide which of the two cards to take. The winner of the game is the player that has collected the most points when the game ends.

Having never taken an algorithms class, Elmo follows the obvious greedy strategy—when it's his turn, Elmo always takes the card with the higher point value. Your task is to find a strategy that will beat Elmo whenever possible. (It might seem mean to beat up on a little kid like this, but Elmo absolutely hates it when grown-ups let him win.

- (a) Prove that you should not also use the greedy strategy. That is, show that there is a game that you can win, but only if you do *not* follow the same greedy strategy as Elmo.
- (b) Describe and analyze an algorithm to determine, given the initial sequence of cards, the maximum number of points that you can collect playing against Elmo.

## **Solution**

## Part A

Suppose there are a total of 8 cards, with point values ranging from 1 to 8. When dealt, they are arranged like so:

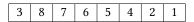


Table 1: an example game

If you were to play using the greedy strategy, you would first take card 3, while Elmo would take 8, and so on. At the end of the game, you would have 3+7+5+2=17 points, while Elmo would have 8+6+4+1=19 points.

However, if you first took card 1, Elmo would take card 3, leaving you to take card 8, and so on, now playing greedily. At the end of the game, you would have 1+8+6+4=19 points, while Elmo would have 3+7+5+2=17 points.

Thus, you can only win this game by making your first move take the smaller of the two available cards, as opposed to Elmo's greedy strategy.

# Part B

```
Algorithm 1 Elmo's Card Game
 1: function Elmo(cards[1..n])
         memorized \leftarrow empty hash map
        memorized[the empty list] \leftarrow 0
 3:
        for i \leftarrow 1, n do
 4:
             for j \leftarrow 1, n-i do
 5:
                 subproblem \leftarrow cards[j..j+i]
                 if i = 1 then
 7:
                     memorized[subproblem] \leftarrow subproblem[1]
 8:
                 else
 9:
                     L \leftarrow subproblem[2..i]

    ▷ Try taking the first card

 10:
                    if the first element of L is greater than the last element of L then
11:
                         remove the first element of L
12:
                     else
13:
                         remove the last element of L
14:
                     end if
15:
                    l \leftarrow subproblem[1] + memorized[L]
16:
                     R \leftarrow subproblem[1..i-1]

    ▷ Try taking the last card

17:
                    if the first element of R is greater than the last element of R then
18:
                         remove the first element of R
19:
                     else
20:
                         remove the last element of R
21:
                     end if
22:
                    r \leftarrow subproblem[i] + memorized[R]
23:
                     memorized[subproblem] \leftarrow \text{the maximum of } l \text{ and } r
24:
                 end if
25:
             end for
26:
27:
         end for
         return memorized[cards]
28:
29: end function
```

This algorithm works from the bottom up to determine all sub-problems. Essentially, at any stage of the game, we may have some i cards, where i < n, and all i cards were originally neighbors (since players may only remove cards to the furthest left and furthest right). Therefore, all possible sub-problems are simply combinations of i neighboring cards. For each sub-problem, assuming it is not trivial (no cards remaining or one card remaining), we can perform two calculations: one assuming the player removes a card from the left, and one assuming she removes a card from the right. Whichever of these two routes produces the largest score is stored as the solution to the sub-problem. When all possible sub-problems have been calculated, the algorithm returns the solution to the n-sized sub-problem, which is the original problem.

The run-time here is straightforward to analyze; there are n "layers" of sub-problems, since we are analyzing games of 1 remaining card, 2 remaining cards, and so on until we have reached the original problem of n remaining cards. For each of these "layers", we find all possible collections of neighboring cards; so, in total, we have  $\sum_{i=1}^{n} i$  sub-problems, which leaves us with a runtime of  $O(n^2)$ .

A palindrome is any string that is exactly the same as its reversal, like I, or DEED, or RACECAR, or AMANAPLANACAT-ACANALPANAMA.

- (a) Describe and analyze an algorithm to find the length of the *longest subsequence* of a given string that is also a palindrome. For example, the longest palindrome subsequence of MAHDYNAMICPROGRAMZLETMESHOWYOUTHEM is MHYMRORYHM, so given that string as input, your algorithm should output the number 11.
- (c) Any string can be decomposed into a sequence of palindromes. For example, the string BUBBASEESABANANA ("Bubba sees a banana.") can be broken into palindromes in the following ways (and many others):

```
B \bullet U \bullet BB \bullet A \bullet SEES \bullet ABA \bullet NAN \bullet A B \bullet U \bullet BB \bullet A \bullet SEES \bullet ABA \bullet NAN \bullet A B \bullet U \bullet BB \bullet A \bullet SEES \bullet A \bullet B \bullet ANANA B \bullet U \bullet B \bullet B \bullet A \bullet S \bullet E \bullet E \bullet S \bullet A \bullet B \bullet A \bullet N \bullet ANA
```

Describe and analyze an efficient algorithm to find the smallest number of palindromes that make up a given input string. For example, given the input string BUBBASEESABANANA, your algorithm would return the integer 3.

## Solution

#### Part A

## Algorithm 2 Longest Palindrome Subsequence

```
1: function LPS(text[1..n])
        memorized \leftarrow empty hash map
        memorized[the empty list] \leftarrow 0
 3:
        for i \leftarrow 1, n do
 4:
            for j \leftarrow 1, n-i do
 5:
                subproblem \leftarrow text[j..j+i]
 6:
                if i = 1 then
 7:
                                                                    ▷ A single letter is always a palindrome of length one
                    memorized[subproblem] \leftarrow 1
 8:
                else
 9:
                    r \leftarrow \text{the maximum of } memorized[subproblem[2..i]] \text{ and } memorized[subproblem[1..i-1]]
10:
                    if subproblem[1] = subproblem[i] then
11:
                        r \leftarrow \text{the maximum of } r \text{ and } 2 + memorized[subproblem[2..i-1]]
12:
                    end if
13:
                    memorized[subproblem] \leftarrow r
                end if
15:
            end for
16:
17:
        end for
        return memorized[text]
19: end function
```

This solution is similar to the previous algorithm. Each subproblem is a set of neighboring characters in the string, with i "layers" of substring lengths and 1 + n - i substrings of length i. Using the previous summation, we see that the runtime is  $O(n^2)$ .

#### Part C

## Algorithm 3 Smallest Number of Palindromes

```
1: function SmallestNumPalindromes(text[1..n])
        memorized \leftarrow empty hash map
 2:
        palindromes \leftarrow \text{empty hash map}
 3:
        memorized[\text{the empty list}] \leftarrow 0
 4:
        palindromes[the empty list] \leftarrow True
 5:
        for i \leftarrow 1, n do
                                                                                            ▷ First, calculate all palindromes
 6:
            for j \leftarrow 1, n-i do
 7:
                subproblem \leftarrow text[j..j+i]
 8:
                if i = 1 then
 9:
                    palindromes[subproblem] \leftarrow True
10:
                else if subproblem[0] \neq subproblem[j+i] then
11:
                    palindromes[subproblem] \leftarrow False
12:
                else
13:
                    palindromes[subproblem] \leftarrow palindromes[subproblem[2..j+i-1]]
14:
                end if
15:
            end for
16:
        end for
17:
        for i \leftarrow 1, n do
                                                               ▷ Now we calculate the actual number of sub-palindromes
18:
            for j \leftarrow 1, n-i do
19:
                subproblem \leftarrow text[j..j+i]
20:
                if i = 1 then
21:
                    memorized[subproblem] \leftarrow 1
22:
                else
23:
                    min \leftarrow i
                                                          ▶ The largest value here assumes there are no sub-palindromes
24:
                    for k \leftarrow 1, i do
25:
                        if palindromes[subproblem[1..k]] then
26:
                            min \leftarrow \text{the minimum of } min \text{ and } 1 + memorized[subproblem[k..i]]
27:
                        end if
28:
                    end for
29:
                    memorized[subproblem] \leftarrow min
30:
31:
                end if
            end for
32:
        end for
33:
        return memorized[text]
34:
35: end function
```

This solution has a few notable differences from the previous algorithm. First, we make sure to store whether or not any sub-string is a palindrome, which can be done in  $O(n^2)$  time, using a similar strategy as the last few algorithms.

However, the second half of the solution is where things get more complex. For each substring, we wish to determine the smallest number of palindromes that can make up that sub-string; to do this, we attempt to find palindromes at the beginning of the sub-string, and then find how many palindromes it takes to fill in the *rest* of the sub-string. As we have  $O(n^2)$  sub-strings and we use an additional loop to determine beginning palindromes, the final running time for this second half of the solution is  $O(n^3)$ . Therefore, our final running time is  $O(n^3)$ .

Suppose we are given a set L of n line segments in the plane, where each segment has one endpoint on the line y=0 and one endpoint on the line y=1, and all 2n endpoints are distinct. Describe and analyze an algorithm to compute the largest subset of L in which no pair of segments intersects.

## Solution

```
Algorithm 4 Largest subset of non-intersecting line segments
```

```
1: function LargestSubsetNonIntersecting(set[1..n])
        Sort(set[1..n])
                                                                                          \triangleright sort by the x-value of the first point
 2:
 3:
        set[0] \leftarrow (-\infty, -\infty)
        for i \leftarrow 1, n do
 4:
                                                                                                                        ▷ Base cases
             memorized[i, n+1] \leftarrow \text{an empty list}
 5:
        end for
 6:
        for j \leftarrow n, 1 do
                                                                     ▷ Now we calculate the longest increasing subsequence
 7:
            for i \leftarrow 1, j do
 8:
 9:
                 if set[i].b > set[j].b then
                     memorized[i, j] \leftarrow memorized[i, j + 1]
10:
11:
                     memorized[i, j] \leftarrow \text{whichever of } memorized[i, j + 1] \text{ and } [set[j]] + memorized[j, j + 1] \text{ has}
12:
    the longer length
                 end if
13:
             end for
14:
        end for
15:
        return memorized[0,1]
17: end function
```

Here we attempt to find the largest subset of non-intersecting line segments. To do this, we first sort the list of non-intersecting line segments by the x-value of the first point. Now, we need only examine the x-value of the second point to determine if two line segments intersect; we are guaranteed that, for some line segments  $X_1$  and  $X_2$ , if  $X_2$  is sorted after  $X_1$ , then the only way  $X_1$  and  $X_2$  can intersect is if the second point of  $X_1$  is greater than the second point of  $X_2$ .

Now, the problem transforms into a modified longest increasing subsequence; we simply must test that the second point of each line segment is increasing, and we are guaranteed that no line segments will intersect.

As sorting can be done in  $n \log n$  time, and the longest increasing subsequence has  $O(n^2)$  runtime, our algorithm has a runtime of  $O(n^2)$ .

Oh, no! You have been appointed as the organizer of Giggle, Inc.'s annual mandatory holiday party! The employees at Giggle are organized into a strict hierarchy, that is, a tree with the company president at the root. The all-knowing oracles in Human Resources have assigned a real number to each employee measuring how "fun" the employee is. In order to keep things social, there is one restriction on the guest list: an employee cannot attend the party if their immediate supervisor is also present. On the other hand, the president of the company *must* attend the party, even though she has a negative fun rating; it's her company, after all. Give an algorithm that makes a guest list for the party that maximizes the sum of the "fun" ratings of the guests.

## Solution

```
Algorithm 5 Most fun party attendance
```

```
1: function MostFunParty(root)
                                                                                                  ⊳ Do a breadth-first traversal
        queue \leftarrow [root]
 3:
        i \leftarrow 1
        while i \le the length of queue do
 4:
            current \leftarrow queue[i]
 5:
            if current.left exists then
 6:
                push current.left onto queue
 7:
            end if
 8:
            if current.right exists then
 9:
                push current.right onto queue
10:
            end if
11:
            i \leftarrow i + 1
12:
        end while
13:
        reverse queue
14:
        n \leftarrow \text{the length of } queue
15:
        for i \leftarrow 1, n do
16:
            current \leftarrow queue[i]
17:
            maxA \leftarrow current.fun
18:
            listA \leftarrow [current]
                                                                                          ▶ if the root is included in the party
19:
            maxB \leftarrow 0
20:
            listB \leftarrow []
21:
                                                                                     ▶ if the root is not included in the party
            for all child in current.children do
22:
                maxB \leftarrow maxB + fun[child]
23:
                listB \leftarrow listB + list[child]
                                                                       ▶ the children can only be included if the root is not
24:
                for all grandchild in child.children do
25:
                     maxA \leftarrow maxA + fun[grandchild]
26:
                end for
27:
            end for
28:
        end for
30: end function
```

First, we perform a breadth-first search of the tree. Then, we reverse the resulting list of nodes. This gives us a list which starts with leaf nodes, and then reaches the root at the very end of the list.

Next, we can go through the list and define sub-problems.