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CSCI 3104  
Problem Set 6

Profs. Grochow & Layer  
Spring 2019, CU-Boulder

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1. As a budding expert in algorithms, you decide that your semester service project will be to offer free technical interview prep sessions to your fellow students. Not surprisingly, you are immediately swamped with appointment requests at all different times from students applying many different companies, some with more rigorous interviews than others (i.e., some will need more help than others). Let  $A$  be the set of  $n$  appointment requests. Each appointment  $a_i$  in  $A$  is a pair  $(start_i, end_i)$  of times and  $end_i > start_i$ . To manage all of these requests and to help the most student students that you can, you develop a greedy algorithm to help you manage which appointments you can keep and which ones you have to drop (you can only tutor one student at a time).

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- (a) (2 points) Draw an example with at least 5 appointments where a greedy algorithm that selects the shortest appointment will fail.

$$A = \left[ (1:00, 1:25), (1:30, 1:55), \right. \\ (2:20, 2:35), (2:00, 2:25), \\ \left. (2:30, 2:55) \right]$$

Greedy

- ① 2:20 → 2:35
- ② 1:00 → 1:25
- ③ 1:30 → 1:55

vs

Optimal

- ① 1:00 → 1:25
- ② 1:30 → 1:55
- ③ 2:00 → 2:25
- ④ 2:30 → 2:55



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- (b) (2 points) Draw an example with at least 5 appointments where a greedy algorithm that selects the longest appointment will fail.

$$A = \left[ (1:00, 3:00), (1:05, 1:15), \right. \\ (1:20, 1:30), (1:35, 1:45) \\ \left. (1:50, 2:00) \right]$$

<u>New Greedy</u>	vs	<u>Optimal</u>
① 1:00 - 3:00		① 1:05 - 1:15
		② 1:20 - 1:30
		③ 1:35 - 1:45
		④ 1:50 - 2:00

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- (c) (6 points) Describe and prove correctness for a greedy algorithm that is guaranteed to choose the subset of appointments that will help the maximum number of students that you help.

DESCRIPTION  
Sort the list by the earliest finishing times  
Then take the first appointment. Reject all  
overlapping appointments. Repeat until you have  
reached the end of your sorted list

Pseudo

```
counter = 0
sortbyend(A)
optimallist[0] = A[0]
for (i = 1 to |A|-1):
    if (A[i].start > optimallist[counter].end):
        counter++
        optimallist[counter] = A[i]
return optimallist
```

Runtime

sort  $\rightarrow \Theta(n \log n)$

loop  $\rightarrow n$

total  $\Theta(n \log n)$



## Proof by contradiction

Given:

- set of appointments =  $s_1, s_2, \dots, s_n$
- optimal solution =  $b_1, b_2, \dots, b_o$
- $|s| \neq |O|$  i.e. optimal solution has less elements than the total number of possible elements

If  $S$  is not an optimal solution, then

set  $O$  contains an element  $b_{n+1}$ .

This appointment starts after  $b_n$  and hence after  $s_n$ . This means that the set of all possible appointments (A) still contains  $b_{n+1}$ .

This implies a contradiction and the element  $b_{n+1}$  does not exist in the set of optimal solutions and therefore,  $n=0$ .

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2. While your algorithm is clearly efficient and can proveably help the most students, you begin to receive complaints from students that you didn't help (i.e., their appointment was not part of the optimal solution). One of the students even offers to pay extra, which gives you a great idea. You will now allow students to make a donation to your favorite charity to make it more likely that their job will be selected. Let each appointment in this new set of appointments  $A$  be a triple  $(start_i, end_i, donation_i)$  of start and end times and donation amounts where  $end_i > start_i$  and  $donation_i > 0$ . You now need to update your algorithm to handle these donations along with the requested appointment times. In this new environment, you are trying to maximize the amount of money you raise for your charity.



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(a) (2 points) Give a specific case where your greedy algorithm would fail.

$$\text{LET } A = \left[ (1:30, 1:40, 0), (1:45, 1:50, 0), \right. \\ \left. (2:00, 2:10, 0), (2:15, 2:25, 0), \right. \\ \left. (1:45, 2:20, 10) \right]$$

Greedy

① 1:30 → 1:40	\$0
② 1:45 → 1:55	\$0
③ 2:00 → 2:10	\$0
④ 2:15 → 2:25	\$0

total: \$0

↗  
New Greedy

① 1:45 → 2:20	\$10
---------------	------

total: \$10

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(b) (5 points) Give a recursive algorithm that would solve this new case.

```
int Newgreedy (int i, int dono)
{
    if (i < 0) return 0;
    if (appointments[i] overlaps schedule):
        return newgreedy (i-1, dono)
    else {
        int took = newgreedy (i-1,
                               dono + appointments[i].dono)
        int left = newgreedy (i-1, dono)
        return max (took, left)
    }
}
```

Runtime  
took  $> 2^n$   
left  
everything else  $\rightarrow \theta(1)$

total =  $\theta(2^n)$



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(c) (3 points) Add memoization to this algorithm.

```
sort by end (A)
// FILL TABLE

table[0] = A[0].done

for (int i=1 to |A|-1):
    int next = next job in array that doesn't overlap
    int total = A[i].profit + A[next].profit
    table[i] = max(total, table[i-1].profit)

return table[i-1]
```

Runtime

sort  $\rightarrow \Theta(n \log n)$

loop  $\rightarrow n$

total =  $\Theta(n \log n)$

(d) (10 points) Give a bottom-up dynamic programming algorithm.

Sort by end (A)

for ( $i = 1$  to  $|A|$ ):

earlierJob[i] = latest job that ends before A[i] starts

OPT[0] = 0

for ( $j = 1$  to  $n$ ):

OPT[j] = max ( A[j].done + OPT[earlierJob[j]],  
OPT[j-1] )

Runtime

sort  $\rightarrow n \log n$

for loop  $\rightarrow n$

2<sup>nd</sup> for loop  $\rightarrow n$

total: sort  $\rightarrow n \log n$



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3. (30 pts) The cashier's (greedy) algorithm for making change doesn't handle arbitrary denominations optimally. In this problem you'll develop a dynamic programming solution which does, but with a slight twist. Suppose we have at our disposal an arbitrary number of *cursed* coins of each denomination  $d_1, d_2, \dots, d_k$ , with  $d_1 > d_2 > \dots > d_k$ , and we need to provide  $n$  cents in change. We will always have  $d_k = 1$ , so that we are assured we can make change for any value of  $n$ . The curse on the coins is that in any one exchange between people, with the exception of  $i = k - 1$ , if coins of denomination  $d_i$  are used, then coins of denomination  $d_{i+1}$  *cannot* be used. Our goal is to make change using the minimal number of these cursed coins (in a single exchange, i.e., the curse applies).

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- (a) (10 points) For  $i \in \{1, \dots, k\}$ ,  $n \in \mathbb{N}$ , and  $b \in \{0, 1\}$ , let  $C(i, n, b)$  denote the number of cursed coins needed to make  $n$  cents in change using only the last  $i$  denominations  $d_{k-i+1}, d_{k-i+2}, \dots, d_k$ , where  $d_{k-i+2}$  is allowed to be used if and only if  $i \leq 2$  or  $b = 0$ . That is,  $b$  is a Boolean "flag" variable indicating whether we are excluding the next denomination  $d_{k-i+2}$  or not ( $b = 1$  means exclude it). Write down a recurrence relation for  $C$  and prove it is correct. Be sure to include the base case.

```
int C(int i, int n, boolean b)
    if (n == 0) return 0
    if (i <= 2) b = true
    if (b == false) return C(i+1, n, !b)

    int counter = 0
    while (n > d[i])
        counter++
        n = n - d[i]
    return counter + C(i+1, n, !b)
```



## Proof by loop invariance

Invariant: counter = number of ' $d[k]$  coins' we used

Initialization:

- counter = 0
- $n$  = # of change still needed
- $n > d[1]$

Maintenance: if  $n > d[k]$  then we can be greedy, and take one of those coins ( $d[k]$ ). This should decrease ' $n$ ' by the amount we took, and increase our counter by one, since we took one coin

Termination: Our loop ends when we can't take any more  $d[k]$  coins.

---

Algorithm logic: Assuming that our loop changes our 'counter' integer by the number of  $d[k]$  coins we can take.

All we need to do is make sure we skip the next denomination ( $d[k+1]$ ) and then continue until  $n = 0$ .

- (b) (10 points) Based on your recurrence relation, describe the order in which a dynamic programming table for  $C(i, n, b)$  should be filled in.

TABLE: # of cents

	1	2	3	4	...	n	→
d <sub>1</sub>							
d <sub>2</sub>							
d <sub>3</sub>							
d <sub>4</sub>							
d <sub>5</sub>							

↓

denominations

Row by row

### Steps

- Fill the top row (d<sub>1</sub>) in with n
- For d<sub>2</sub>, compare by looking backwards  
d<sub>2</sub> spaces or up 1 space  
- take the lower number -
- THE exception: if (b==1) you have  
to look two spaces upwards in your  
comparison



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- (c) (10 points) Based on your description in part (b), write down pseudocode for a dynamic programming solution to this problem, and give a  $\Theta$  bound on its running time (remember, this requires proving both an upper and a lower bound).

// Base case

for ( $i = 1$  to  $n$ ):

table[1][i] = i

for ( $d = 2$  to  $k$ ):

for ( $i = 1$  to  $n$ ):

table[d][i] = min (table[d][i-d.value] + 1,  
table[d-(b+1)][i])

return table[d][i]

where:  
value = denomination  
b = boolean

Runtime

1<sup>st</sup> loop  $\rightarrow n$

2<sup>nd</sup> loop  $\rightarrow |d| * 3^{\text{rd}} \text{ loop} = |d| \cdot n = \boxed{kn}$

3<sup>rd</sup> loop  $\rightarrow n * \Theta(1) = n$

worst case  
 $\hookrightarrow$  upper bound

## Runtime, lower bound

we still have to fill every box in our table. our table is size  $k \cdot n = \boxed{kn}$

Even at our fastest, our runtime

is  $\boxed{\Theta(kn)}$