

# COT 6405: Analysis of Algorithms

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[www.cs.fiu.edu/~giri/teach/6405F19.html](http://www.cs.fiu.edu/~giri/teach/6405F19.html)

# Room Scheduling Problem

- Given a set of requests to use a room
  - [0,6], [1,4], [2,13], [3,5], [3,8], [5,7], [5,9], [6,10], [8,11], [8,12], [12,14]
- Schedule largest number of above requests in the room
- Different approaches
  - Try by hand, exhaustive search, improve an initial solution, iterative methods, divide and conquer, greedy methods, etc.
- **Simple Greedy Selection**
  - Sort by start time and pick in “greedy” fashion
  - Does not work. WHY?
    - [0,6], [6,10] is the solution you will end up with.
- **Other greedy strategies**
  - Sort by length of interval
  - Does not work. WHY?

# Greedy Algorithms

- Given a set of activities  $(s_i, f_i)$ , we want to schedule the maximum number of non-overlapping activities.
- **GREEDY-ACTIVITY-SELECTOR**  $(s, f)$ 
  1.  $n = \text{length}[s]$
  2.  $S = \{a_1\}$
  3.  $i = 1$
  4. for  $m = 2$  to  $n$  do
  5. if  $s_m$  is not before  $f_i$  then
  6.      $S = S \cup \{a_m\}$
  7.      $i = m$
  8. return  $S$

# Why does it work?

## ➤ THEOREM

Let  $A$  be a set of activities and let  $a_1$  be the activity with the earliest finish time. Then activity  $a_1$  is in some maximum-sized subset of non-overlapping activities.

## ➤ PROOF

Let  $S'$  be a solution that does not contain  $a_1$ . Let  $a'_1$  be the activity with the earliest finish time in  $S'$ . Then replacing  $a'_1$  by  $a_1$  gives a solution  $S$  of the same size.

Why are we allowed to replace? Why is it of the same size?

Then apply induction! *How?*

# Why does it work? Contd...

- **First choice was a good choice. Why?**
  - **Because it can be extended to an optimal soln.**
- **If our first choice was a good choice, then?**
  - **Then we can recursively apply correctness to the remainder**

# Recursive Greedy Activity Selector

- Given a set of activities  $(s_i, f_i)$ , we want to schedule the maximum number of non-overlapping activities.
- **GREEDY-ACTIVITY-SELECTOR**  $(s, f, k)$  // Find opt sol for  $A[k..n]$ 
  1. If  $k > n$  then return empty set
  2.  $\text{First} = k+1$
  3. for  $m = k+1$  to  $n$  do
  4.     if  $s_m$  is before  $f_k$  then discard  $s_m$
  5.     if  $a_m = a_{\text{First}}$  then  $\text{First}++$
  6. return  $a_k \cup$  **GREEDY-ACTIVITY-SELECTOR**  $(s, f, \text{First})$

# Greedy Algorithms – Huffman Coding

## ➤ Huffman Coding Problem

**Example:** Release 29.1 of 15-Feb-2005 of [TrEMBL](#) Protein Database contains 1,614,107 sequence entries, comprising 505,947,503 amino acids. There are 20 possible amino acids. What is the minimum number of bits to store the compressed database?

~2.5 G bits or 300MB.

## ➤ How to improve this?

## ➤ Information: Frequencies are not the same.

<b>Ala</b> (A) 7.72	<b>Gln</b> (Q) 3.91	<b>Leu</b> (L) 9.56	<b>Ser</b> (S) 6.98
<b>Arg</b> (R) 5.24	<b>Glu</b> (E) 6.54	<b>Lys</b> (K) 5.96	<b>Thr</b> (T) 5.52
<b>Asn</b> (N) 4.28	<b>Gly</b> (G) 6.90	<b>Met</b> (M) 2.36	<b>Trp</b> (W) 1.18
<b>Asp</b> (D) 5.28	<b>His</b> (H) 2.26	<b>Phe</b> (F) 4.06	<b>Tyr</b> (Y) 3.13
<b>Cys</b> (C) 1.60	<b>Ile</b> (I) 5.88	<b>Pro</b> (P) 4.87	<b>Val</b> (V) 6.66

## ➤ Idea: Use shorter codes for more frequent amino acids and longer codes for less frequent ones.

# Huffman Coding

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2 million characters in file.

A, C, G, T, N, Y, R, S, M

**IDEA 1: Use ASCII Code**

Each need at least 8 bits,

Total = 16 M bits = **2 MB**

**IDEA 2: Use 4-bit Codes**

Each need at least 4 bits,

Total = 8 M bits = **1 MB**

Percentage  
Frequencies

**IDEA 3: Use Variable**

*Length Codes*

		11
A	22	10
T	22	011
C	18	010
G	18	001
N	10	00011
Y	5	00010
R	4	00001
S	4	00000
..	~	

**How to Decode?**

Need Unique decoding!

Easy for Ideas 1 & 2.

What about Idea 3?

110101101110010001100000000110

110101101110010001100000000110

2 million characters in file.

Length = ?

Expected length = ?

Sum up products of frequency times the code length, i.e.,

$(.22 \times 2 + .22 \times 2 + .18 \times 3 + .18 \times 3 + .10 \times 3 + .05 \times 5 + .04 \times 5 + .04 \times 5 + .03 \times 5) \times 2 \text{ M bits} =$

COT 5407 3.24 M bits = **.4 MB**

# New Room Scheduling Problem

- **Room Scheduling with Attendee Numbers:** Given a set of requests to use a room (**with # of attendees**)
  - [1,4] (4), [3,5] (8), [0,6] (5), [5,7] (15), [3,8] (22), [5,9] (6), [6,10] (5), [8,11] (5), [8,12] (14), [2,13] (11), [12,14] (6)
- Schedule requests to **maximize the total # of attendees**
  - Greedy Solution will be [1,4], [5,7], [8,11], [12,14]
  - And will satisfy  $4 + 15 + 5 + 6 = 30$  attendees
  - Greed is not good!

# Dynamic Programming

- **Old Activity Problem Revisited:** Given a set of  $n$  activities  $a_i = (s_i, f_i)$ , we want to schedule the maximum number of non-overlapping activities.
- **General Approach:** Attempt a recursive solution

# Recursive Solution

- **Observation:** To solve the problem on activities  $A = \{a_1, \dots, a_n\}$ , we notice that either
  - optimal solution does not include  $a_n$ 
    - then enough to solve subproblem on  $A_{n-1} = \{a_1, \dots, a_{n-1}\}$
  - optimal solution includes  $a_n$ 
    - Enough to solve subproblem on  $A_k = \{a_1, \dots, a_k\}$ , the set  $A$  without activities that overlap  $a_n$ .

# Recursive Solution

int Rec-ROOM-SCHEDULING (s, f, t, n)

// Here n equals length[s];

// Input: first n requests with their s & f times & # attend

// It returns optimal number of requests scheduled

1. Let k be index of last request with finish time before  $s_n$

2. Output larger of two values:

3. { Rec-ROOM-SCHEDULING (s, f, t, n-1),

Rec-ROOM-SCHEDULING (s, f, t, k) + t[n] }

// t[n] is number of attendees of n-th request

# Observations

- If we look at all subproblems generated by the recursive solution, and ignore repeated calls, then we see the following calls:
  - Rec-ROOM-SCHEDULING ( $s, f, n-1$ )
    - Rec-ROOM-SCHEDULING ( $s, f, n-2$ )
      - ...
    - Rec-ROOM-SCHEDULING ( $s, f, n'$ )
      - ...
  - Rec-ROOM-SCHEDULING ( $s, f, k$ )
    - Rec-ROOM-SCHEDULING ( $s, f, k-1$ )
      - ...
    - Rec-ROOM-SCHEDULING ( $s, f, k'$ )
      - ...
- Above list includes all subproblems **Rec-ROOM-SCHEDULING ( $s, f, i$ )** for all values of  $i$  between 1 and  $n$

# Dynamic Prog: Room Scheduling

- Let  $A$  be the set of  $n$  activities  $A = \{a_1, \dots, a_n\}$  (sorted by finish times).
- The inputs to the subproblems are:
  - $A_1 = \{a_1\}$
  - $A_2 = \{a_1, a_2\}$
  - $A_3 = \{a_1, a_2, a_3\}, \dots,$
  - $A_n = A$
- $i$ -th Subproblem: Select the max number of non-overlapping activities from  $A_i$

# An efficient implementation

- Why not solve the subproblems on  $A_1, A_2, \dots, A_{n-1}, A_n$  in that order?
- Is the problem on  $A_1$  easy?
- Can the optimal solutions to the problems on  $A_1, \dots, A_i$  help to solve the problem on  $A_{i+1}$ ?
- YES! Either:
  - optimal solution does not include  $a_{i+1}$ 
    - problem on  $A_i$
  - optimal solution includes  $a_{i+1}$ 
    - problem on  $A_k$  (equal to  $A_i$  without activities that overlap  $a_{i+1}$ )
    - but this has already been solved according to our ordering.

# Dynamic Prog: Room Scheduling

- Solving for  $A_n$  solves the original problem.
- Solving for  $A_1$  is easy.
- If you have optimal solutions  $S_1, \dots, S_{i-1}$  for subproblems on  $A_1, \dots, A_{i-1}$ , how to compute  $S_i$ ?
- Recurrence Relation:
  - The optimal solution for  $A_i$  either
    - Case 1: does not include  $a_i$  or
    - Case 2: includes  $a_i$
  - Case 1:  $S_i = S_{i-1}$
  - Case 2:  $S_i = S_k \cup \{a_i\}$ , for some  $k < i$ .
    - How to find such a  $k$ ? We know that  $a_k$  cannot overlap  $a_i$ .

# DP: Room Scheduling w/ Attendees

## ► DP-ROOM-SCHEDULING-W-ATTENDEES (s, f, t)

1.  $n = \text{length}[s]$
2.  $N[1] = t_1$  // number of attendees in  $S_1$
3.  $F[1] = 1$  // last activity in  $S_1$
4. for  $i = 2$  to  $n$  do
5.   let  $k$  be the last activity finished before  $s_i$
6.   if  $(N[i-1] > N[k] + t_i)$  then // **Case 1**
7.      $N[i] = N[i-1]$
8.      $F[i] = F[i-1]$
9.   else // **Case 2**
10.     $N[i] = N[k] + t_i$
11.     $F[i] = i$
12. Output  $N[n]$

How to output  $S_n$ ?  
 Backtrack!  
 Time Complexity?  
 $O(n \lg n)$

# Approach to DP Problems

- Write down a recursive solution
- Use recursive solution to identify list of **subproblems** to solve (there must be overlapping subproblems for effective DP)
- Decide a data structure to store solutions to subproblems (**MEMOIZATION**)
- Write down **Recurrence relation** for solutions of subproblems
- Identify a **hierarchy/order** for subproblems
- Write down non-recursive solution/algorithm

# Longest Common Subsequence

$S_1 = \text{CORIANDER}$      **COR**IANDER

$S_2 = \text{CREDITORS}$      **CRED**ITORS

Longest Common Subsequence( $S_1[1..9]$ ,  $S_2[1..9]$ )  
= **CRIR**

# Recursive Solution

**LCS( $S_1, S_2, m, n$ )**

//  $m$  is length of  $S_1$  and  $n$  is length of  $S_2$

// Returns length of longest common subsequence

1. If ( $S_1[m] == S_2[n]$ ), then
2.     return  $1 + \text{LCS}(S_1, S_2, m-1, n-1)$
3. Else return larger of
4.      $\text{LCS}(S_1, S_2, m-1, n)$  and  $\text{LCS}(S_1, S_2, m, n-1)$

Observation:

All the recursive calls correspond to subproblems to solve and they include  $\text{LCS}(S_1, S_2, i, j)$  for all  $i$  between 1 and  $m$ , and all  $j$  between 1 and  $n$

# Recurrence Relation & Memoization

## ➤ Recurrence Relation:

➤  $LCS[i,j] = LCS[i-1, j-1] + 1$ , if  $S_1[i] = S_2[j]$

$LCS[i,j] = \max \{ LCS[i-1, j], LCS[i, j-1] \}$ , otherwise

## ➤ Table ( $m \times n$ table)

## ➤ Hierarchy of Solutions?

➤ Solve in row major order

# LCS Problem

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LCS\_Length (X, Y )

1.  $m \leftarrow \text{length}[X]$
2.  $n \leftarrow \text{Length}[Y]$
3. for  $i = 1$  to  $m$
4. do  $c[i, 0] \leftarrow 0$
5. for  $j = 1$  to  $n$
6. do  $c[0, j] \leftarrow 0$
7. for  $i = 1$  to  $m$
8.     do for  $j = 1$  to  $n$
9.         do if (  $x_i = y_j$  )
10.             then  $c[i, j] \leftarrow c[i-1, j-1] + 1$
11.              $b[i, j] \leftarrow \text{“}\nwarrow\text{”}$
12.             else if  $c[i-1, j] > c[i, j-1]$
13.                 then  $c[i, j] \leftarrow c[i-1, j]$
14.                  $b[i, j] \leftarrow \text{“}\uparrow\text{”}$
15.             else
16.                  $c[i, j] \leftarrow c[i, j-1]$
17.                  $b[i, j] \leftarrow \text{“}\leftarrow\text{”}$
18. return  $c[m, n]$

17. COT 5407

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