

# Greedy Algorithms

## CSCI 532

# Single Room Scheduling

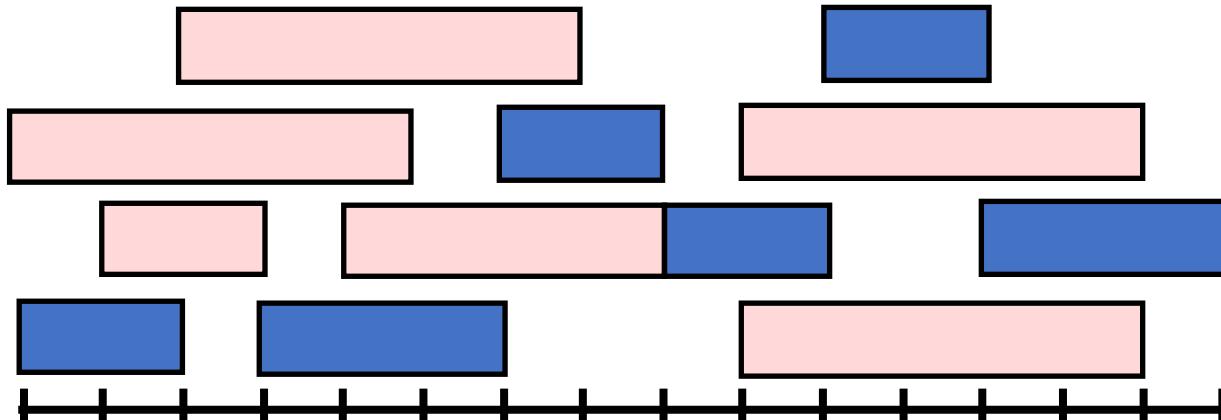
Input:

- $C = \{c_1, c_2, \dots, c_n\}$  – set of courses that need rooms.
- $c_i = [s_i, f_i)$  – start and finish times for each course.

Rules:

- $c_i$  and  $c_j$  are compatible if  $[s_i, f_i)$  and  $[s_j, f_j)$  do not overlap.

Goal: Select a maximum sized subset of compatible courses.



Greedy selection criteria?

Earliest compatible finish.

In each iteration, pick the course that ends earliest and is compatible with existing schedule.

# Single Room Scheduling

Greedy decision: Select the next course with the earliest compatible finish time.

Proof of optimality: Let  $C$  be the set of courses,  $S_{ALG} \subseteq C$  be the greedy algorithm's selection, and  $S_{OPT} \subseteq C$  be an optimal selection, all sorted by increasing finish time.

Suppose  $S_{ALG}[i] = S_{OPT}[i]$ , for all  $i < k$  and  $S_{ALG}[k] = c_i \neq c_j = S_{OPT}[k]$ .

Create the revised schedule  $S'_{OPT} = S_{OPT} \setminus \{c_j\} \cup \{c_i\}$ . (I.e., Swap  $S_{ALG}[k]$  for  $S_{OPT}[k]$ )

$c_i$  is compatible with previous courses in  $S'_{OPT}$  since  $S_{ALG}[i] = S_{OPT}[i] = S'_{OPT}[i]$ , for all  $i < k$

$c_i$  is compatible with subsequent courses in  $S'_{OPT}$  since  $f_i \leq f_j$ . Otherwise, the greedy algorithm would have selected  $c_j$  instead of  $c_i$ .

So  $S'_{OPT}$  is a valid schedule with the same number of courses as  $S_{OPT}$ , so  $S'_{OPT}$  is also optimal.

$S'_{OPT}:$



$S_{ALG}:$



# Room Minimization

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Goal: Compatibly schedule all courses with the min number of rooms.

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Algorithm Idea?

Assign as much as possible to room 1,  
then as much as possible to room 2,...

Optimal?

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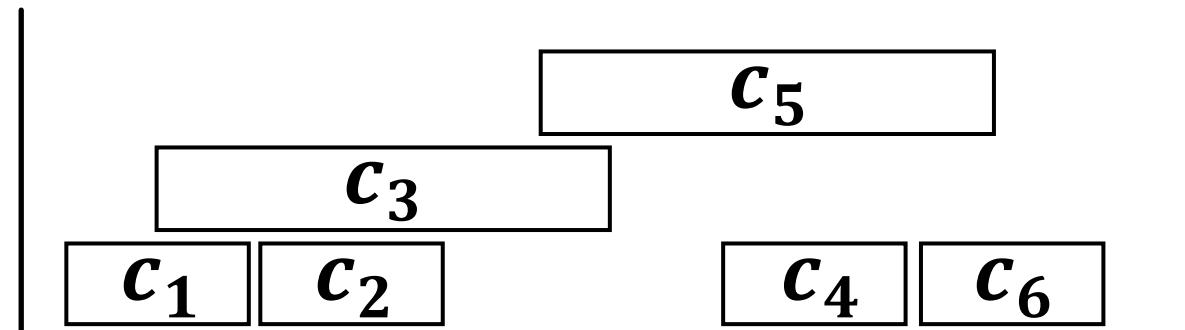
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Algorithm Idea?

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Optimal? No!



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Given  $C$ , what is the smallest number of rooms possible?

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Given  $C$ , what is the smallest number of rooms possible?  
The number of concurrent courses.

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Algorithm Idea?

Given  $C$ , what is the smallest number of rooms possible?

The number of concurrent courses.

What if we made a schedule where # rooms = # concurrent courses?

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Algorithm Idea?

Given  $C$ , what is the smallest number of rooms possible?  
The number of concurrent courses.

What if we made a schedule where # rooms = # concurrent courses?  
It must be optimal.

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Goal: Compatibly schedule all courses with the min number of rooms.

Algorithm Idea?

Occupied Rooms

Unoccupied Rooms

But previously  
occupied

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At each time:

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Goal: Compatibly schedule all courses with the min number of rooms.

Algorithm Idea?

At each time:

1. When course ends, move its **occupied room** to **unoccupied rooms**.

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Unoccupied Rooms

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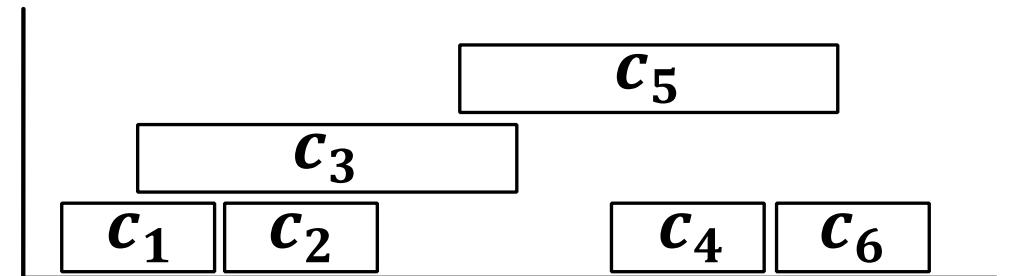
1. When course ends, move its **occupied room** to **unoccupied rooms**.
2. When course starts, **select unoccupied room**. If none exists, select a new (never used) room.

```

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  F = B = S = ∅
  room_num = 0
  foreach timeslot t
    foreach c in C
      if c.finish == t
        F.add(B.getBookedRoom(S.getroom(c)))
    foreach c in C
      if c.start == t
        if F.isEmpty()
          room_num += 1
          F.add(room_num)
          room = F.getFreeRoom()
          S.schedule(c, room)
          B.add(room)
  return S

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**F = Unoccupied Rooms**  
**B = Occupied Rooms**  
**S = course -> room Map**

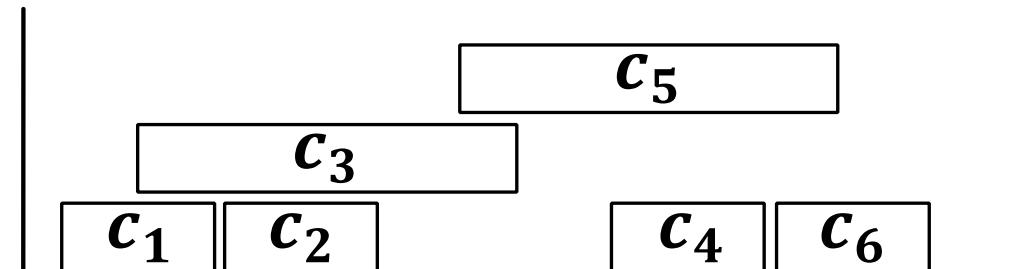


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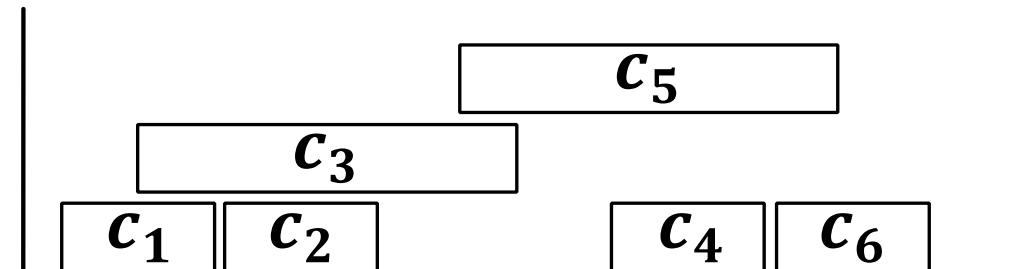
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Go through one timeslot at a time

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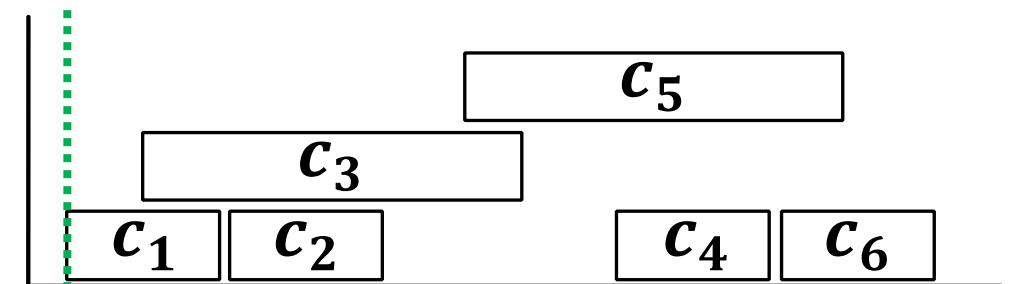
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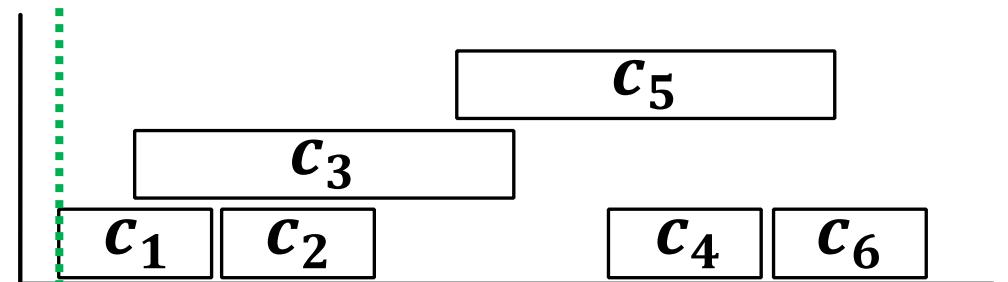
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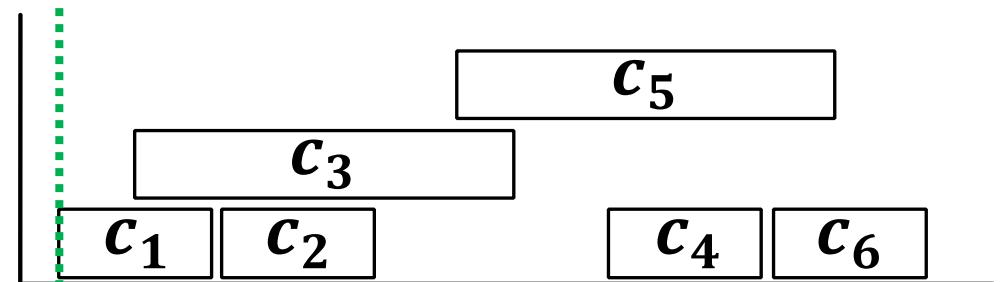
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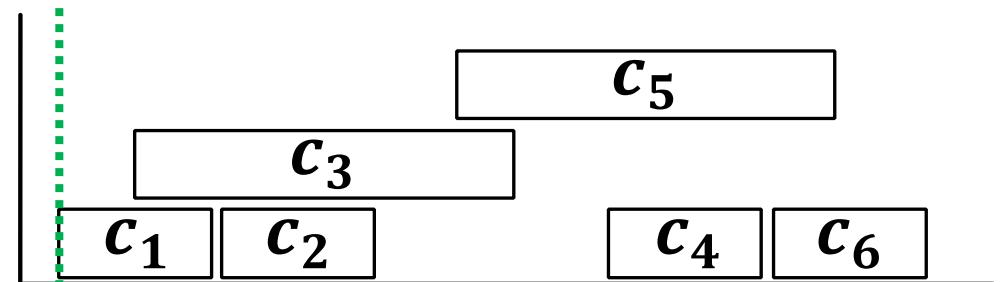
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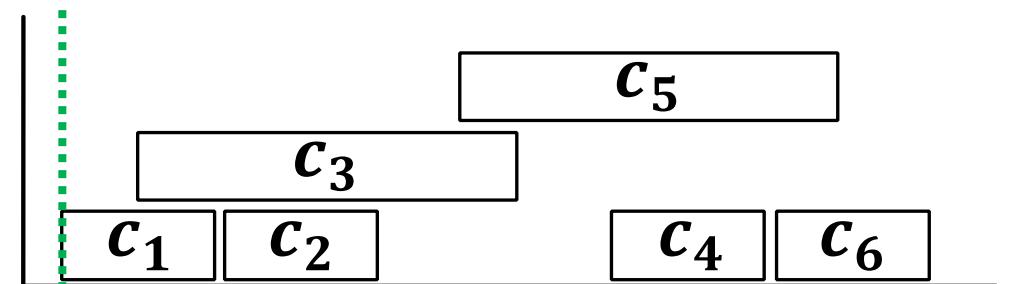
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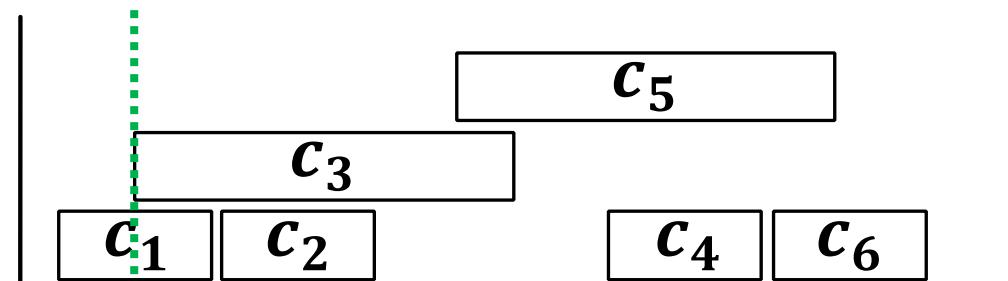
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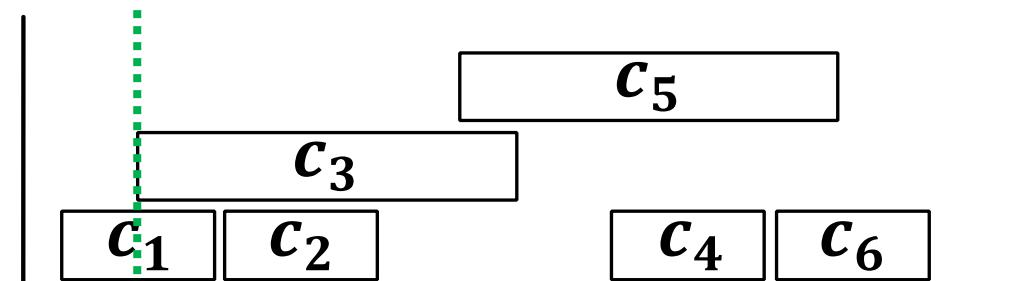
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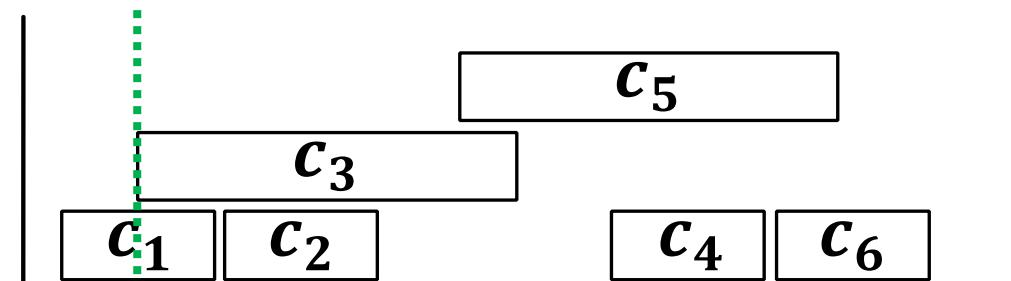
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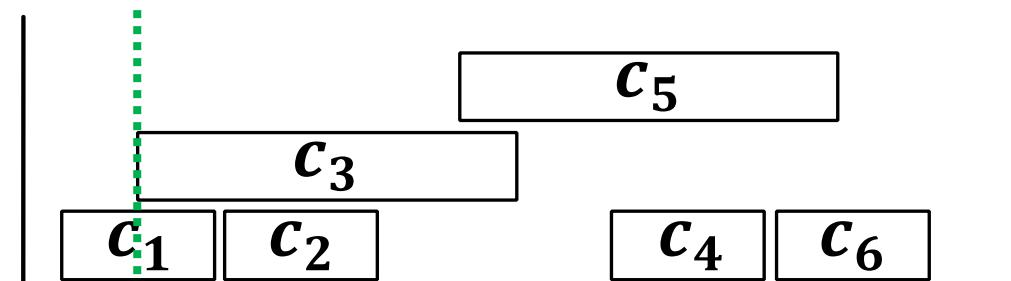
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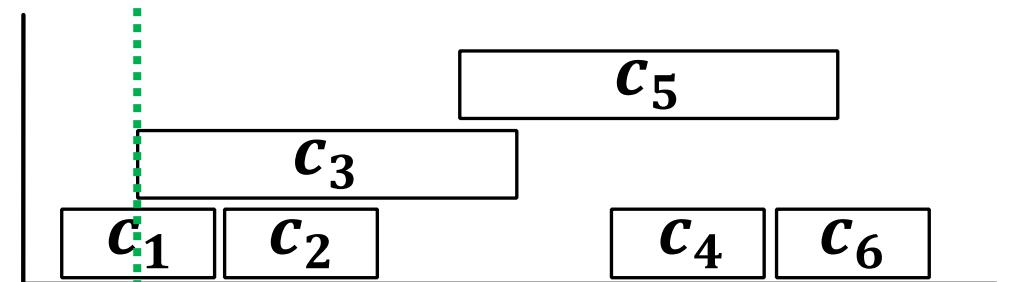
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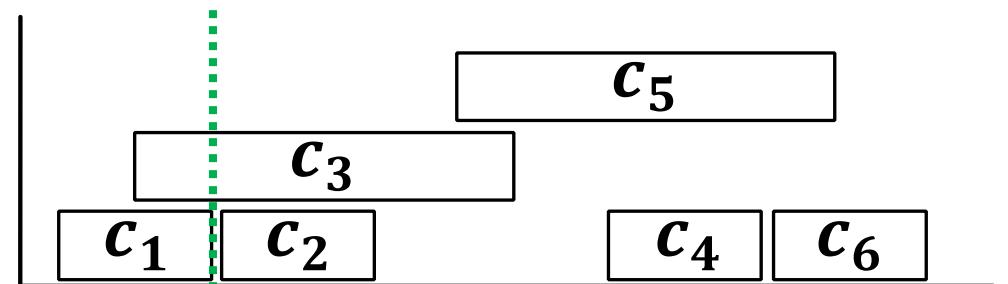
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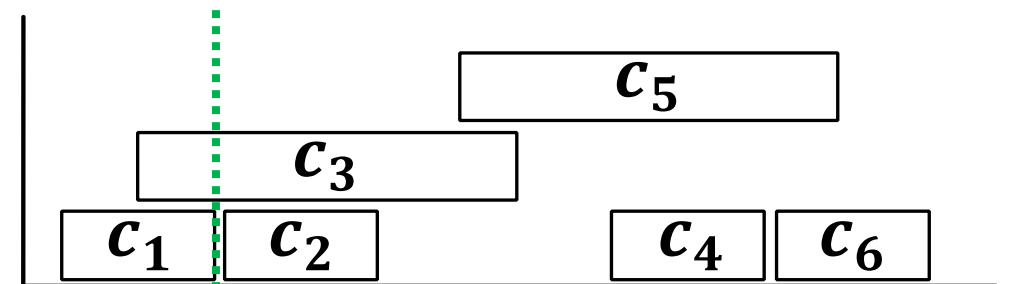
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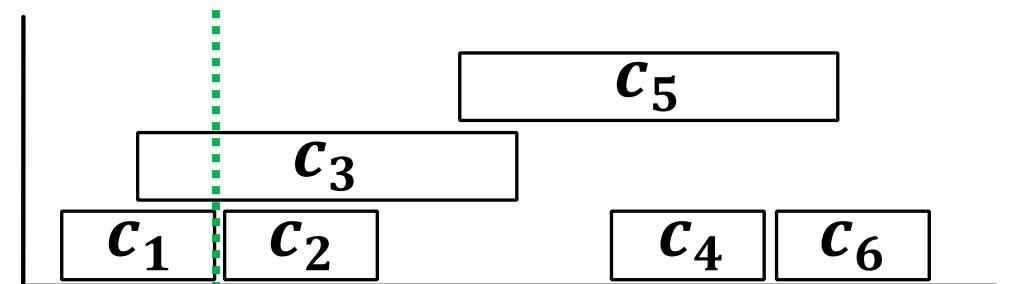
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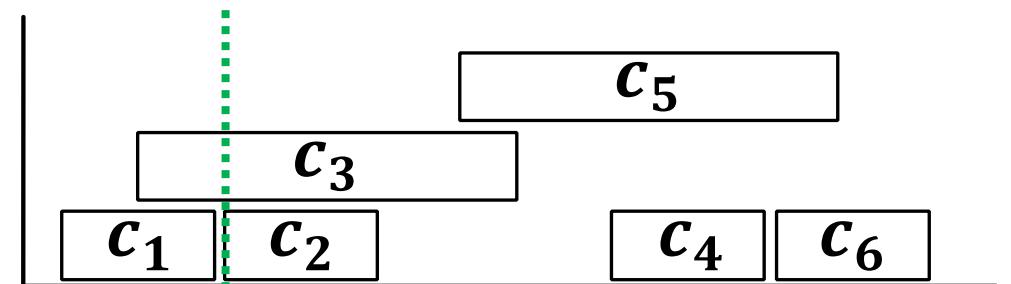
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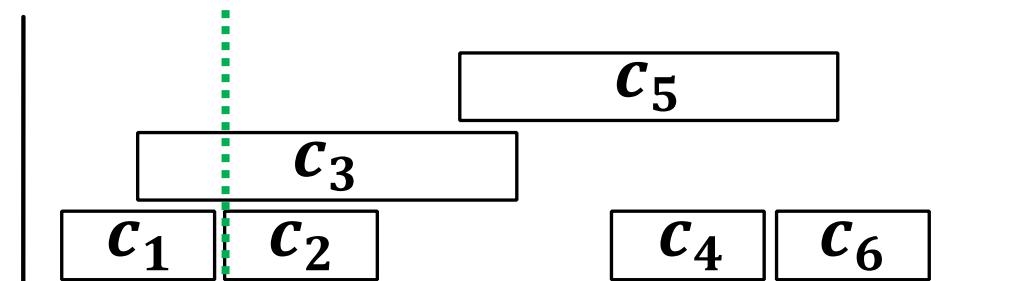
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        F.add(B.getBookedRoom(S.getroom(c)))
    foreach c in c
      if c.start == t
        if F.isEmpty()
          room_num += 1
          F.add(room_num)
          room = F.getFreeRoom()
          S.schedule(c, room)
          B.add(room)
  return S

```

**F = Unoccupied Rooms**  
**B = Occupied Rooms**  
**S = course -> room Map**



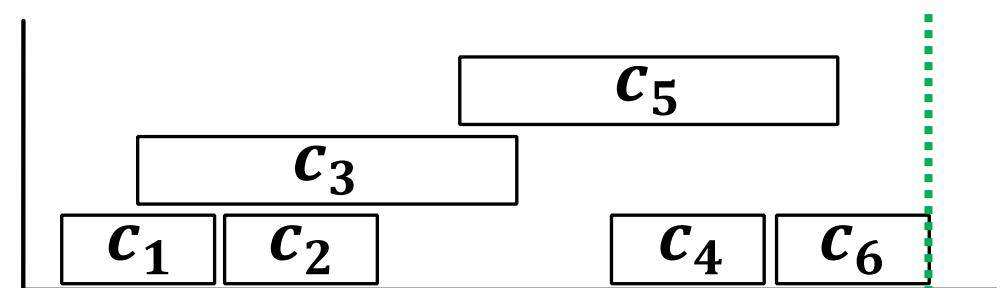
$$\begin{aligned}
F &= \{\} \\
B &= \{2, 1\} \\
S &= \{c_1 \rightarrow 1, c_3 \rightarrow 2, c_2 \rightarrow 1\}
\end{aligned}$$

```

room_minimization(courses C)
  F = B = S = ∅
  room_num = 0
  foreach timeslot t
    foreach c in C
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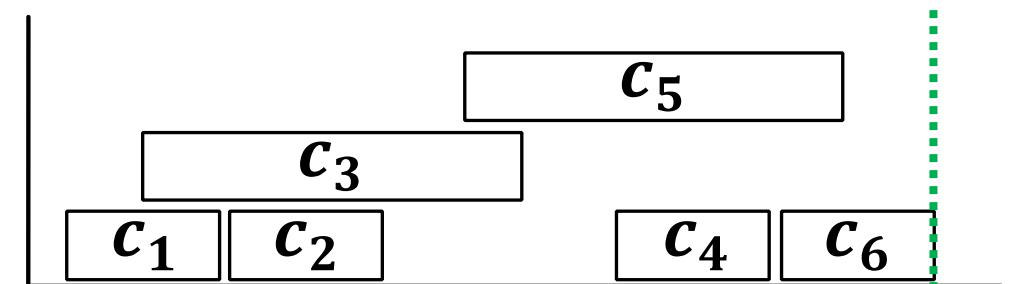
$$\begin{aligned}
 F &= \{1, 2\} \\
 B &= \{\} \\
 S &= \{c_1 \rightarrow 1, c_3 \rightarrow 2, c_2 \rightarrow 1, \dots\}
 \end{aligned}$$

```

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Valid?



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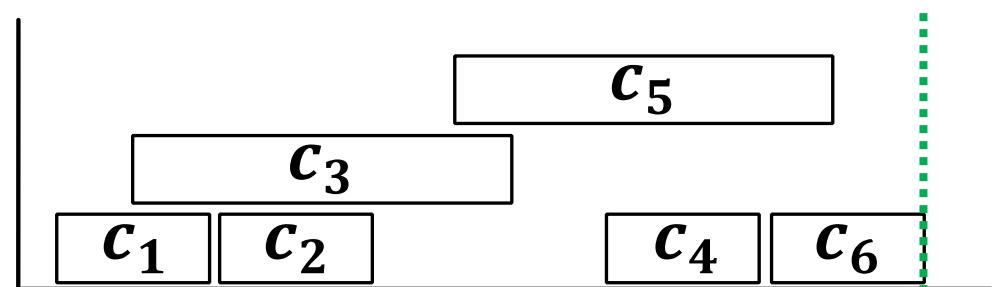
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          F.add(room_num)
          room = F.getFreeRoom()
          S.schedule(c, room)
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```

Valid?

Yes. Each course is given a room and no rooms are concurrently occupied.



$$F = \{1, 2\}$$

$$B = \{\}$$

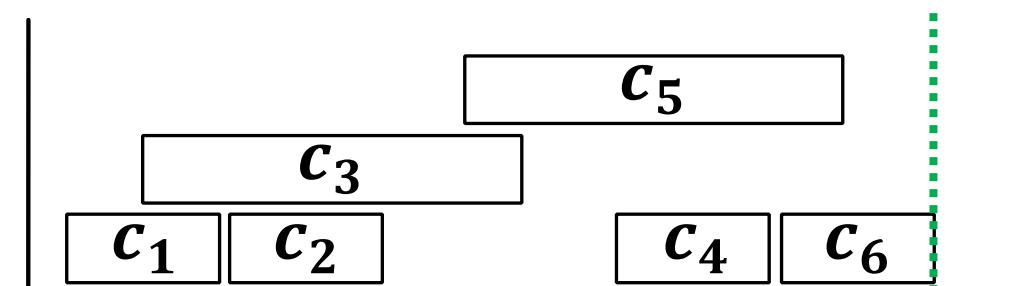
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Running Time?



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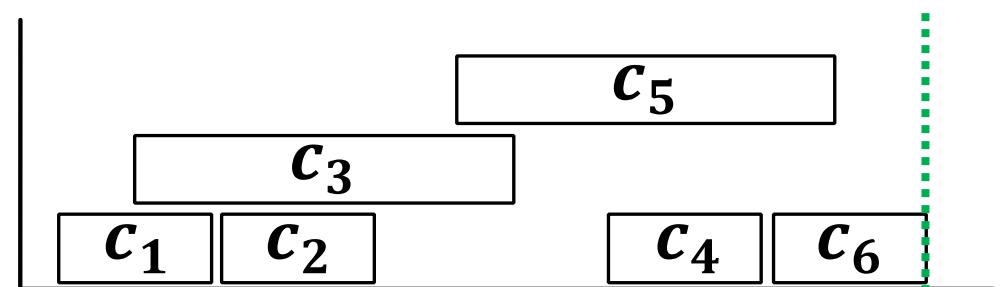
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```

Running Time?

$O(|C|^2)$  – Don't need to go through all timeslots. Just start/finish for each activity.



$$F = \{1, 2\}$$

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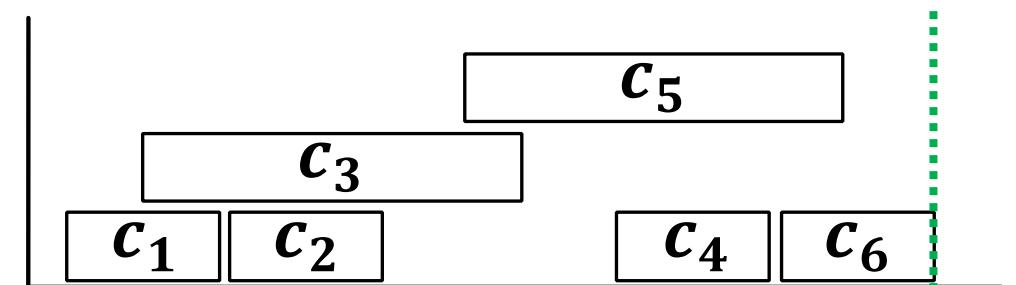
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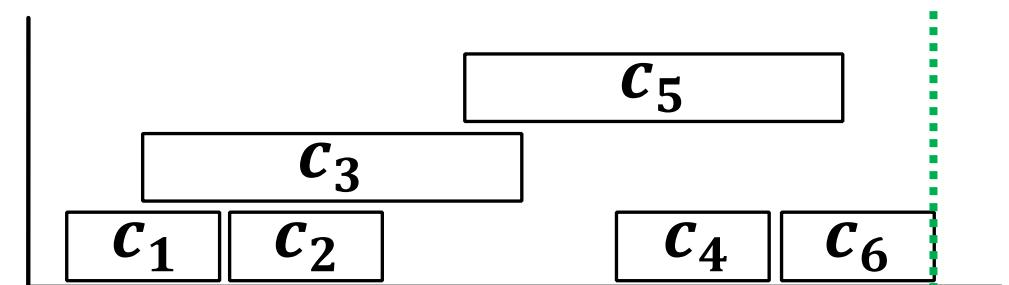
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# rooms needed  $\geq$  # concurrent courses.



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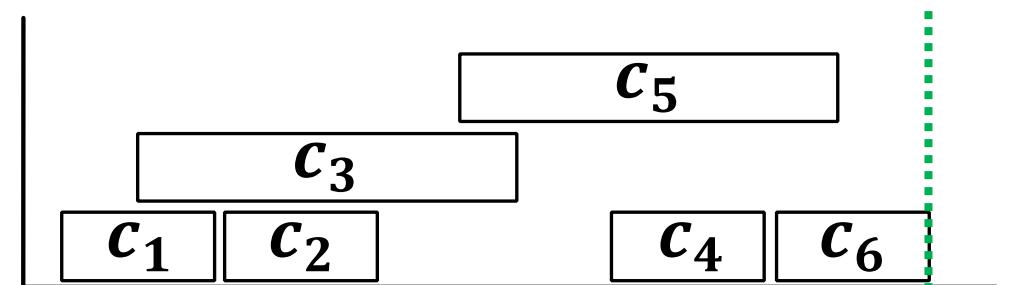
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# rooms needed  $\geq$  # concurrent courses.  
 New room added  $\Leftrightarrow$  all other rooms in use



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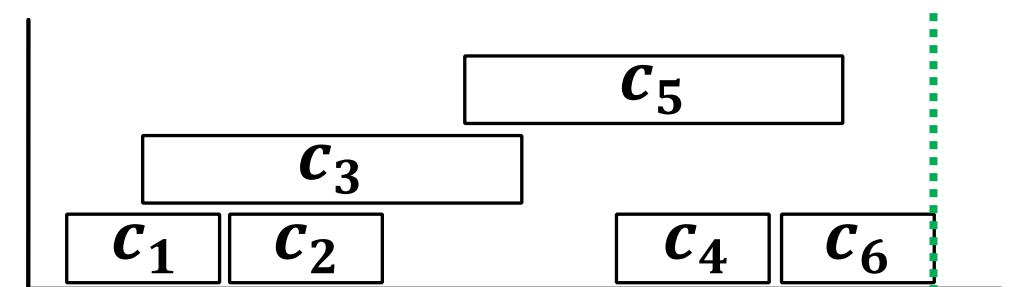
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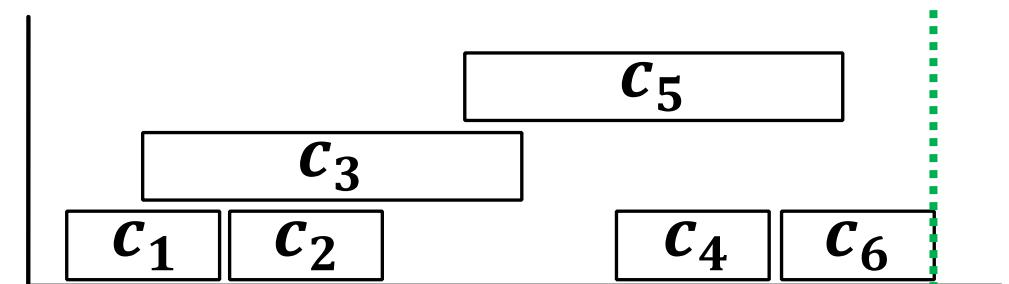
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Optimal?

# rooms needed  $\geq$  # concurrent courses.  
 New room added  $\Leftrightarrow$  all other rooms in use  
 (i.e., # rooms used = max[# concurrent courses])  
 So, yes.



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# Client Scheduling

Suppose you are a plumber and you have a list of clients that want help.

# Client Scheduling

- $d_i$ : deadline for client  $i$ .
- $t_i$ : time required for client  $i$ .

Client	$d_i$	$t_i$
1	5	3
2	6	4
3	8	3

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Each client  $i$  has a deadline  $d_i$  of when they need help by and an amount of time  $t_i$  they will need help for.

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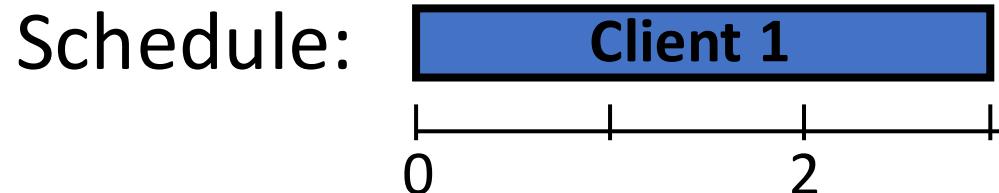
You cannot help multiple clients at the same time and cannot pause helping one to help another.

You need to help all clients, even if it goes over their deadline (though they will be angry then).

# Client Scheduling

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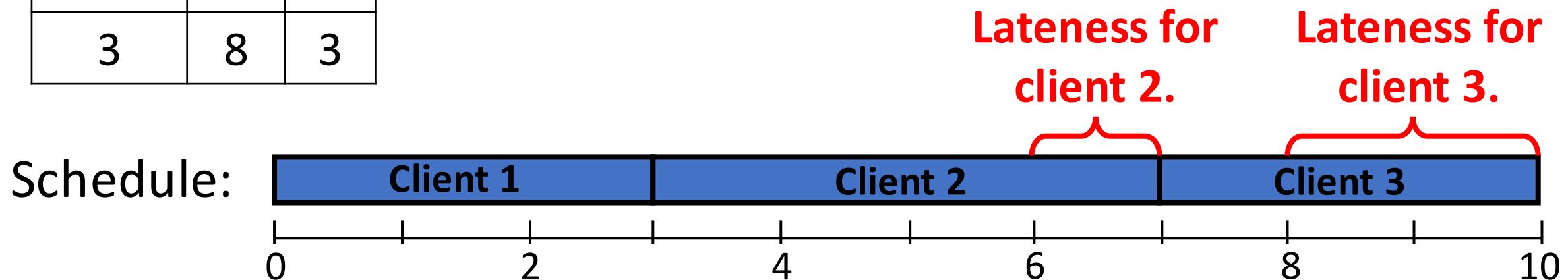


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- $f(i) = s(i) + t_i$ : finish time for client  $i$ .
- $l_i = f(i) - d_i$ : lateness for client  $i$ .

Client	$d_i$	$t_i$
1	5	3
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3	8	3

The lateness of a client is the amount of time past their deadline their request took.



# Client Scheduling

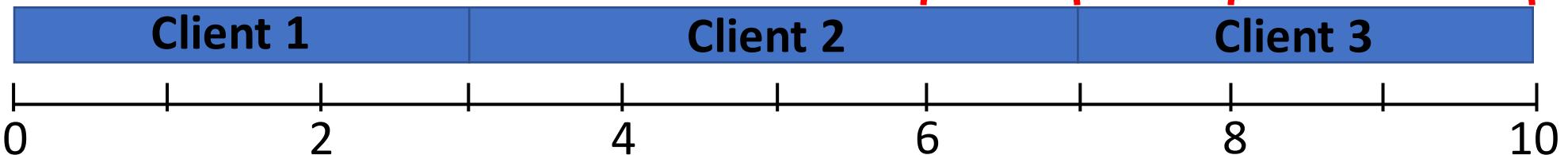
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We want a schedule that minimizes the lateness of the latest client.

Schedule:



# Client Scheduling

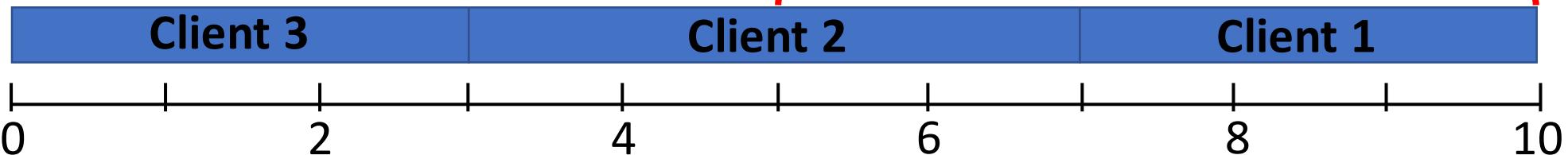
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What are some possible Greedy decisions?

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**How to decide which to use?**

# Greedy Decision

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**How to decide which to use?  
Hunt for counterexamples.**

# Greedy Decision

What are some possible Greedy decisions?

Algorithm: 2 then 1,  
lateness of 1.

- Smallest  $t_i$  first.



Optimal: 1 then 2,  
lateness of 0.

- Smallest slack time ( $d_i - t_i$ ) first.

- Earliest  $d_i$  first.

# Greedy Decision

What are some possible Greedy decisions?

Algorithm: 2 then 1,  
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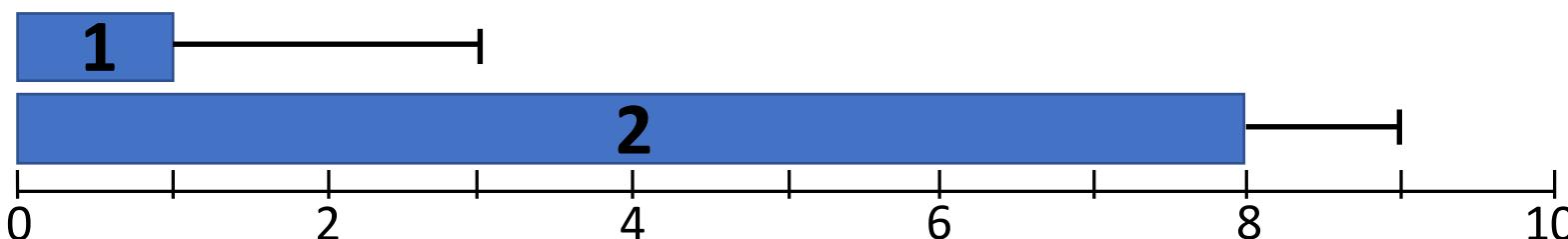
- Smallest  $t_i$  first.



Optimal: 1 then 2,  
lateness of 0.

- Smallest slack time ( $d_i - t_i$ ) first.

Algorithm: 2 then 1,  
lateness of 6.



Optimal: 1 then 2,  
lateness of 0.

- Earliest  $d_i$  first.

# Earliest Deadline First Algorithm

1. Order clients by increasing deadline.
2. Rename so that  $d_1 \leq \dots \leq d_n$ .
3. Let  $s(1) = 0$ . (implies that  $f(1) = t_1$ )
4. For each subsequent (in order) client  $c$ ,  
$$s(c) = f(c - 1) \text{ and } f(c) = s(c) + t_c.$$

# Earliest Deadline First Algorithm

Theorem: The maximum lateness given by a schedule from the EDF algorithm is optimal.

Plan of attack:

# Earliest Deadline First Algorithm

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Plan of attack: Consider an optimal schedule, modify it in such a way that optimality is preserved until it is the same as our schedule.

How could our schedule differ from optimal?

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Theorem: The maximum lateness given by a schedule from the EDF algorithm is optimal.

Plan of attack: Consider an optimal schedule, modify it in such a way that optimality is preserved until it is the same as our schedule.

How could our schedule differ from optimal?

1. Gaps in schedules.
2. Clients out of order.

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Could there be gaps in our schedule?

No – as soon as one client is finished,  $f(c)$ , the next client starts,  $s(c + 1) = f(c)$ .

# Earliest Deadline First Algorithm

Lemma: An optimal schedule exists that has no gaps between clients.

Proof: ?

# Earliest Deadline First Algorithm

Lemma: An optimal schedule exists that has no gaps between clients.

Proof: Since all clients are available to start at the same time, they can be scheduled one after the other without gaps. If an optimal schedule exists with gaps, those gaps can be removed by shifting clients forward without increasing the maximum lateness.

# Earliest Deadline First Algorithm

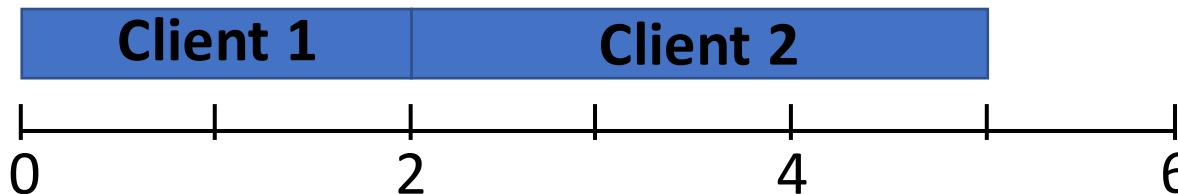
Definition: A schedule has an *inversion* if some client is scheduled before a client with an earlier deadline.

Client 1: Client 2:

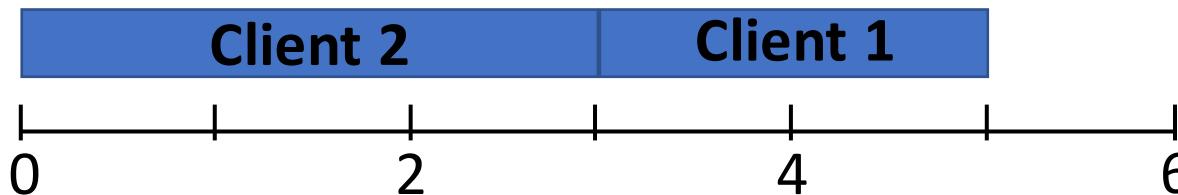
$$d_1 = 5 \quad d_2 = 6$$

$$t_1 = 2 \quad t_2 = 3$$

No Inversion:



Inversion:



# Earliest Deadline First Algorithm

Definition: A schedule has an *inversion* if some client is scheduled before a client with an earlier deadline.

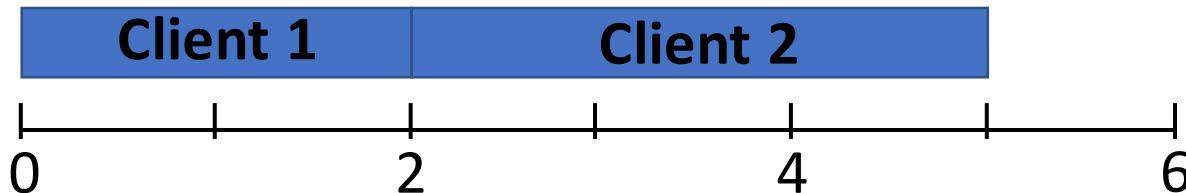
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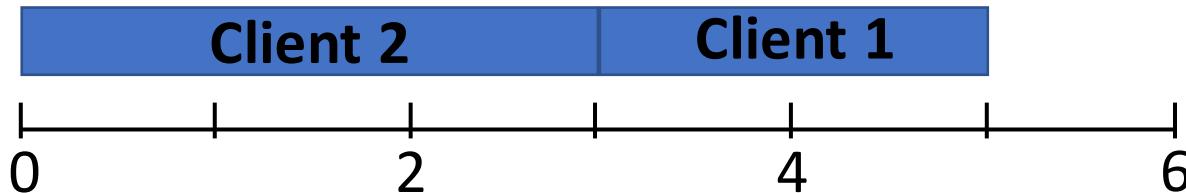
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Does our schedule have any inversions?

No Inversion:



Inversion:



# Earliest Deadline First Algorithm

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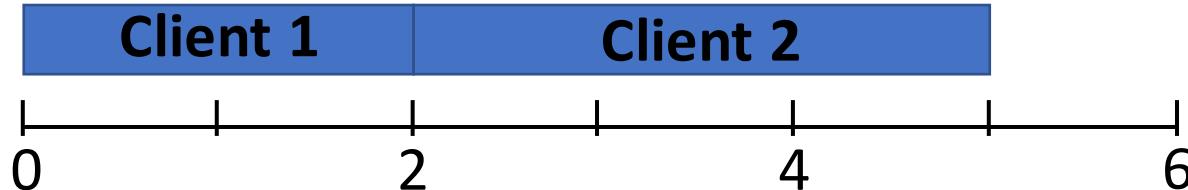
$$d_2 = 6$$

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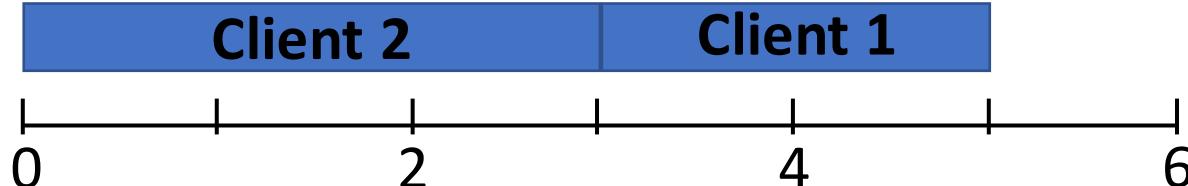
Does our schedule have any inversions?

No – The algorithm schedules client  $i$  before client  $j$  if  $d_i \leq d_j$

No Inversion:



Inversion:



# Earliest Deadline First Algorithm

Lemma: An optimal schedule exists that has no inversions.

Proof:

# Earliest Deadline First Algorithm

Lemma: An optimal schedule exists that has no inversions.

Proof:

1. Any inversion results from two consecutive inverted clients.
2. Swapping an inversion reduces the number of inversions.
3. Swapping an inversion does not increase the maximum lateness of the schedule.

# Earliest Deadline First Algorithm

3. Swapping an inversion does not increase the maximum lateness of the schedule.

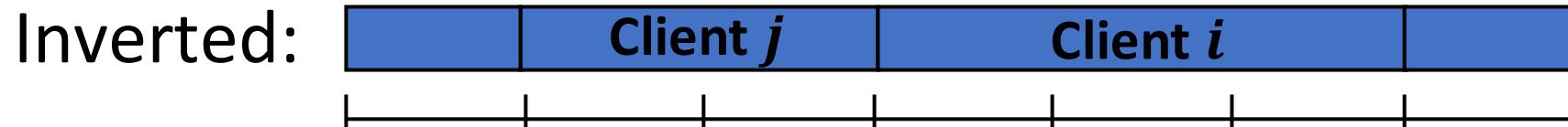
Proof: Whose lateness does swapping consecutive clients affect?



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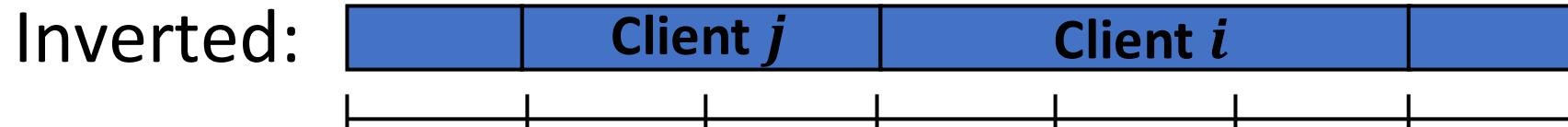
Proof: The lateness is less for the client swapped earlier, later for the client swapped later, and the same for all other clients (because inverted  $f(i) =$  swapped  $f(j)$ ).



# Earliest Deadline First Algorithm

3. Swapping an inversion does not increase the maximum lateness of the schedule.

Proof: The only client we need to consider is the one swapped to be later (because all other clients remain the same or have smaller lateness).



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$l_j' \ ? \ l_i$



Remember:

- $l_j = f(j) - d_j$
- $d_i \leq d_j$

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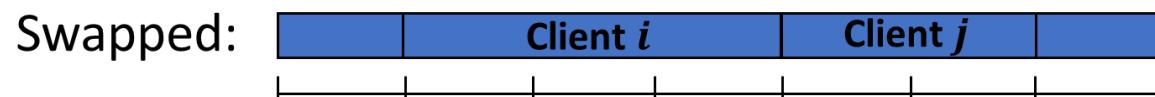
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$$l_j' = f'(j) - d_j = f(i) - d_j \leq f(i) - d_i = l_i$$



Remember:

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Let  $s'(i), f'(i), l_i'$  be for swapped schedule.

$$l_j' = f'(j) - d_j = f(i) - d_j \leq f(i) - d_i = l_i$$

⇒ The maximum lateness was not increased!

# Earliest Deadline First Algorithm

Theorem: The maximum lateness given by a schedule from the EDF algorithm is optimal.

Proof: The EDF schedule can only differ from an optimal schedule by the order of clients with identical deadlines (since both have no gaps or inversions).

Does the ordering of these clients lead to different maximal lateness?

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Thus, all schedules with no inversions or gaps have the same maximal lateness.

Therefore, the EDF schedule is optimal.