

# **GREEDY ALGORITHMS**

# INTRODUCTION

- Change Making Problem
- You Purchase a Idli & Half Tea at a canteen.
- Total bill (including GST) is 23rs.
- You pay 100rs note to the cashier.
- The balance amount is 77rs.
- What will be the approach of the cashier to pay you the balance?

# INTRODUCTION

- Cashier will first pick 50rs note.
- Then he will pick 20rs note
- OR
- He will pick Two 10rs notes.
- Then he will pick a 5rs coin.
- Then finally a 2rs coin or Two 1rs coins.
- OR
- A 2rs Chocolate

# INTRODUCTION

- Change Making Problem
- At least subconsciously, by millions of cashiers all over the world: give change for a specific amount  $n$  with the least number of coins of the denominations  $d_1 > d_2 > \dots > d_m$  used in that locale.

# INTRODUCTION

- A greedy algorithm is an **algorithmic paradigm** that follows the problem solving heuristic of making the **locally optimal choice** at each stage with the hope of finding a **global optimum**.

# INTRODUCTION

- The greedy approach suggests constructing a solution through a sequence of steps, each expanding a partially constructed solution obtained so far, until a complete solution to the problem is reached.
- On each step the choice made must be:
  - **Feasible**, i.e., it has to satisfy the problem's constraints
  - **Locally Optimal**, i.e., it has to be the best local choice among all feasible choices available on that step

# INTERVAL SCHEDULING PROBLEM

- We have a set of requests  $\{1, 2, \dots, n\}$ .
- The  $i$ th request corresponds to an interval of time starting at  $s(i)$  and finishing at  $f(i)$ .
- We'll say that a subset of the requests is compatible if no two of them overlap in time.
- **Goal** is to accept as large a compatible subset as possible.
- Compatible sets of maximum size will

# INTERVAL SCHEDULING PROBLEM

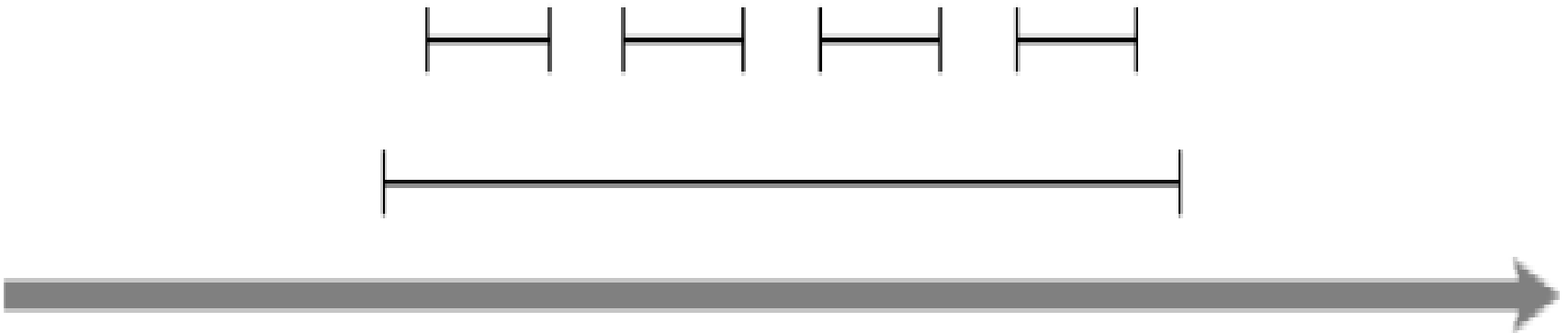
- **Designing a Greedy Algorithm using natural approaches:**
  - The basic idea in a greedy algorithm for interval scheduling is to use a simple rule to select a first request  $i_1$ .
  - Once a request  $i_1$  is accepted, we reject all requests that are not compatible with  $i_1$ .
  - We then select the next request  $i_2$  to be accepted, and again reject all requests that are not compatible with  $i_2$  and so on.



# INTERVAL SCHEDULING PROBLEM

- **Natural Rules that can be used to solve the interval scheduling problem are :**
  - Select the available request that starts earliest - that is, the one with minimal start time  $s(i)$  or earliest start time.
  - This way our resource starts being used as quickly as possible.
  - If the earliest request  $i$  is for a very long interval, then by accepting request  $i$  we may have to reject a lot of requests for shorter time intervals.

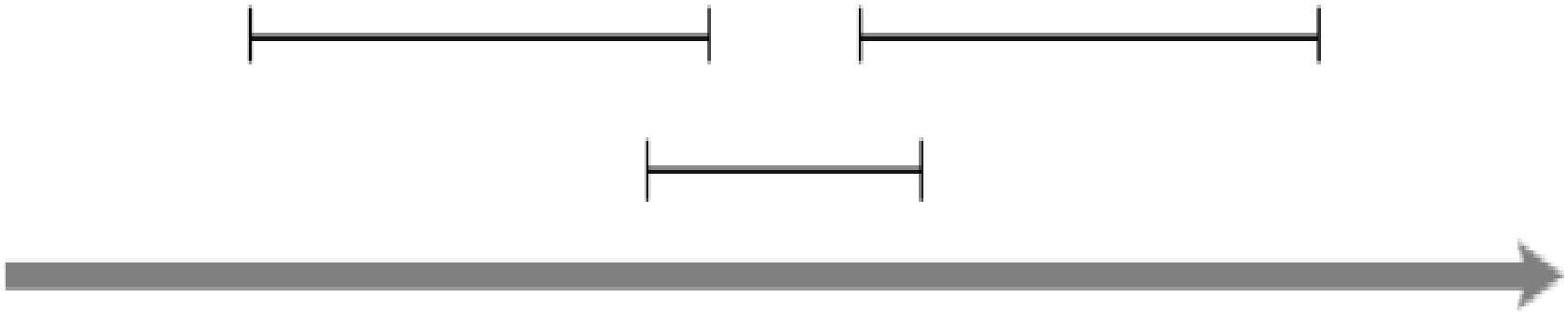
# INTERVAL SCHEDULING PROBLEM



# INTERVAL SCHEDULING PROBLEM

- **Natural Rules that can be used to solve the interval scheduling problem are :**
  - By accepting the request that requires the smallest interval of time—namely, the request for which  $f(i) - s(i)$  is as small as possible.
  - As it turns out, this is a somewhat better rule than the previous one, but it still can produce a suboptimal schedule.

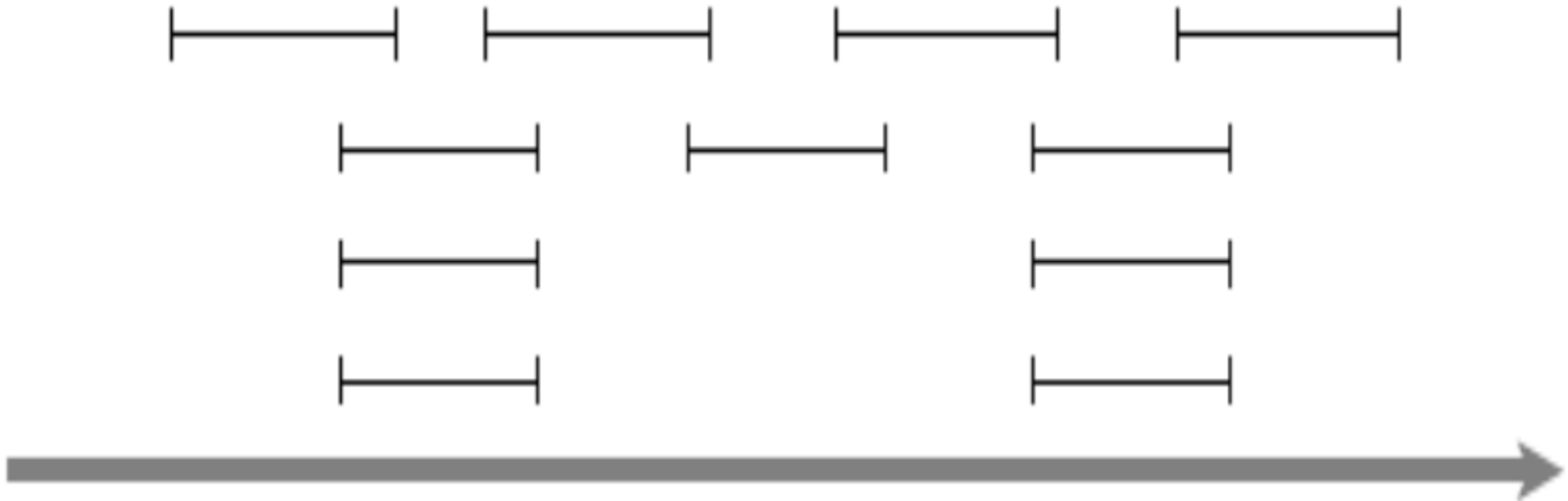
# INTERVAL SCHEDULING PROBLEM



# INTERVAL SCHEDULING PROBLEM

- **Natural Rules that can be used to solve the interval scheduling problem are :**
  - A greedy algorithm that is based on this idea:
    - For each request, we count the number of other requests that are not compatible, and accept the request that has the fewest number of non-compatible requests.
    - In other words, we select the interval with the fewest “conflicts”.

# INTERVAL SCHEDULING PROBLEM



# INTERVAL SCHEDULING PROBLEM

- **Natural Rules that can be used to solve the interval scheduling problem are :**
  - A greedy rule that does lead to the optimal solution is based on a fourth idea:
  - We should accept first the request that finishes first, that is, the request  $i$  for which  $f(i)$  is as small as possible.

# INTERVAL SCHEDULING PROBLEM

- **Interval Scheduling Algorithm**

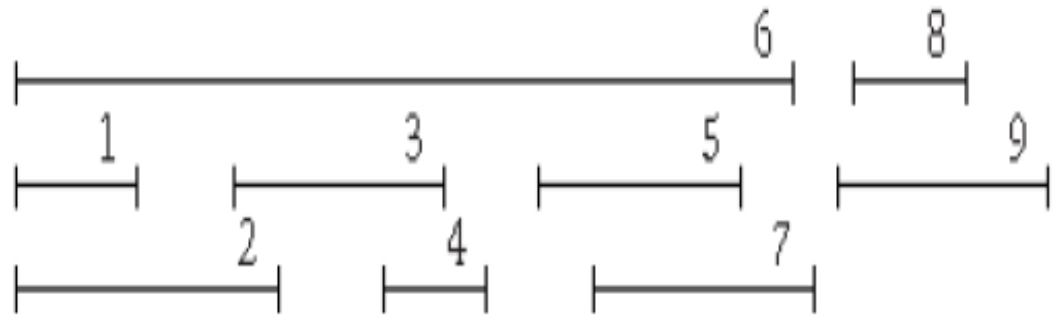
```
Initially let  $R$  be the set of all requests, and let  $A$  be empty
  While  $R$  is not yet empty
    Choose a request  $i \in R$  that has the smallest finishing
    time
    Add request  $i$  to  $A$ 
    Delete all requests from  $R$  that are not compatible with
    request  $i$ 
  EndWhile
Return the set  $A$  as the set of accepted requests
```



# INTERVAL SCHEDULING PROBLEM

- Interval Scheduling Example with Smallest Finish Time (Greedy)**

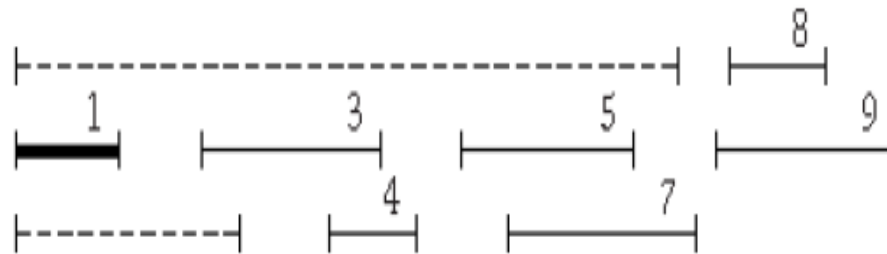
Intervals numbered in order



# INTERVAL SCHEDULING PROBLEM

- Interval Scheduling Example with Smallest Finish Time (Greedy)

Selecting interval 1



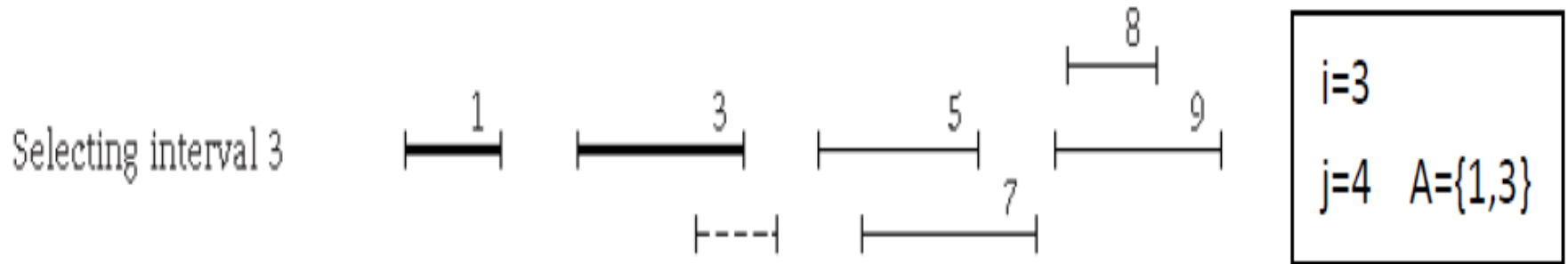
$i=1$

$j=2,6$

$A=\{1\}$

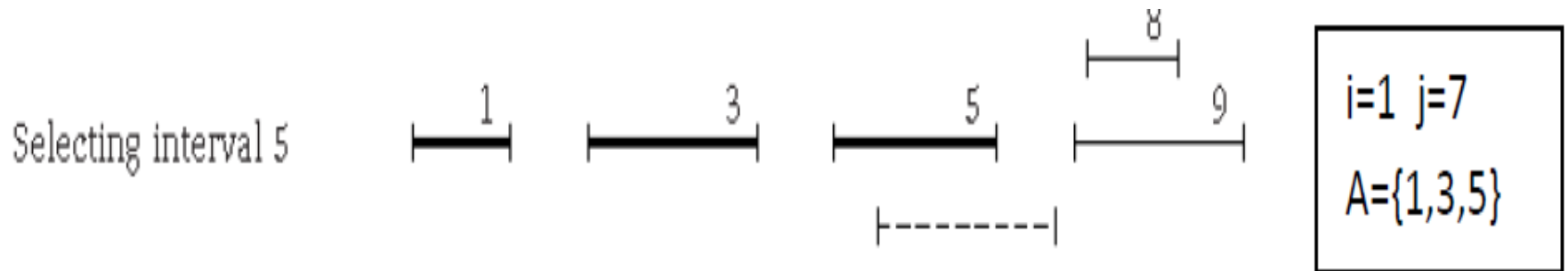
# INTERVAL SCHEDULING PROBLEM

- Interval Scheduling Example with Smallest Finish Time (Greedy)



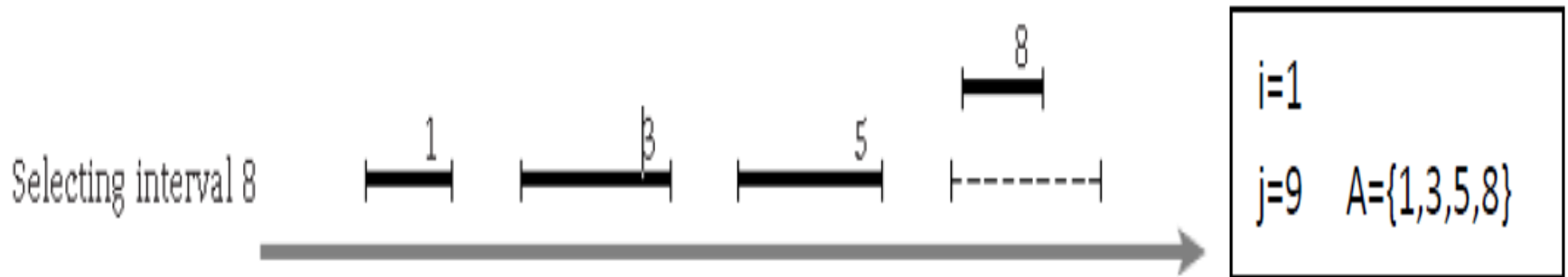
# INTERVAL SCHEDULING PROBLEM

- Interval Scheduling Example with Smallest Finish Time (Greedy)



# INTERVAL SCHEDULING PROBLEM

- Interval Scheduling Example with Smallest Finish Time (Greedy)



# INTERVAL SCHEDULING PROBLEM

- Implementation and Running Time of Interval Scheduling:
  - The running time of the algorithm shown is  $O(n \log n)$  as follows.
  - We begin by sorting the  $n$  requests in order of finishing time and labeling them in this order; that is, we will assume that  $f(i) \leq f(j)$  when  $i < j$ .
  - This takes time  $O(n \log n)$ .
  - In an additional  $O(n)$  time, we construct an array  $S[1 \dots n]$  with the property that  $S[i]$  contains the value  $s(i)$ .
  - We now select requests by processing the intervals in order of increasing  $f(i)$ .

# INTERVAL SCHEDULING PROBLEM

- We always select the first interval; we then iterate through the intervals in order until reaching the first interval  $j$  for which  $s(j) \geq f(1)$ ; we then select this one as well.
- More generally, if the most recent interval we've selected ends at time  $f$ , we continue iterating through subsequent intervals until we reach the first  $j$  for which  $s(j) \geq f$ .
- In this way, we implement the greedy algorithm analyzed above in one pass through the intervals, spending constant time per interval. Thus this part of the algorithm takes time  $O(n)$ .

# SCHEDULING TO MINIMIZE LATENESS

- Consider again a situation in which we have a single resource and a set of  $n$  requests to use the resource for an interval of time.
- Assume that the resource is available starting at time  $S$  and each request is now more flexible.
- Instead of a start time and finish time, the request  $i$  has a deadline  $d_i$ , and it requires a contiguous time interval of length  $t_i$ , but it is willing to be scheduled at any time before the



# SCHEDULING TO MINIMIZE LATENESS

- Suppose that we plan to satisfy each request, but we are allowed to let certain requests run late.
- Thus, beginning at our overall start time  $S$ , we will assign each request  $i$  an interval of time of length  $t_i$ ;
  - Let us denote this interval by  $[s(i), f(i)]$ , with  $f(i)$  as
  - $f(i) = s(i) + t_i$ .
  - where,  $s(i)$  = start time of the interval  $i$
  - $f(i)$  = finish time of the interval  $i$
  - $t_i$  = time length of the interval  $i$

# SCHEDULING TO MINIMIZE LATENESS

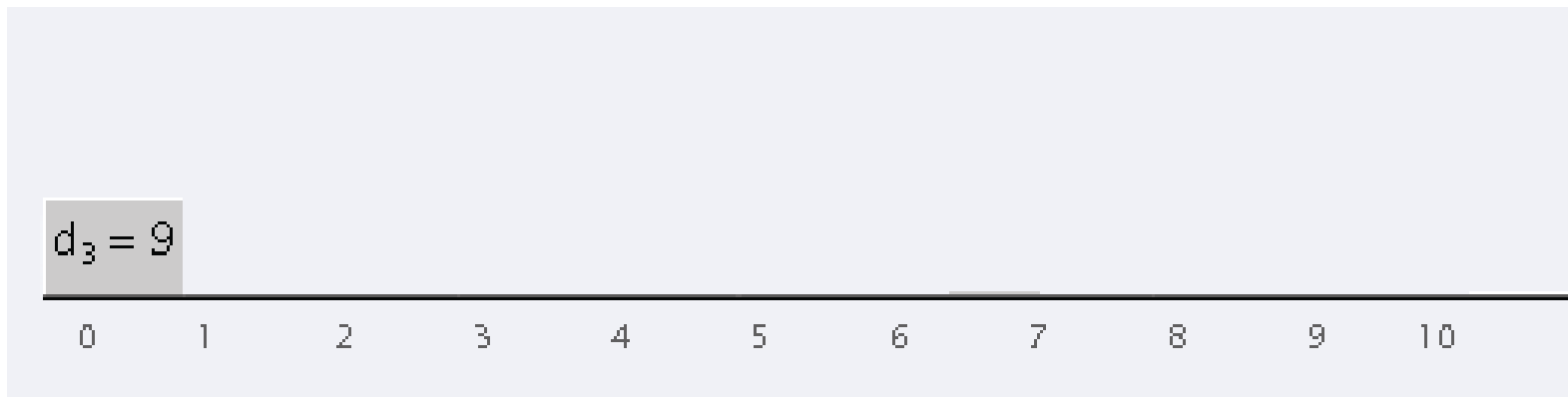
- The algorithm must determine a start time (and hence a finish time) for each interval.
- We say that a request  $i$  is late if it misses the deadline, that is, if  $f(i) > d_i$ .
- The lateness of such a request  $i$  is defined to be
  - $l_i = f(i) - d_i$
- We will say that  $l_i = 0$  if request  $i$  is not late.
- The goal in our new optimization problem will be to schedule all requests, using non overlapping intervals, so as to

# SCHEDULING TO MINIMIZE LATENESS

|       | 1 | 2 | 3 | 4 | 5  | 6  |
|-------|---|---|---|---|----|----|
| $t_j$ | 3 | 2 | 1 | 4 | 3  | 2  |
| $d_j$ | 6 | 8 | 9 | 9 | 14 | 15 |

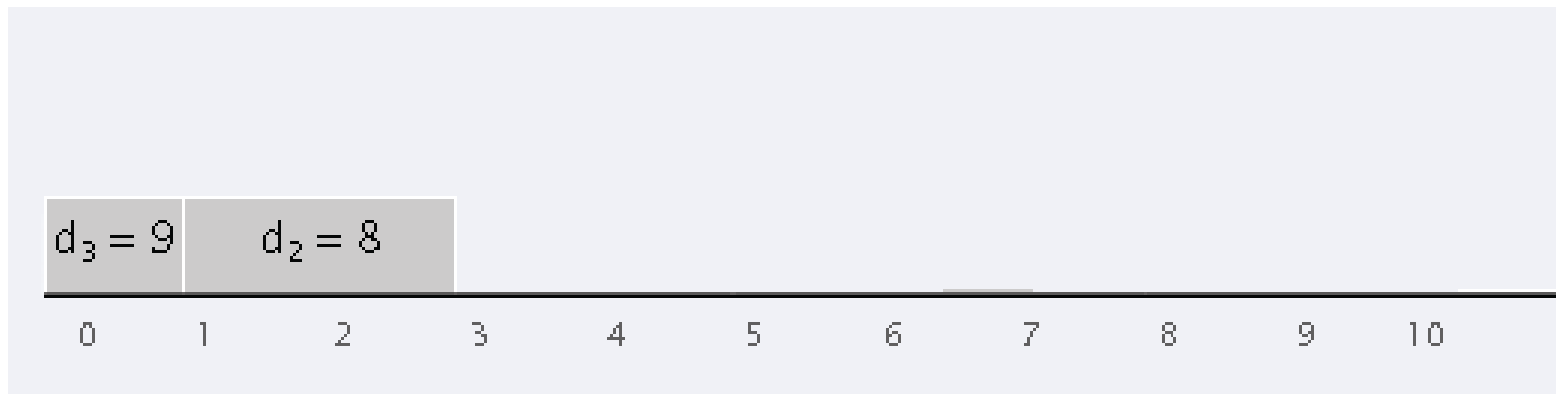
# SCHEDULING TO MINIMIZE LATENESS

|       | 1 | 2 | 3 | 4 | 5  | 6  |
|-------|---|---|---|---|----|----|
| $t_j$ | 3 | 2 | 1 | 4 | 3  | 2  |
| $d_j$ | 6 | 8 | 9 | 9 | 14 | 15 |



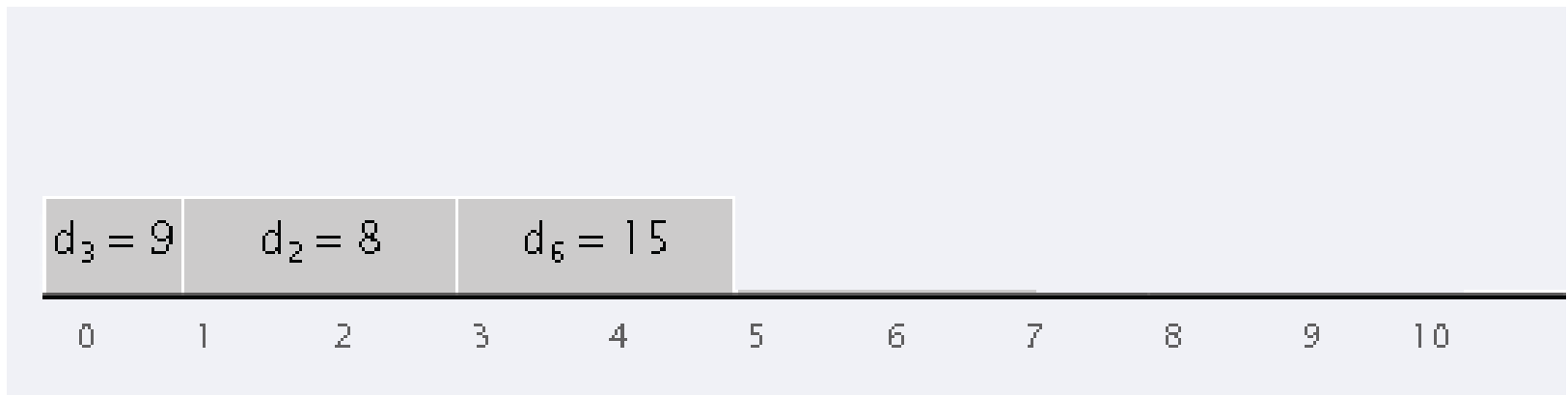
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|       | 1 | 2 | 3 | 4 | 5  | 6  |
|-------|---|---|---|---|----|----|
| $t_j$ | 3 | 2 | 1 | 4 | 3  | 2  |
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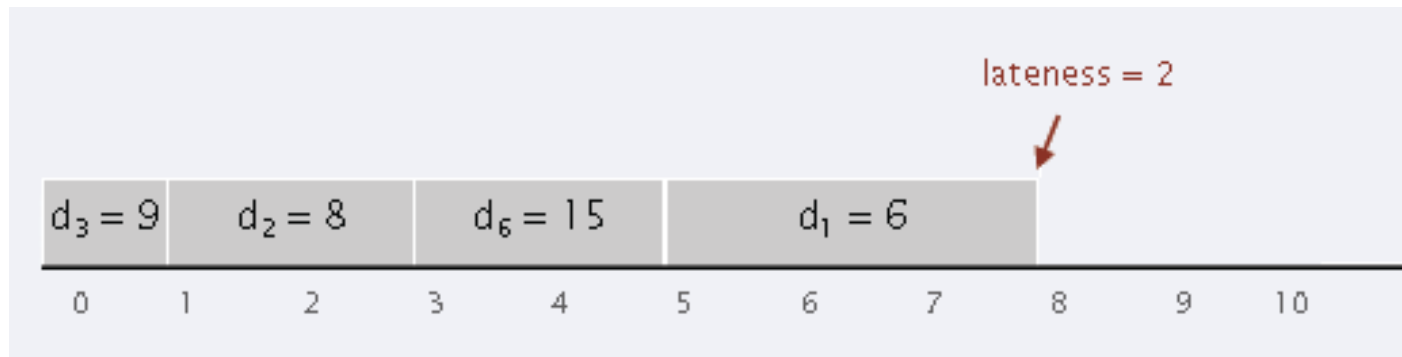
# SCHEDULING TO MINIMIZE LATENESS

|       | 1 | 2 | 3 | 4 | 5  | 6  |
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| $t_j$ | 3 | 2 | 1 | 4 | 3  | 2  |
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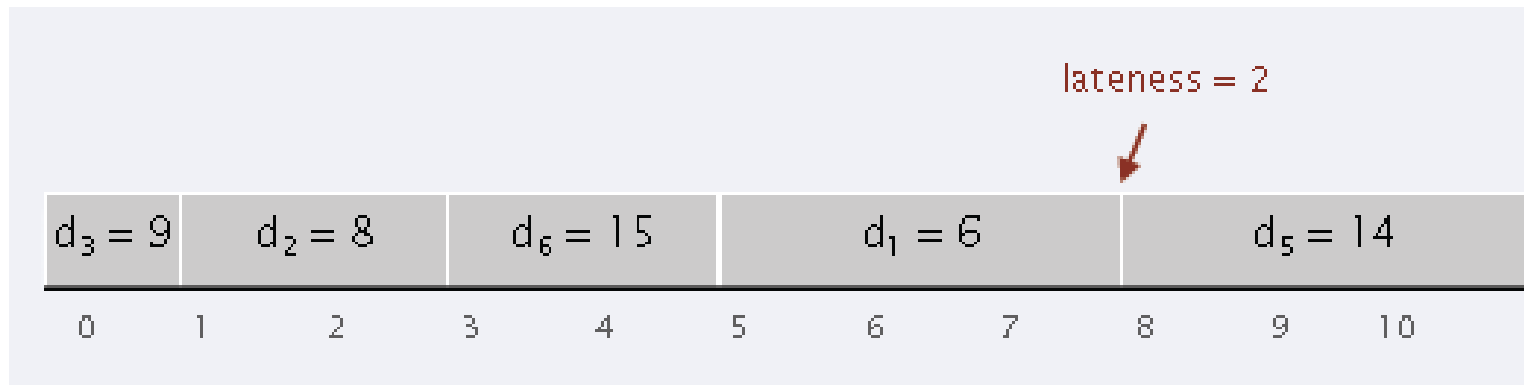
# SCHEDULING TO MINIMIZE LATENESS

|       | 1 | 2 | 3 | 4 | 5  | 6  |
|-------|---|---|---|---|----|----|
| $t_j$ | 3 | 2 | 1 | 4 | 3  | 2  |
| $d_j$ | 6 | 8 | 9 | 9 | 14 | 15 |



# SCHEDULING TO MINIMIZE LATENESS

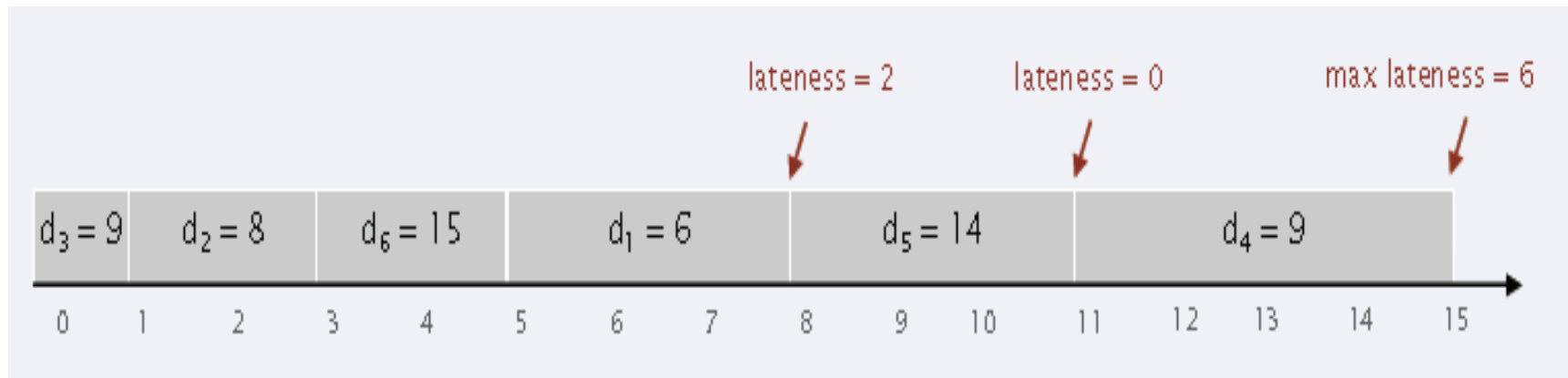
|       | 1 | 2 | 3 | 4 | 5  | 6  |
|-------|---|---|---|---|----|----|
| $t_j$ | 3 | 2 | 1 | 4 | 3  | 2  |
| $d_j$ | 6 | 8 | 9 | 9 | 14 | 15 |





# SCHEDULING TO MINIMIZE LATENESS

|       | 1 | 2 | 3 | 4 | 5  | 6  |
|-------|---|---|---|---|----|----|
| $t_j$ | 3 | 2 | 1 | 4 | 3  | 2  |
| $d_j$ | 6 | 8 | 9 | 9 | 14 | 15 |

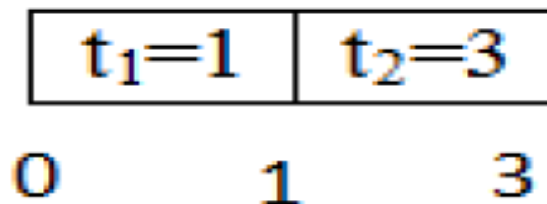


# SCHEDULING TO MINIMIZE LATENESS

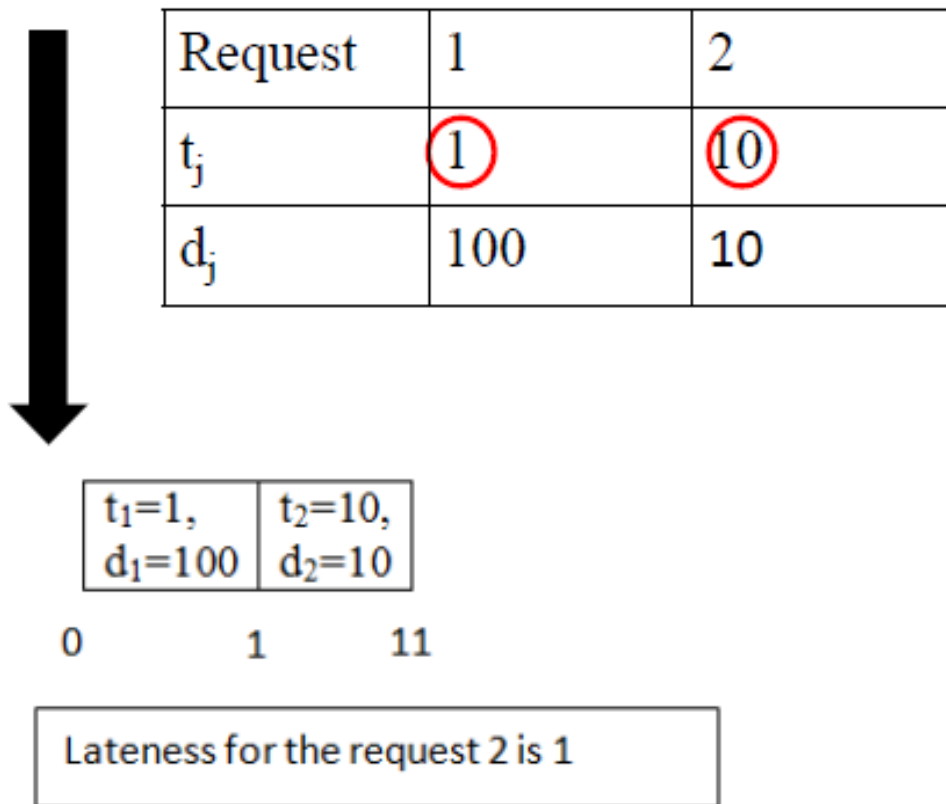
- Natural Approaches to the Problem.
  - Schedule the jobs in order of

incr

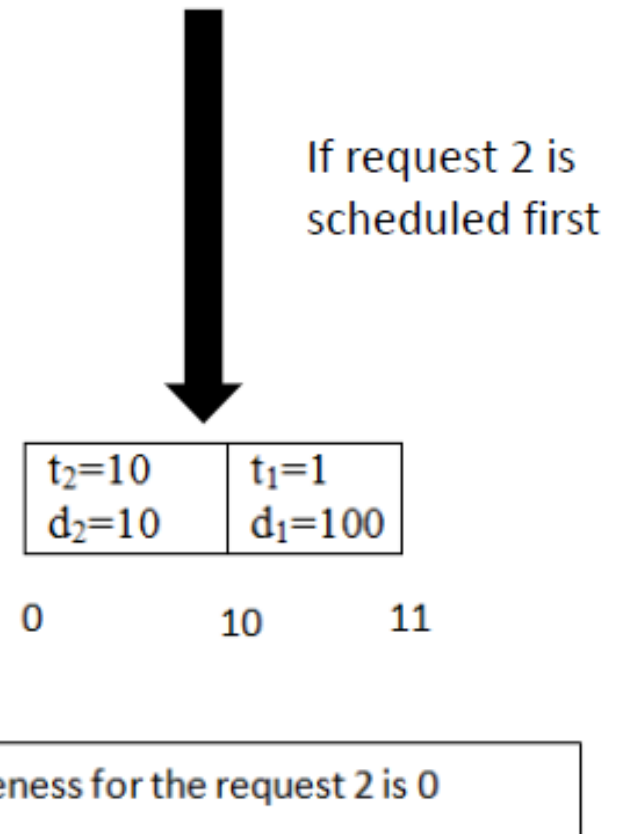
|         |   |   |
|---------|---|---|
| Request | 1 | 2 |
| $t_j$   | 1 | 3 |
| $d_j$   | 2 | 5 |



# SCHEDULING TO MINIMIZE LATENESS



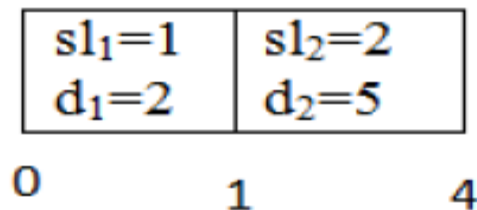
Counter example



# SCHEDULING TO MINIMIZE LATENESS

- Natural Approaches to the Problem.
  - Slack Time:  $d_i - t_i$  is very small.

|                |   |   |
|----------------|---|---|
| Request        | 1 | 2 |
| $t_j$          | 1 | 3 |
| $d_j$          | 2 | 5 |
| $Sl_i$ (Slack) | 1 | 2 |



# SCHEDULING TO MINIMIZE LATENESS

Counter example



| Request | 1 | 2  |
|---------|---|----|
| $t_j$   | 1 | 10 |
| $d_j$   | 2 | 10 |
| $sl_i$  | 1 | 0  |



If request 1  
Was scheduled  
first

|          |          |
|----------|----------|
| $sl_2=0$ | $sl_1=1$ |
| $d_2=10$ | $d_1=2$  |

0 10 11

Lateness for the request 1 is 9

|          |          |
|----------|----------|
| $sl_1=1$ | $sl_2=0$ |
| $d_1=2$  | $d_2=10$ |

0 1 11

Lateness for the request 2 is 1

# SCHEDULING TO MINIMIZE LATENESS – GOAL REVISITED

- The goal in our new optimization problem will be to schedule all requests, using non-overlapping intervals, so as to minimize the maximum lateness,  
 $L = \max_i l_i$

# SCHEDULING TO MINIMIZE LATENESS – GOAL REVISITED

## Algorithm

Order the jobs in order of their deadlines

Assume for simplicity of notation that  $d_1 \leq \dots \leq d_n$

Initially,  $f = s$

Consider the jobs  $i = 1, \dots, n$  in this order

    Assign job  $i$  to the time interval from  $s(i) = f$  to  $f(i) = f + t_i$

    Let  $f = f + t_i$

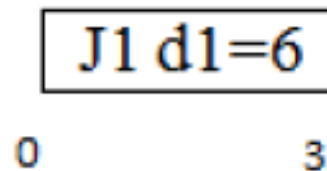
End

Return the set of scheduled intervals  $[s(i), f(i)]$  for  $i = 1, \dots, n$

# SCHEDULING TO MINIMIZE LATENESS – EXAMPLE

|       | 1 | 2 | 3 | 4 | 5  | 6  |
|-------|---|---|---|---|----|----|
| $t_j$ | 3 | 2 | 1 | 4 | 3  | 2  |
| $d_j$ | 6 | 8 | 9 | 9 | 14 | 15 |

1.  $i=1$  Add Job J1 to the schedule.



$$s(1) = f = 0$$

$$f(1) = s(1) + t(1) = 0 + 3 = 3$$

$$f = f + t(1) = 0 + 3 = 3$$



# SCHEDULING TO MINIMIZE LATENESS – EXAMPLE

|       | 1 | 2 | 3 | 4 | 5  | 6  |
|-------|---|---|---|---|----|----|
| $t_j$ | 3 | 2 | 1 | 4 | 3  | 2  |
| $d_j$ | 6 | 8 | 9 | 9 | 14 | 15 |

2.  $i=2$  Add Job J2 to the schedule.

|            |            |
|------------|------------|
| J1 $d_1=6$ | J2 $d_2=8$ |
|------------|------------|

0                      3                      5

$$s(2) = f = 3$$

$$f(2) = s(2) + t(2) = 3 + 2 = 5$$

$$f = f + t(2) = 3 + 2 = 5$$

# SCHEDULING TO MINIMIZE LATENESS – EXAMPLE

|       | 1 | 2 | 3 | 4 | 5  | 6  |
|-------|---|---|---|---|----|----|
| $t_j$ | 3 | 2 | 1 | 4 | 3  | 2  |
| $d_j$ | 6 | 8 | 9 | 9 | 14 | 15 |

3.  $i=3$  Add Job J3 to the schedule.

|         |         |         |
|---------|---------|---------|
| J1 d1=6 | J2 d2=8 | J3 d3=9 |
| 0       | 3       | 5       |

$$s(3) = f = 5$$

$$f(3) = s(3) + t(3) = 5 + 1 = 6$$

$$f = f + t(3) = 5 + 1 = 6$$

# SCHEDULING TO MINIMIZE LATENESS – EXAMPLE

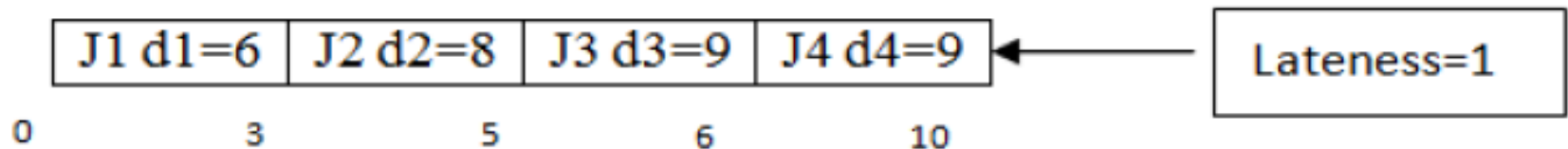
|       | 1 | 2 | 3 | 4 | 5  | 6  |
|-------|---|---|---|---|----|----|
| $t_j$ | 3 | 2 | 1 | 4 | 3  | 2  |
| $d_j$ | 6 | 8 | 9 | 9 | 14 | 15 |

4.  $i=4$  Add Job J4 to the schedule.

$$s(4) = f = 6$$

$$f(4) = s(4) + t(4) = 6 + 4 = 10$$

$$f = f + t(4) = 6 + 4 = 10$$



# SCHEDULING TO MINIMIZE LATENESS – EXAMPLE

|       | 1 | 2 | 3 | 4 | 5  | 6  |
|-------|---|---|---|---|----|----|
| $t_j$ | 3 | 2 | 1 | 4 | 3  | 2  |
| $d_j$ | 6 | 8 | 9 | 9 | 14 | 15 |

5.  $i=5$  Add Job J5 to the schedule.

$$s(5) = f = 10$$

$$f(5) = s(5) + t(5) = 10 + 3 = 13$$

$$f = f + t(5) = 10 + 3 = 13$$

|            |            |            |            |             |
|------------|------------|------------|------------|-------------|
| J1<br>d1=6 | J2<br>d2=8 | J3<br>d3=9 | J4<br>d4=9 | J5<br>d5=14 |
|------------|------------|------------|------------|-------------|

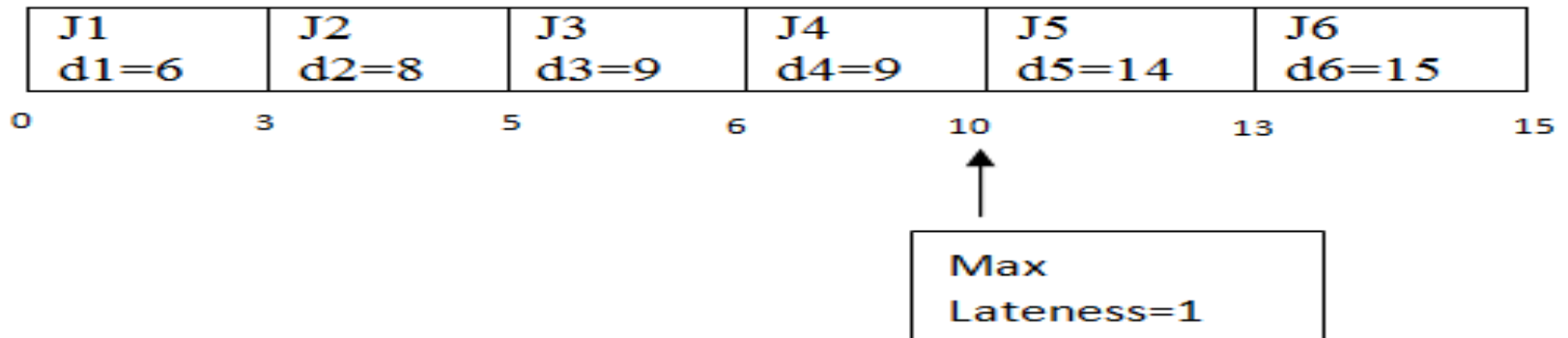
0                      3                      5                      6                      10                      13

# SCHEDULING TO MINIMIZE LATENESS – EXAMPLE

|       | 1 | 2 | 3 | 4 | 5  | 6  |
|-------|---|---|---|---|----|----|
| $t_j$ | 3 | 2 | 1 | 4 | 3  | 2  |
| $d_j$ | 6 | 8 | 9 | 9 | 14 | 15 |

6.  $i=6$  Add Job J6 to the schedule.

$$\begin{aligned} s(6) &= f = 13 \\ f(6) &= s(6) + t(6) = 13 + 2 = 15 \\ f &= f + t(6) = 13 + 2 = 15 \end{aligned}$$



# OPTIMAL CACHING-PROBLEM

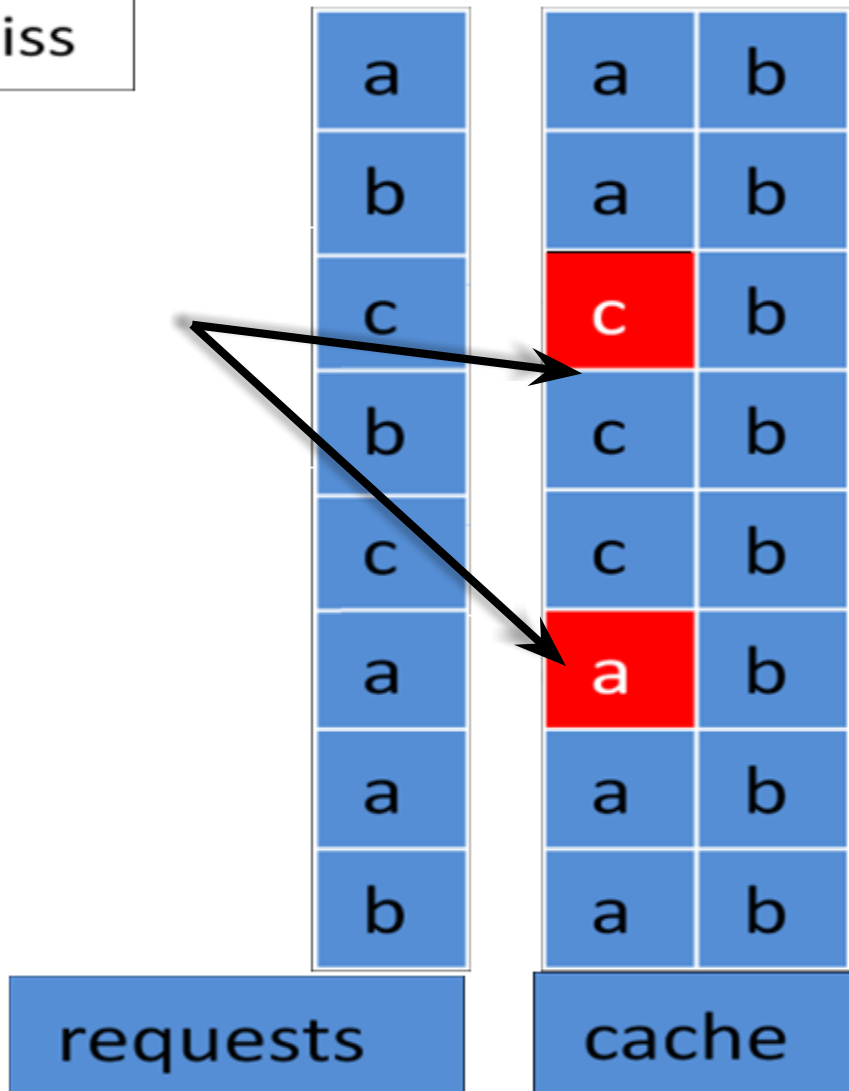
- Caching.
  - Cache with capacity to store  $k$  items.
  - Sequence of  $m$  item requests  $d_1, d_2, \dots, d_m$ .
  - Cache hit: item already in cache when requested.
  - Cache miss: item not already in cache when requested: must bring requested item into cache, and evict some existing item, if full

# OPTIMAL CACHING-PROBLEM

- Goal - Eviction schedule that minimizes number of cache misses.
  - Example
  - $k = 2$ , initial cache = a b, requests: a, b, c, b, c, a, a, b.
  - Optimal eviction schedule: 2 cache misses.

# OPTIMAL CACHING-PROBLEM

red = cache miss





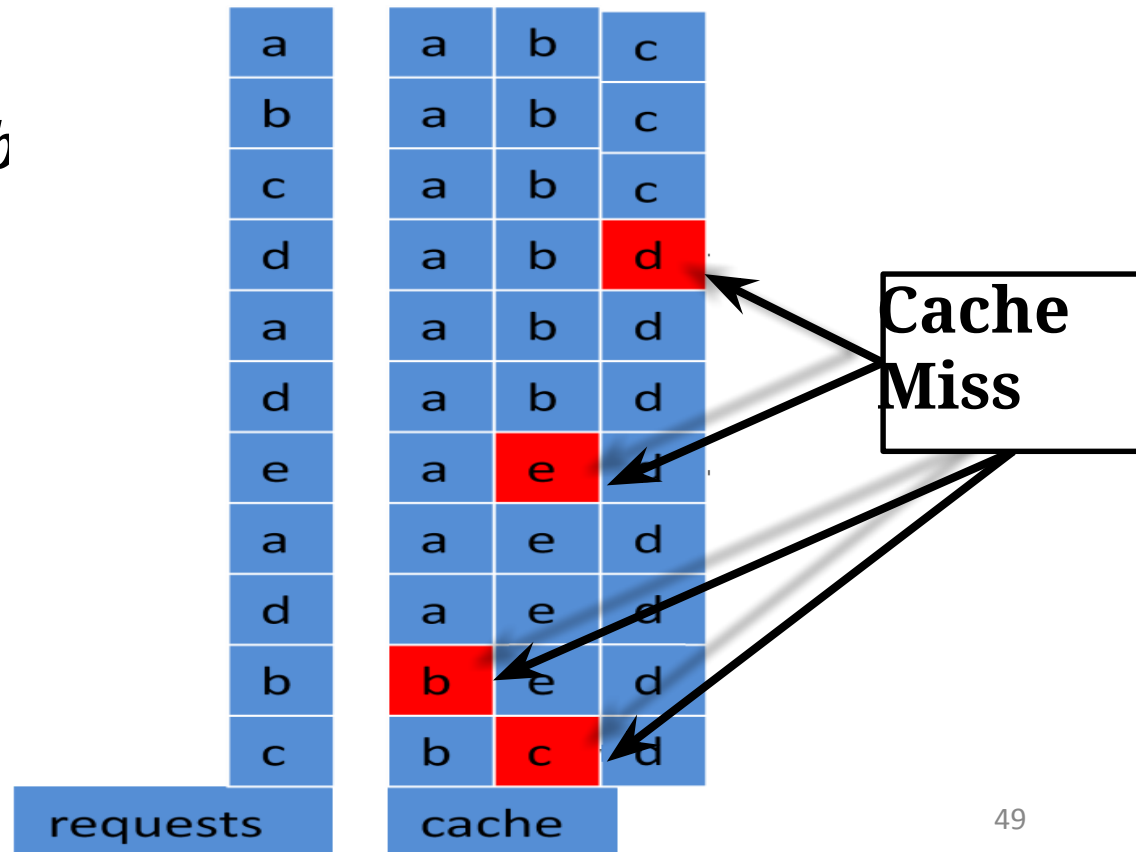
# OPTIMAL CACHING- ALGORITHM -Farthest-in- Future

## Algorithm

When  $d_i$  needs to be brought into the cache,  
evict the item that is needed the farthest into the future

## Example

$a, b, c, d, a, d, e, a, d, b$   
 $k=3$



**THANK YOU**