

**Course Name:  
Analysis and  
Design of  
Algorithms**

# Topics to be covered

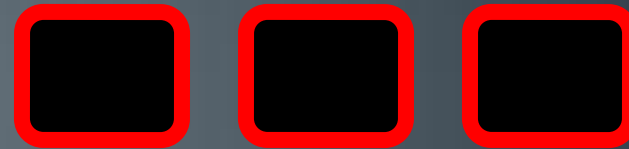
- Branch and Bound
  - Job Scheduling
  - Comparing with Greedy Approach

# Branch and Bound Algorithm: **Scheduling Problem**

Material by A.Mirhashemi

Input of the problem:

- A number of resources
- A number of tasks



Output of the problem:

- A sequence of feeding the tasks to resources to minimize the required processing time



# Application 1

## Digital processing:

Each resource is a processor. All tasks need to pass through all processors in the fixed sequence A,B,C but depending on the task it takes different time for each processor to process them. For example :

Processor A: Scanning

Processor B: Making a PDF

Processor C: Exporting a PDF

Task 1: A one page plain text document

Task 2: A 10 page document with pictures

Task 3: A 5 page html document.

Task 4: ...

# Application 2

## Production line:

Each product (task) need to pass trough all machines (resources) in the production line but, the time depends on what kind of customization the customer has ordered for that production. For example:

Machine A: Solding  
Machine B: Painting  
Machine C: Packaging

Task 1: A black car with airbag  
Task 2: A red car without airbag with CD player  
Task 3: A white car with leather seats  
Task 4: ...

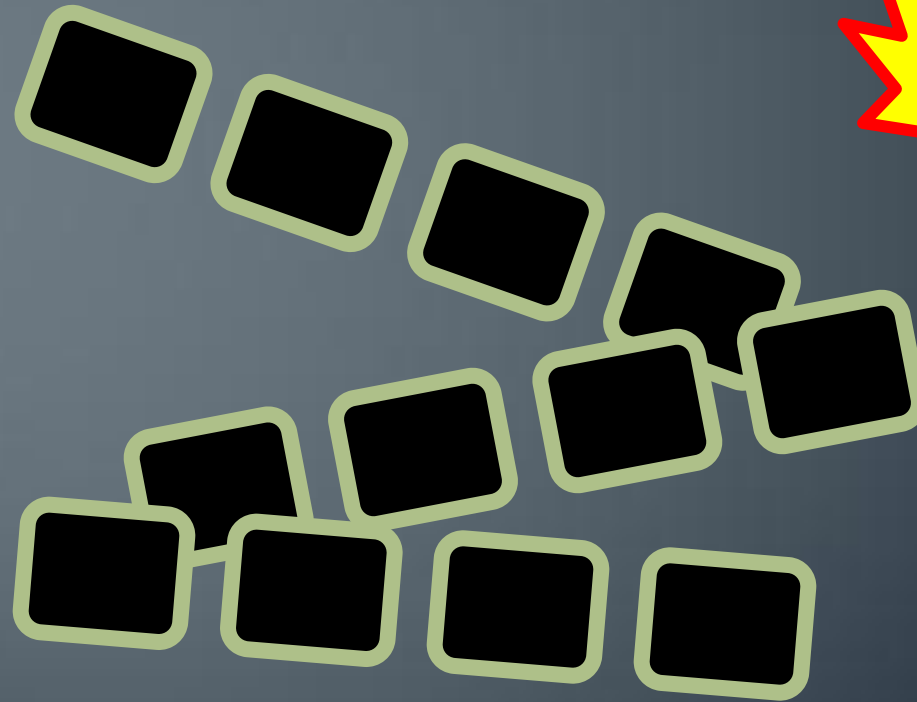
# Different tasks take different time to be processed in each resource

	7	6	7
	5	5	2
	6	4	1
	3	4	3

Tasks can be done in any order

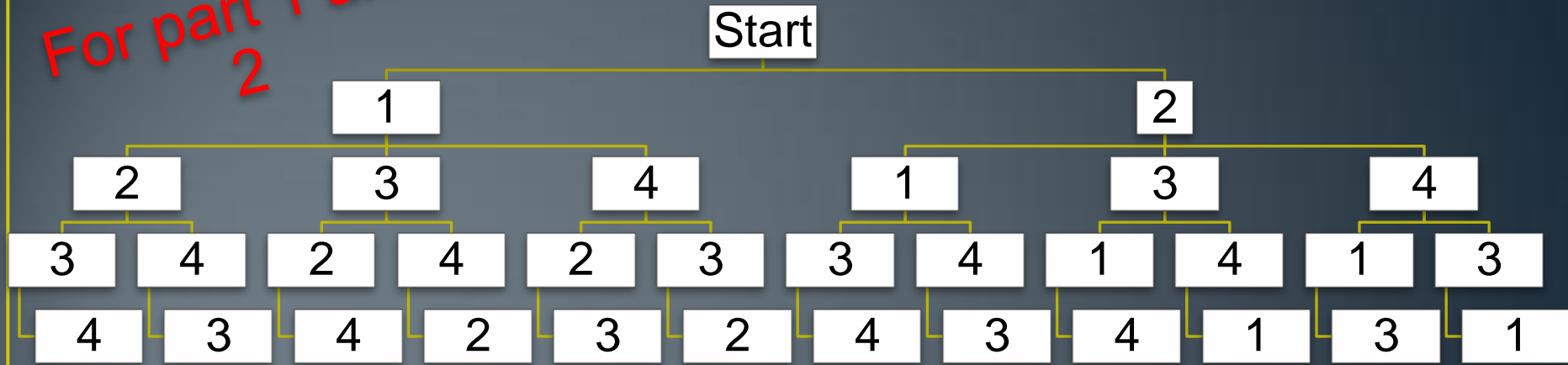


$N!$  Possible different sequences

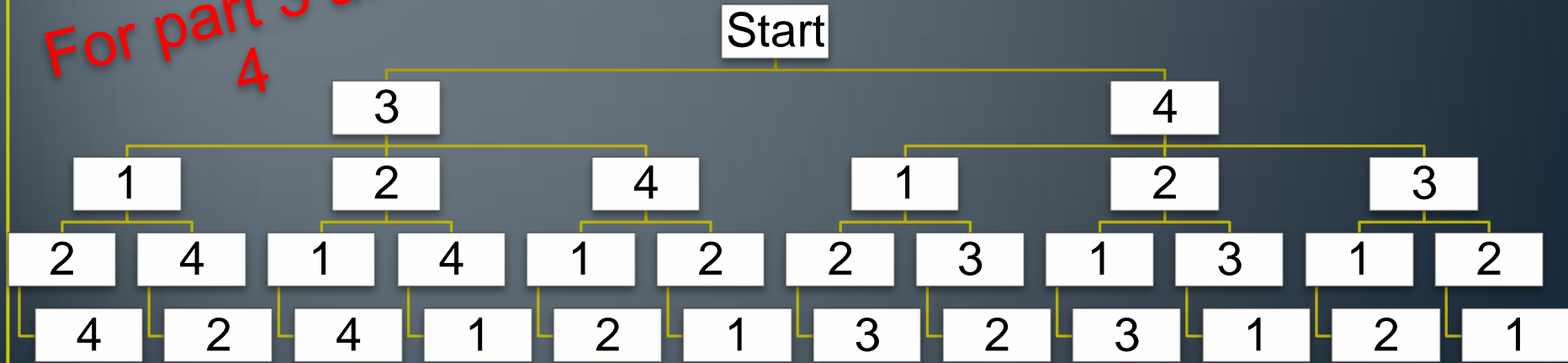


# Decision tree (Brute force)

For part 1 and 2



For part 3 and 4







# Greedy Algorithm

A possible greedy algorithm might start with selecting the fastest tasks for processor A.

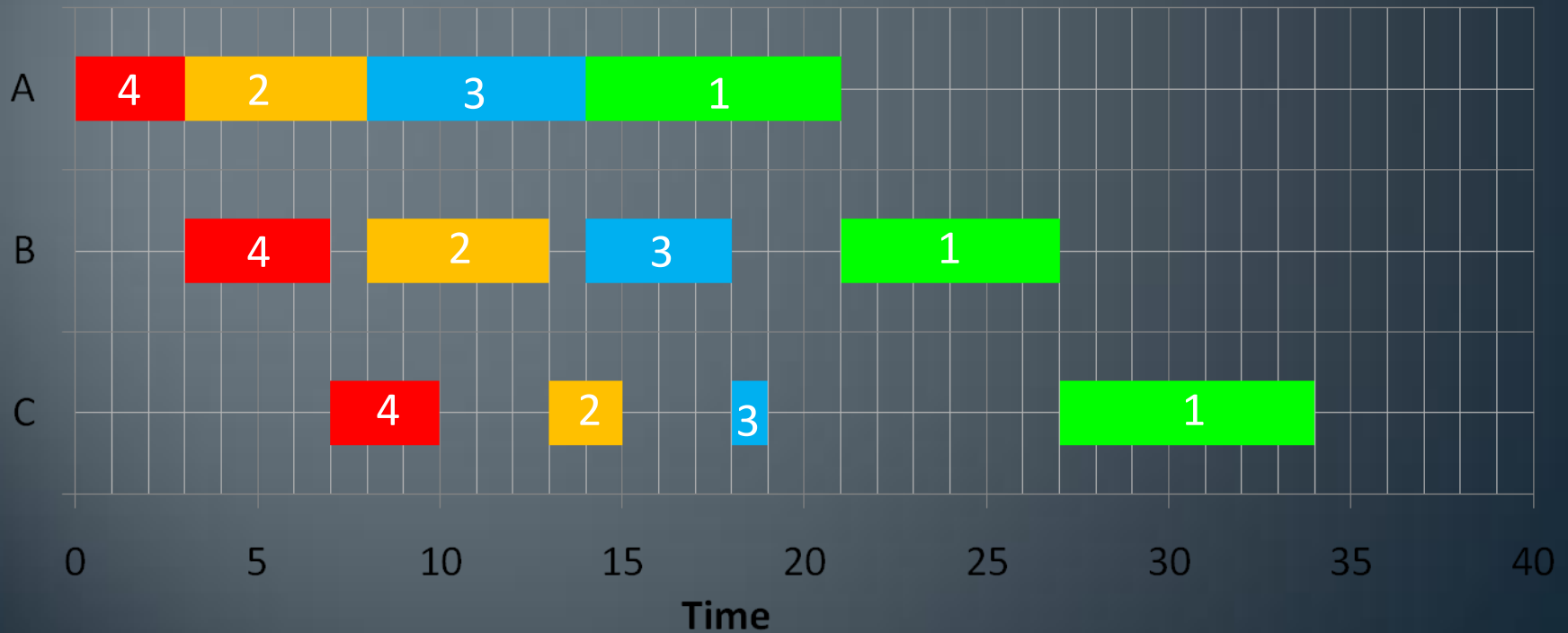


# Greedy solution

$$T(4,2,3,1) = 34$$


			
	7	6	7
	5	5	2
	6	4	1
	3	4	3

Time chart for greedy solution of 4-2-3-1 sequence

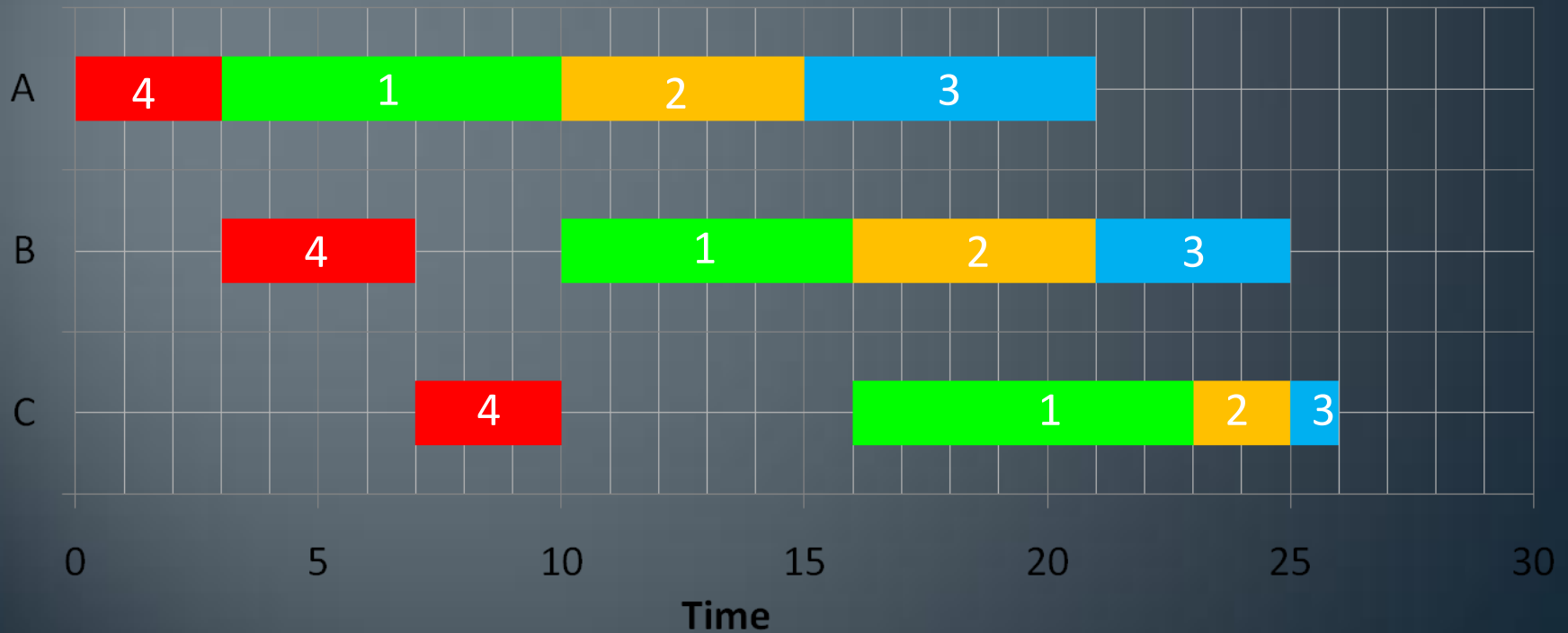


# Optimal solution

$$T(4,1,2,3) = 26$$

			
	7	6	7
	5	5	2
	6	4	1
	3	4	3

Time chart for B&B algorithm solution, 4-1-2-3 sequence



# Branch and bound Algorithm

Define a bounding criteria for a minimum time required by each branch of the decision tree

**For level 1:**

$$b(i) = A_i + \sum_{j=1}^4 B_j + \min_{j \neq i} C_j$$

**For level 2:**

$$b(i, j) = A_i + A_j + \sum_{k \neq i, j, k=1}^4 B_k + \min_{k \neq i, j} C_k$$

# Level 1

$$b(i) = A_i + \sum_{j=1}^4 B_j + \min_{j \neq i} C_j$$

			
	7	6	7
	5	5	2
	6	4	1
	3	4	3

$$b(1) = 7 + (6 + 5 + 4 + 4) + 1 = 27$$

$$b(2) = 5 + (6 + 5 + 4 + 4) + 1 = 25$$

$$b(3) = 6 + (6 + 5 + 4 + 4) + 2 = 27$$

$$b(4) = 3 + (6 + 5 + 4 + 4) + 1 = \underline{\underline{23}}$$

Minimum

This next

Start



Bounds:

$T \geq 27$

$T \geq 25$

$T \geq 27$

$T \geq 23$

# Level 2

$$b(i, j) = A_i + A_j + \sum_{k=i, k=1}^4 B_k + \min_{k \neq i, j} C_k$$

$$b(4, 1) = (3+7) + (6+5+4) + 1 = 26$$

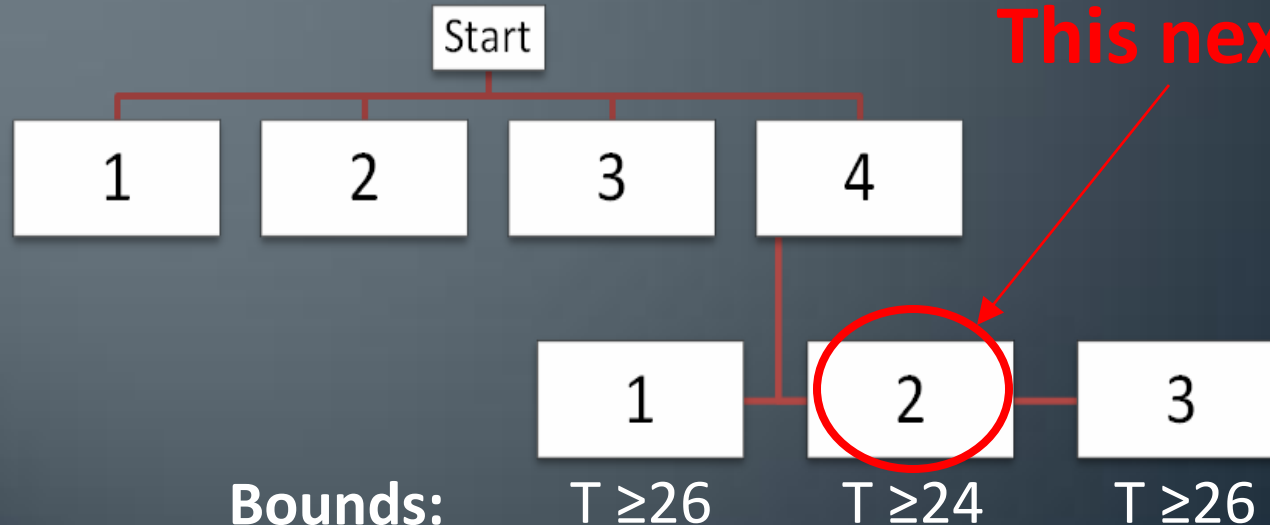
$$b(4, 2) = (3+5) + (6+5+4) + 1 = 24$$

$$b(4, 3) = (3+6) + (6+5+4) + 2 = 26$$

			
	7	6	7
	5	5	2
	6	4	1
	3	4	3

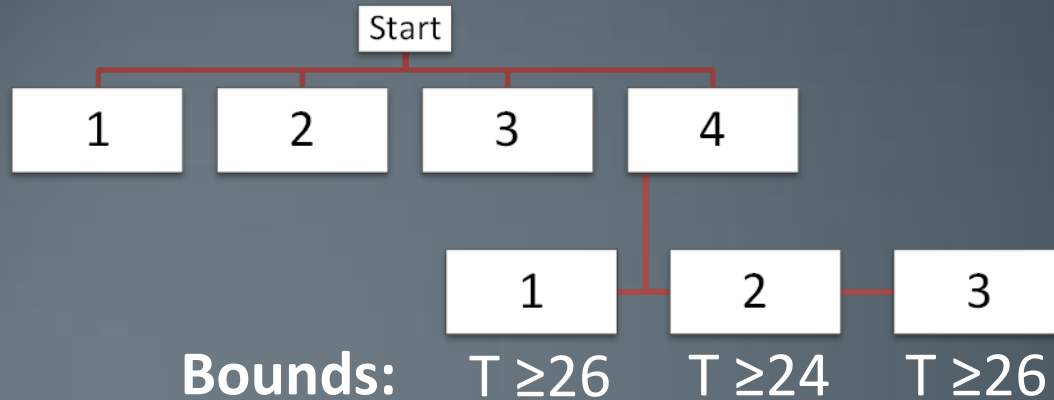
**Minimum**

**This next**



# Solve the branch 4-2-x-x

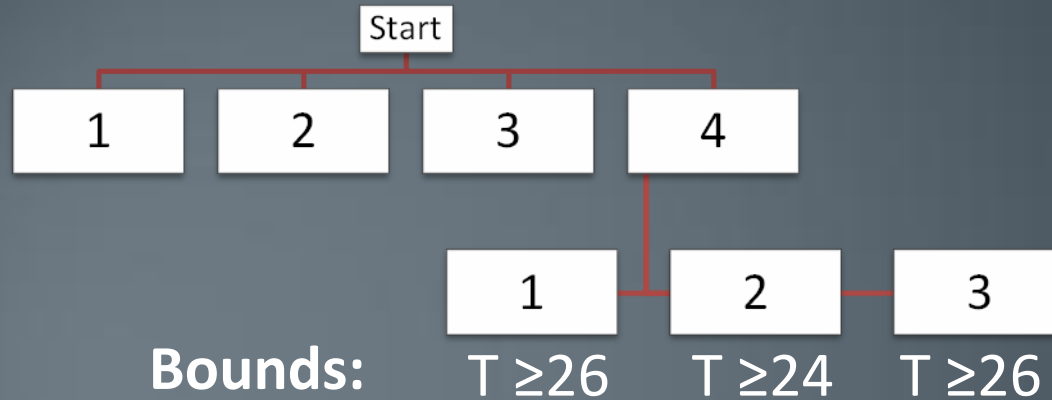
<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	
<input type="checkbox"/>	7	6	7
<input type="checkbox"/>	5	5	2
<input type="checkbox"/>	6	4	1
<input type="checkbox"/>	3	4	3



$$T_{\min}(4,2,x,x) = 29$$

Actual:  $T(4,2,1,3) = 29$   
 $T(4,2,3,1) = 34$

# Solve the branch 4-2-x-x

$T_{\min}(4,1,x,x) = 26$

$T_{\min}(4,2,x,x) = 29$

$T_{\min}(4,3,x,x) = 29$

**Actual:**

$T(4,1,2,3) = 26$   
 $T(4,1,3,2) = 28$

**Actual:**

$T(4,3,1,2) = 29$   
 $T(4,3,2,1) = 34$



# Solve the other branches

	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
<input type="checkbox"/>	7	6	7
<input type="checkbox"/>	5	5	2
<input type="checkbox"/>	6	4	1
<input type="checkbox"/>	3	4	3

Can be skipped

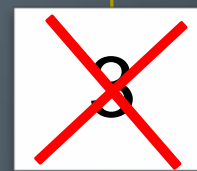
Start



$T \geq 27$



$T \geq 25$



$T \geq 27$



$T \geq 23$

$T = 26$

Bounds:


Actual Time:

Must be solved

$$b(2,1) = (5+7) + (6+4+4) + 1 = 27$$

$$b(2,3) = (5+6) + (6+4+4) + 3 = 28$$

$$b(2,4) = (5+3) + (6+4+4) + 1 = \underline{23}$$






7	6	7
5	5	2
6	4	1
3	4	3

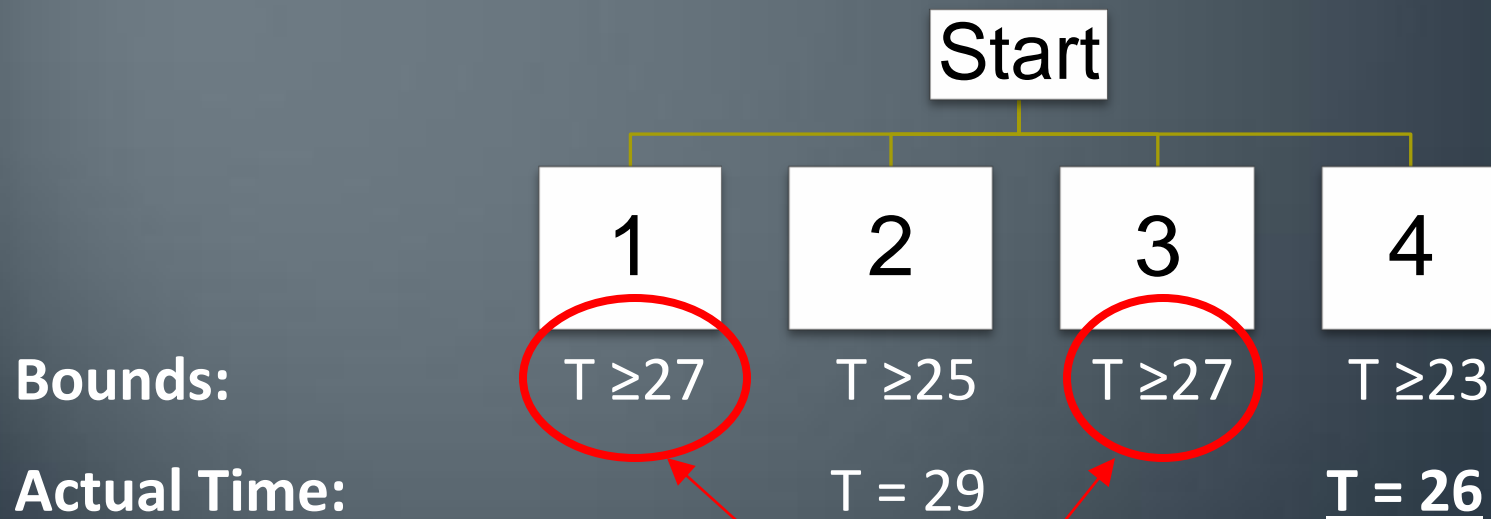
The only candidate that can outperform  $T(4,1,2,3)$  is  $T(2,4,...)$  so we calculate it:

$$\text{Actual } T(2,4,1,3) = 29$$

$$\text{Actual } T(2,4,3,1) = 34$$

So the best time is  $T(4,1,2,3)$  and we don't need to solve the problem for any other branch because we now their minimum time, already.

			
	7	6	7
	5	5	2
	6	4	1
	3	4	3



**Bounds greater than 26!**

# Summary

- Using only the first level criteria we reduce the problem by 50% (omitting 2 main branches).
- Using the second level criteria we can reduce even more.

