

Not optimization

Recursion

- Substitution
- Master Method
- Recurrence Tree

Divide & Conquer -

Sub problem

$$\leftarrow T(n) = aT(n/b) + f(n)$$

Greedy Method      Not Recursive

1. Optimization

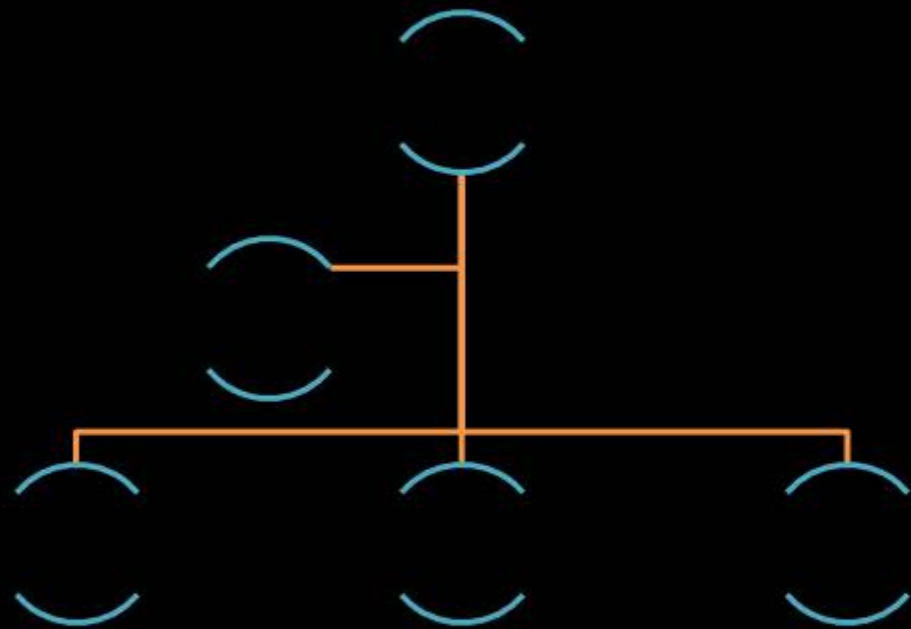
pick one solution

$\Leftarrow$  • ordering will be performed

See Select

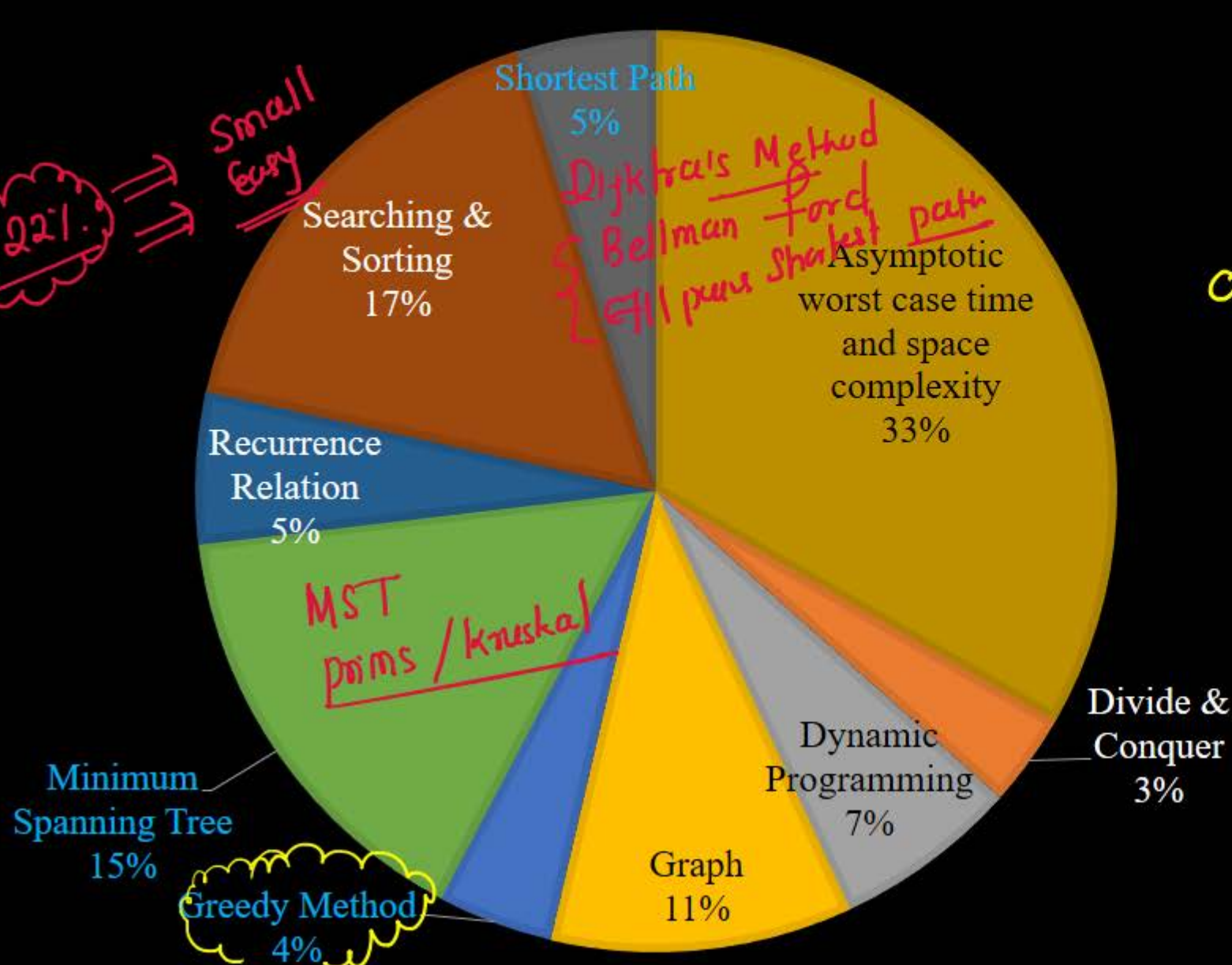
2. Feasible : "Satisfy some  
constraints"

Depends upon  
the problem



Greedy Method

# Greedy Algorithm Weightage Analysis



- Maximization - profit
- Minimization : cost, time

## Objective Function

### 1. Greedy Method

1. Knapsack problem
2. Job sequencing with deadline

- Data structure that allows to select min or max. (Heap) Binary Heap

# Greedy Method

1. Objective function
2. Constraints
3. feasible Solution
- 4 optimal Solution

## Greedy Method

- The greedy method is perhaps the most straightforward design technique we consider in this text, and what's more it can be applied to a wide variety of problems. Most, though not all, of these problems have  $n$  inputs and require us to obtain a subset that satisfies some constraints.



## Greedy Method

- **Feasible Solution:** Bag capacity - 15 , only M/c is available  
Only one path is available,  
only 9 months to prepare for examination  
Every Solution that satis satisfied the constraints  
is called feasible Solution

## Greedy Method

- **Feasible Solution:** Any subset that satisfies these constraints is called a *feasible* solution.

## Greedy Method

- **Objective function:**

(Differ from one  
problem to another)

By designing algorithm what exactly we  
want to achieve.

Maximizing objective function (e.g. profit)  
Minimize objective function (e.g. cost)

## Greedy Method

- **Objective function:** We need to find a feasible solution that either maximizes or minimizes a given *objective function*.



## Greedy Method

15    - (4)  
capacity    ↑  
                 object

- **Optimal solution:**

Every feasible solution satisfies the constraints  
among feasible an optimal solution is the solution  
that maximizes or minimizes the objective function

## Greedy Method

- **Optimal solution:** A feasible solution that does this is called an *optimal solution*. There is usually an obvious way to determine a feasible solution but not necessarily an optimal solution.

## Greedy Method

- **Selection procedure:** !. Selection procedure is way to first order the given element based on objective function then select the solution & check whether the give solution is feasible or not. if feasible then put them in the Solution set

# Greedy Method

- **Selection procedure:**

## Greedy Method

- **Selection procedure:** *This is done by considering the inputs in an order determined by some selection procedure.*



## Greedy Method

- **Selection procedure:** The greedy method suggests that one can devise an algorithm that works in stages, considering one input at a time. At each stage, a decision is made regarding whether a particular input is in an optimal solution. *This is done by considering the inputs in an order determined by some selection procedure.*

## Greedy Method

- If the inclusion of the next input into the partially constructed optimal solution will result in an infeasible solution, then this input is not added to the partial solution. Otherwise, it is added. The selection procedure itself is based on some optimization measure.

## Greedy Method

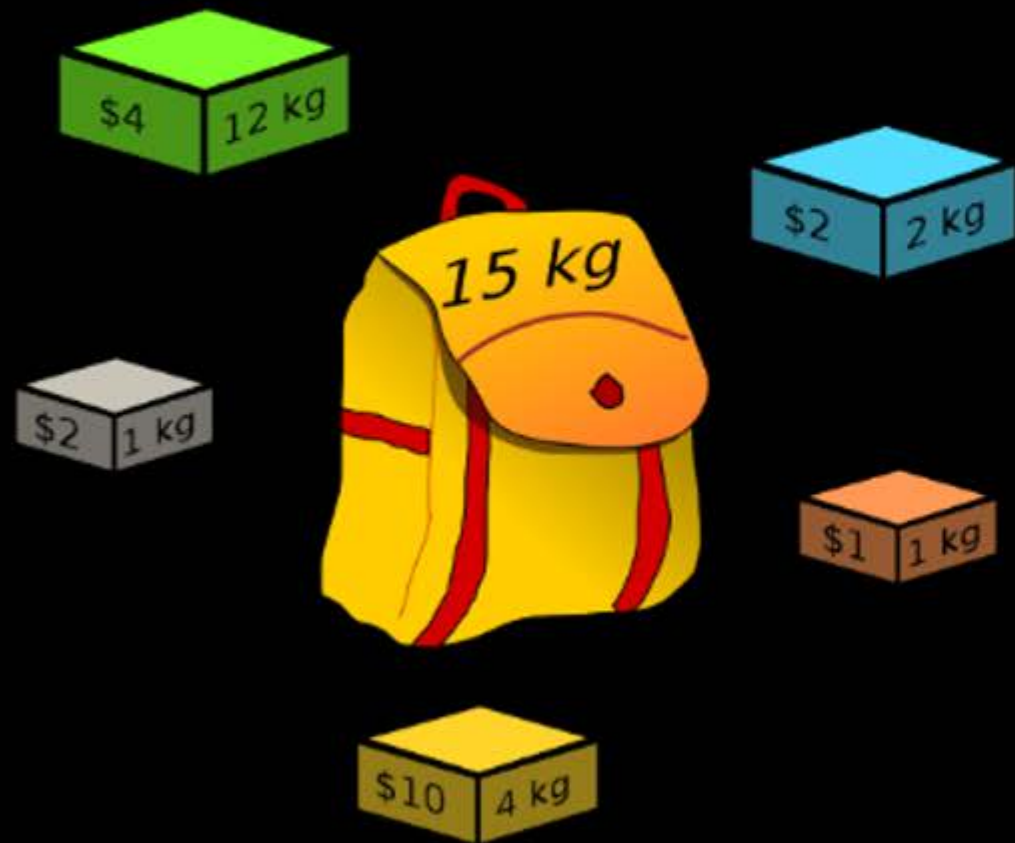
This measure may be the objective function. In fact, several different optimization measures may be plausible for a given problem. Most of these, however, will result in algorithms that generate suboptimal solutions. This version of the greedy technique is called the *subset paradigm*.

# Greedy Method Control Abstraction

# Greedy Method Control Abstraction

```
Algorithm GreedyMethod (a, n) { find subset of n  
  // a is an array of n inputs  
  Solution: =  $\emptyset$ ;  
  for i: = 1 to n do{ Ordering  
    s: = select (a);  
    if (feasible (Solution, s)) then {  
      Solution: = union (Solution, s);  
    }  
  else  
    reject (); // if solution is not feasible reject it.  
  }  
  return solution;}
```





- optimal
- -feasible
- objective function
- constraints
- Selection sentence

# Knapsack Problem

# Knapsack Problem

Fractional

We are given a bag/knapsack with capacity of  $M$ .

We are given  $n$  objects where each object  $i$  is associated with profit  $p_i$  and weight  $w_i$ .

Objective function: if an object  $i$  with capacity  $w_i$  is filled in the bag profit  $p_i$  is earned.

If fraction  $x_i$  of the object is ~~don~~ added then profit  ~~$w_i$~~   $p_i x_i$  will be earned  $0 \leq x_i \leq 1$

Objective function: find filling of knapsack so the maximum profit is earned.

# Knapsack Problem

- **Problem statement:** Let us try to apply the greedy method to solve the knapsack problem. We are given  $n$  objects and a knapsack or bag. Object  $i$  has a weight  $w_i$  and the knapsack has a capacity  $m$ . If a fraction  $x_i$ ,  $0 \leq x_i \leq 1$ , of object  $i$  is placed into the knapsack, then a profit of  $p_i x_i$  is earned.

# Knapsack Problem

- *Objective function:*

# Knapsack Problem

- **Objective function:** The objective is to obtain a filling of the knapsack that maximizes the total profit earned. Since the knapsack capacity is m, we require the total weight of all chosen objects to be at most m.

Constraints

$$\sum_{1 \leq i \leq n} \pi_i w_i \leq \underline{M}$$



# Knapsack Problem

- Maximize  $\sum_{1 \leq i \leq n} p_i x_i$
- subject to  $\sum_{1 \leq i \leq n} w_i x_i \leq M$
- $0 \leq x_i \leq 1, 1 \leq i \leq n$

# Knapsack Problem

A feasible solution

An optimal solution

# Knapsack Problem

A feasible solution (or filling) is any set  $(x_1, \dots, x_n)$  satisfying constraints and condition above. An optimal solution is a feasible solution for which maximized the objective function.

$(0, 1, 1)$  - Not feasible  
 $(1, 1, 1)$  - Not feasible

## Example

**Example-1** Knapsack capacity is  $m = \underline{20}$ , find the filling of the bag that maximizes the profit with following data given

$n = 3$ ,  $m = 20$ ,  $(p_1, p_2, p_3) = (25, 24, 15)$ , and  $(w_1, w_2, w_3) = (18, 15, 10)$ .

	(1)	(1/2)	
	1	2	3
$w_i$	18	15	10
$p_i$	25	24	15
$p_i/w_i$	1.38	1.6	1.5

profit vector

Greedy about profit

weight vector

$$48/15 = 3.2 \Rightarrow 28.2$$

$$w_i \quad \underline{18} \quad \underline{2}$$

$$\text{profit/weight} \quad \frac{24}{15} \times 2$$

Greedy about weight

profit per unit weight

arrange the object in that order, 2, 3, 1

Select - 2 - profit 24

Select - 3 ~~un~~  $m=5$

$1/2 \cdot 15 = 7.5$  total 31.5



## Example

Example-2 Knapsack capacity is  $m = 15$ , find the filling of the bag that maximizes the profit

Object <u>No.</u>	1	2	3	4	5	6	7
Profit $-p_i$	10	5	15	7	6	18	3
Weight $-w_i$	2	3	5	7	1	4	1

feasible  
Objective function  
Constraints

profit/weight      5       $\frac{5}{3}$       3      1      6      4.5      3

$= 1.66$

profit - 6      profit - 6 + 10      profit - 6 + 10 + 18      profit - 6 + 10 + 18 + 15  
weight - 14      weight - 12      weight - 8      3

profit 6 + 10 + 18 + 15 + 3      profit = 6 + 10 + 18 + 15 + 3 +  $\frac{10}{3}$  = 55.33  
weight - 2      weight (0)

3 - 5 -  $\frac{5}{3}$   
2 -  $\frac{10}{3}$



## Answer

Example-2 Knapsack capacity is  $m = 15$ , find the filling of the bag that maximizes the profit

Object	1	2	3	4	5	6	7
Profit $-p_i$	10	5	15	7	6	18	3
Weight $-w_i$	2	3	5	7	1	4	1

Answer 55.33



Job task

Sequencing - How job will be  
Completed in order

Your production manager

- There are  $n$  jobs given, & with each job  $j_i$  the profit  $p_i$  and deadline  $d_i$  is associated.
- The profit  $p_i$  is earned if job  $j_i$  completing by its deadline.

## Job Sequencing with Deadline

- To complete the job one has to Run the job on a m/c for 1 time unit  
Only one m/c is available

## Problem Statement

Maximum profit earned

## Problem Statement

- We are given a set of  $n$  jobs. Associated with job  $i$  is an integer deadline  $d_i \geq 0$  and a profit  $p_i > 0$ .
- For any job  $i$  the profit  $p_i$  is earned iff the job is completed by its deadline.

## Problem Statement

- How to Complete a job:



## Problem Statement

- To complete a job, one has to process the job on a machine for one unit of time. Only one machine is available for processing jobs-
- A feasible solution for this problem is a subset  $J$  of jobs such that each job in this subset can be completed by its deadline.

## Problem Statement

- Value of feasible solution
- An optimal solution

## Problem Statement

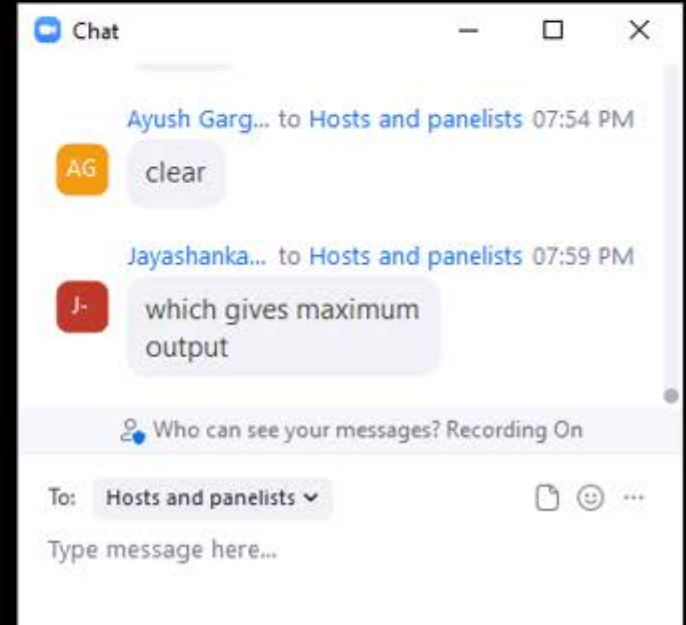
- The value of a feasible solution  $J$  is the sum of the profits of the jobs in  $J$ , or  $\sum_{i \in J} p_i$ . feasible solution: Every set of jobs which completed by its deadline is a feasible solution.
- An optimal solution is a feasible solution with maximum value. Here again, since the problem involves the identification of a subset, it fits the subset paradigm. Optimal solution is a best feasible solution that maximum profit.

# Problem Statement

feasible Solution: Every Set of jobs which completed by its deadline is a feasible Solution.

Optimal Solution: Optimal Solution is a ~~feasible~~ feasible Solution that maximum profit.

Talking: ACE Live Class 1





(2,4) Not feasible

## Example

deadline is not exceeding 2

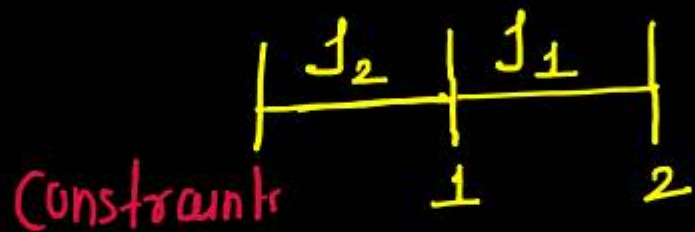
- Example Let  $n = 4$ ,  $(p_1, p_2, p_3, p_4) = (100, 10, 15, 27)$  and  $(d_1, d_2, d_3, d_4) = (2, 1, 2, 1)$ . The feasible solutions and their values are:

2(1), 2(1)

	feasible solution	processing sequence	value
1.	(1, 2)	2, 1 ✓	110
2.	(1, 3)	$\begin{pmatrix} 1-3 \\ 3-1 \end{pmatrix}$	115
3.	(1, 4)	4-1	127
4.	(2, 3)	2-3	25
5.	(3, 4)	4-3	<u>42</u>

C(2,2) ✓

(2,4)



- only one M/c available
- Process the job for 1 time unit
- Completing jobs by its deadline

How many jobs can be completed  
I have to run the job on a m/c for 1 time unit

I can only complete 2 jobs.



## Example

- Example Let  $n = 4$ ,  $(p_1, p_2, p_3, p_4) = (100, 10, 15, 27)$  and  $(d_1, d_2, d_3, d_4) = (2, 1, 2, 1)$ . The feasible solutions and their values are:

	feasible solution	processing sequence	value
1.	(1, 2)	2, 1	110
2.	(1, 3)	1, 3 or 3, 1	115
3.	(1, 4)	4, 1	127
4.	(2, 3)	2, 3	25
5.	(3, 4)	4, 3	42

## Example

maximum profit

Task	J <sub>1</sub>	J <sub>2</sub>	J <sub>3</sub>	J <sub>4</sub>	J <sub>5</sub>	J <sub>6</sub>	J <sub>7</sub>
Profit	35	30	25	20	15	12	5
Deadline	3	4	4	2	3	1	2

How many jobs  
can be completed?

Selection Criteria:



110 is maximum  
profit earned

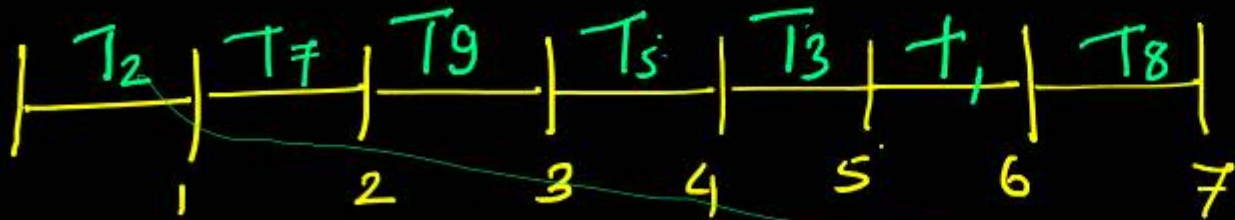
- Ordering the job in decreasing order of profit.
- Selecting a job and putting the last so that Initial slot can be filled by other jobs

## GATE 2005

We are given 9 tasks  $T_1, T_2, \dots, T_9$ . The execution of each task requires one unit of time. We can execute one task at a time. Each task  $T_i$  has a profit  $P_i$  and a deadline  $d_i$ . Profit  $P_i$  is earned if the task is completed before the end of the  $d_i^{th}$  unit of time.

Order in decreasing order of profit

Task	$T_1$	$T_2$	$T_3$	$T_4$	$T_5$	$T_6$	$T_7$	$T_8$	$T_9$
Profit	15	<u>20</u>	<u>30</u>	18	18	<u>10</u>	<u>23</u>	<u>16</u>	25
Deadline	<u>7</u>	2	5	3	4	5	<u>2</u>	7	3



- which job will be left out -  $T_4, T_6$
- Maximum profit earned

$$30 + \underline{25} + 23 + 20 + 18 + 16 + 15 = \underline{147}$$

## GATE 2005

Task	$T_1$	$T_2$	$T_3$	$T_4$	$T_5$	$T_6$	$T_7$	$T_8$	$T_9$
Profit	15	20	30	18	18	10	23	16	25
Deadline	7	2	5	3	4	5	2	7	3

1. Are all tasks completed in the schedule that gives maximum profit?

(a) All tasks are completed

(b)  $T_1$  and  $T_6$  are left out

(c)  $T_1$  and  $T_8$  are left out

 (d)  $T_4$  and  $T_6$  are left out



# GATE 2005

Task	T <sub>1</sub>	T <sub>2</sub>	T <sub>3</sub>	T <sub>4</sub>	T <sub>5</sub>	T <sub>6</sub>	T <sub>7</sub>	T <sub>8</sub>	T <sub>9</sub>
Profit	15	20	30	18	18	10	23	16	25
Deadline	7	2	5	3	4	5	2	7	3

Q. What is the maximum profit earned?

✓ (a) 147

(b) 165

(c) 167

(d) 175

1. optimal merge pattern

2. Huffman code

3. Prims & Kruskal  
Spanning tree

4. Dijkstra's shortest path)  
Single source shortest path

1. knapsack problem (fractional)

2. Job sequencing with deadline

1. optimal solution

2. feasible & solution

3. objective function

4. ordering (selection criteria)

5. constraints



Q. How many different schedules are possible?

Task	T <sub>1</sub>	T <sub>2</sub>	T <sub>3</sub>	T <sub>4</sub>	T <sub>5</sub>	T <sub>6</sub>	T <sub>7</sub>	T <sub>8</sub>	T <sub>9</sub>
Profit	15	20	30	18	18	10	23	16	25
Deadline	7	2	5	3	4	5	2	7	3

# Question Homework

Q. We are given 9 tasks  $T_1, T_2, \dots, T_9$ . The execution of each task requires one unit of time. We can execute one task at a time. Each task  $T_i$  has a profit  $P_i$  and a deadline  $d_i$ . Profit  $P_i$  is earned if the task is completed before the end of the  $d_i^{th}$  unit of time.

Task	$T_1$	$T_2$	$T_3$	$T_4$	$T_5$	$T_6$	$T_7$	$T_8$	$T_9$
Profit	15	20	30	18	18	10	23	16	25
Deadline	5	3	7	3	4	6	7	4	3

If we want to maximize the profit then Number of different schedule possible is

# Heap

Binary Heap See Selection criteria  
min to come out

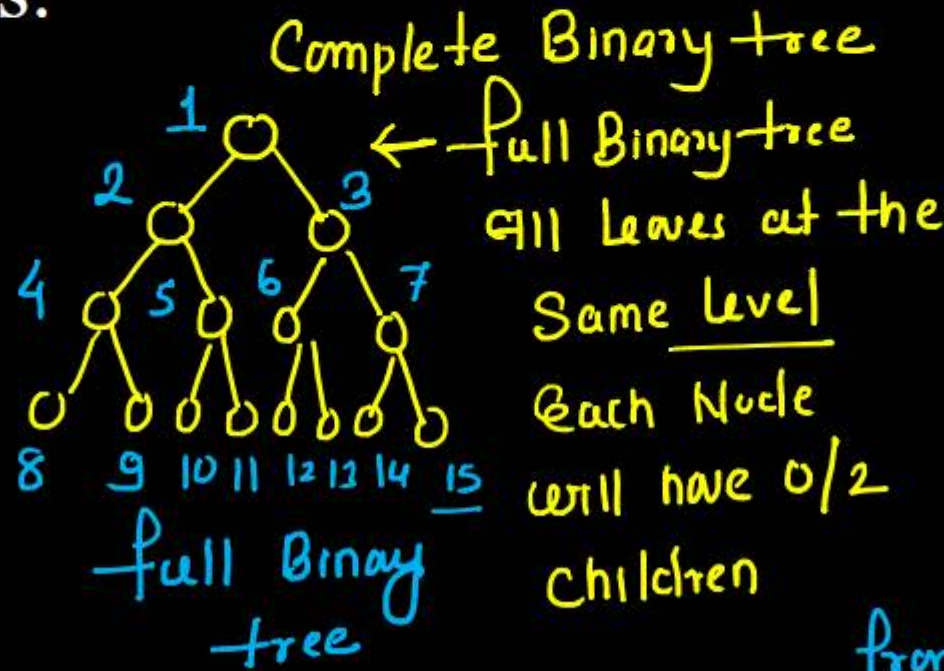
A Heap is a special Tree-based data structure in which

the tree is a **complete binary tree**. Generally, Heaps

min/max  
deletion

can be of two types:

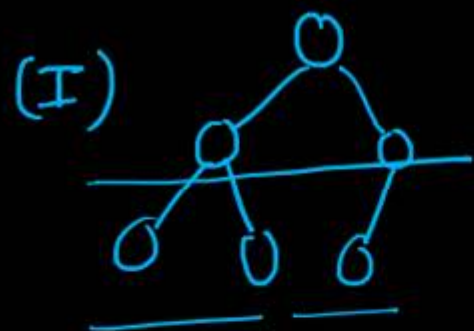
- Min Heap ✓
- Max heap ✓



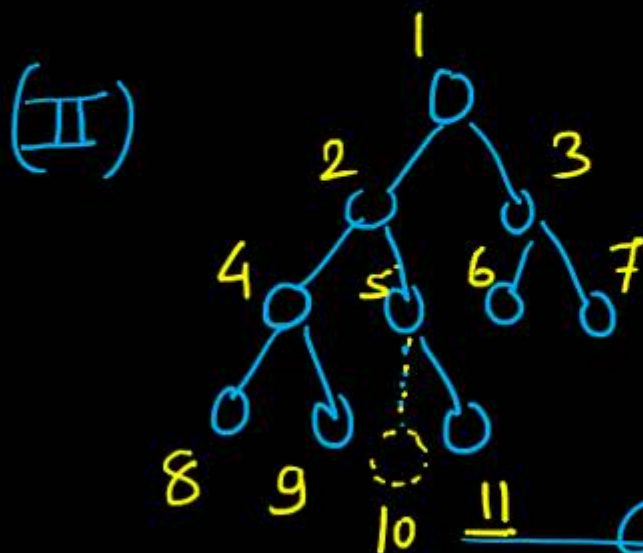
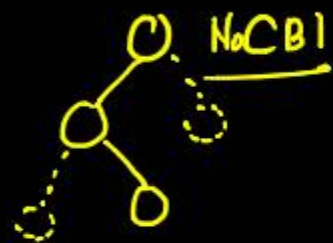
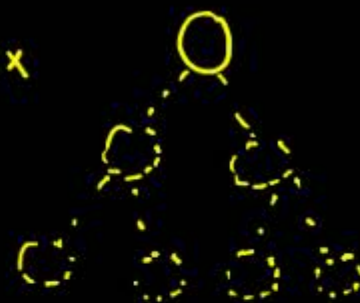
Complete Binary tree is a tree in which every level is full except the last. At the last level the nodes will be filled from as left as possible



# (I) Complete Binary tree



complete binary tree No or Index



Complete Binary tree?

Not a complete binary tree

Not CBT

Not filled

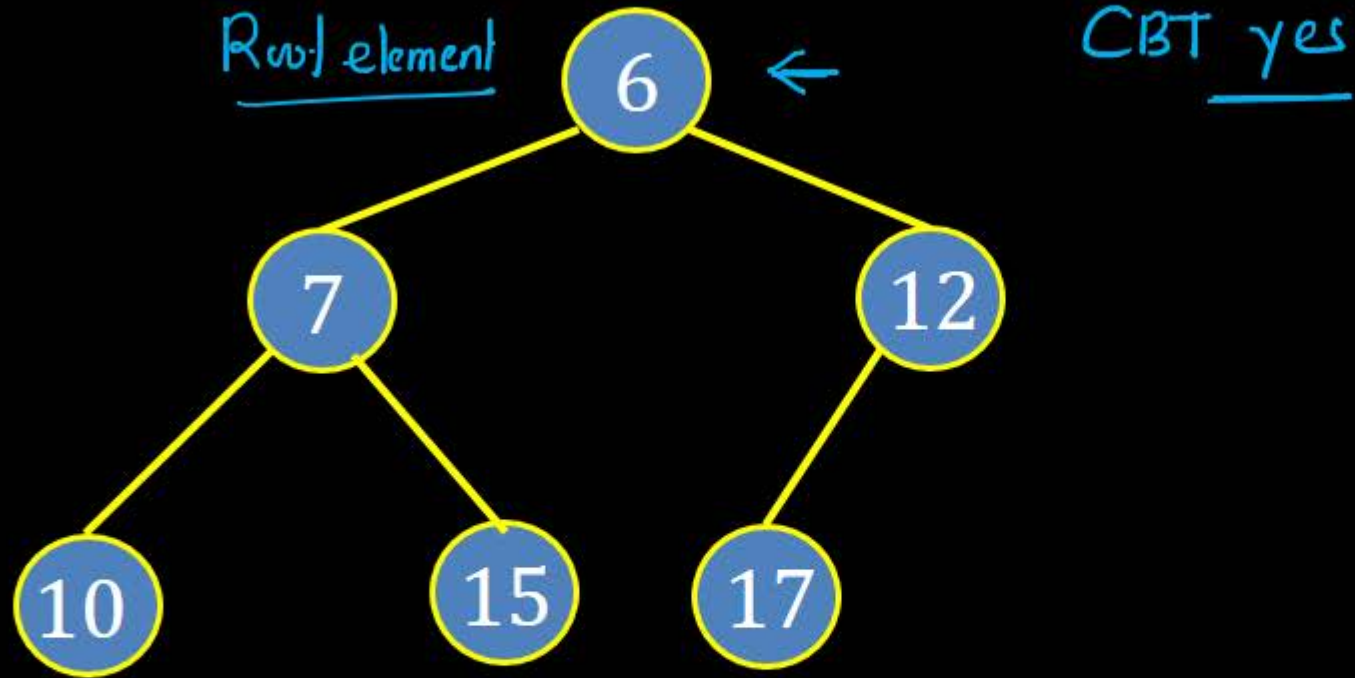
Fill the circle index wise  
there should be no empty position

# Min Heap

**Min-Heap:** In a Min-Heap the **key** present at the root node must be **minimum among the keys present at all of it's children**. The same property must be recursively true for all sub-trees in that Binary Tree.



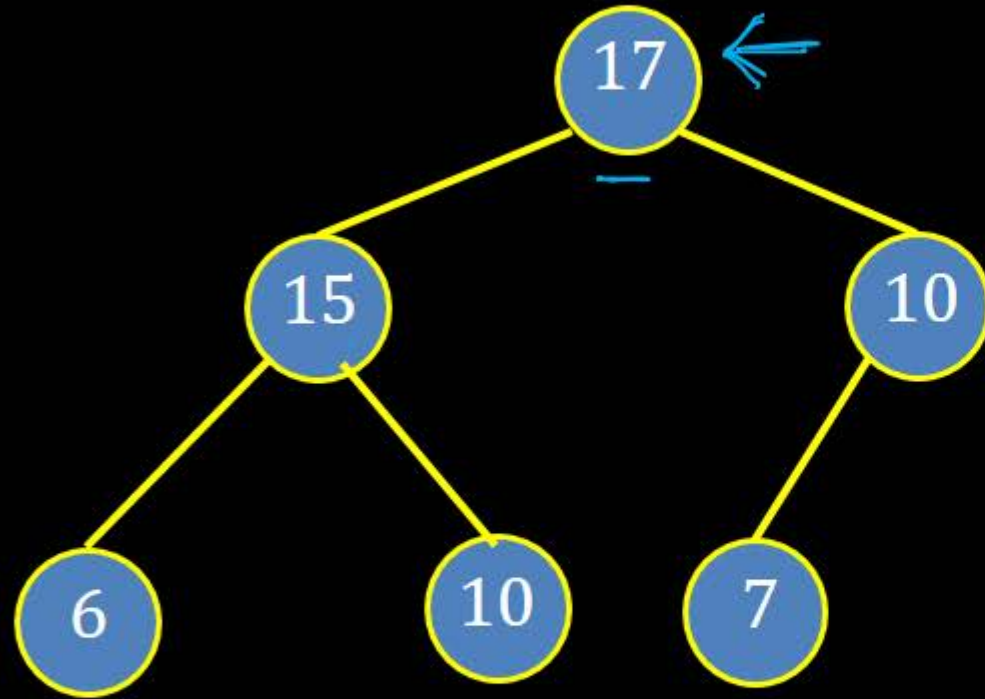
# Min Heap



# Max Heap

**Max-Heap:** In a Max-Heap the *key* present at the root node must be **greatest among the keys present at all of it's children**. The same property must be recursively true for all sub-trees in that Binary Tree.

# Max Heap



Every level this  
~~prob~~ property  
will be satisfied

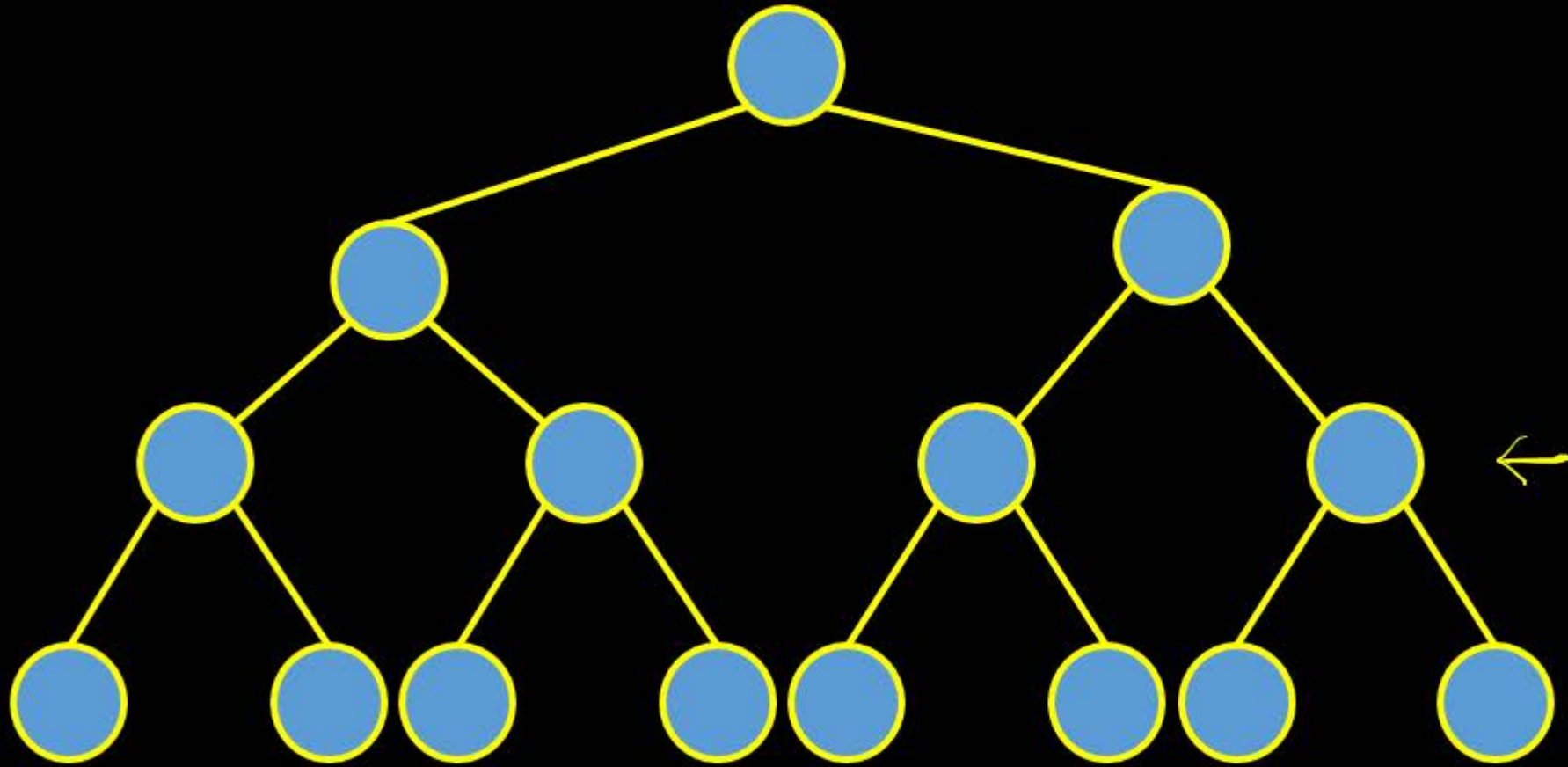
- Insert :
- Deletion :

Cost  
Cost

## Complete Binary Tree

A complete binary tree is a binary tree in which every level, except possibly the **last**, is **completely filled**, and all nodes are as far **left** as possible.

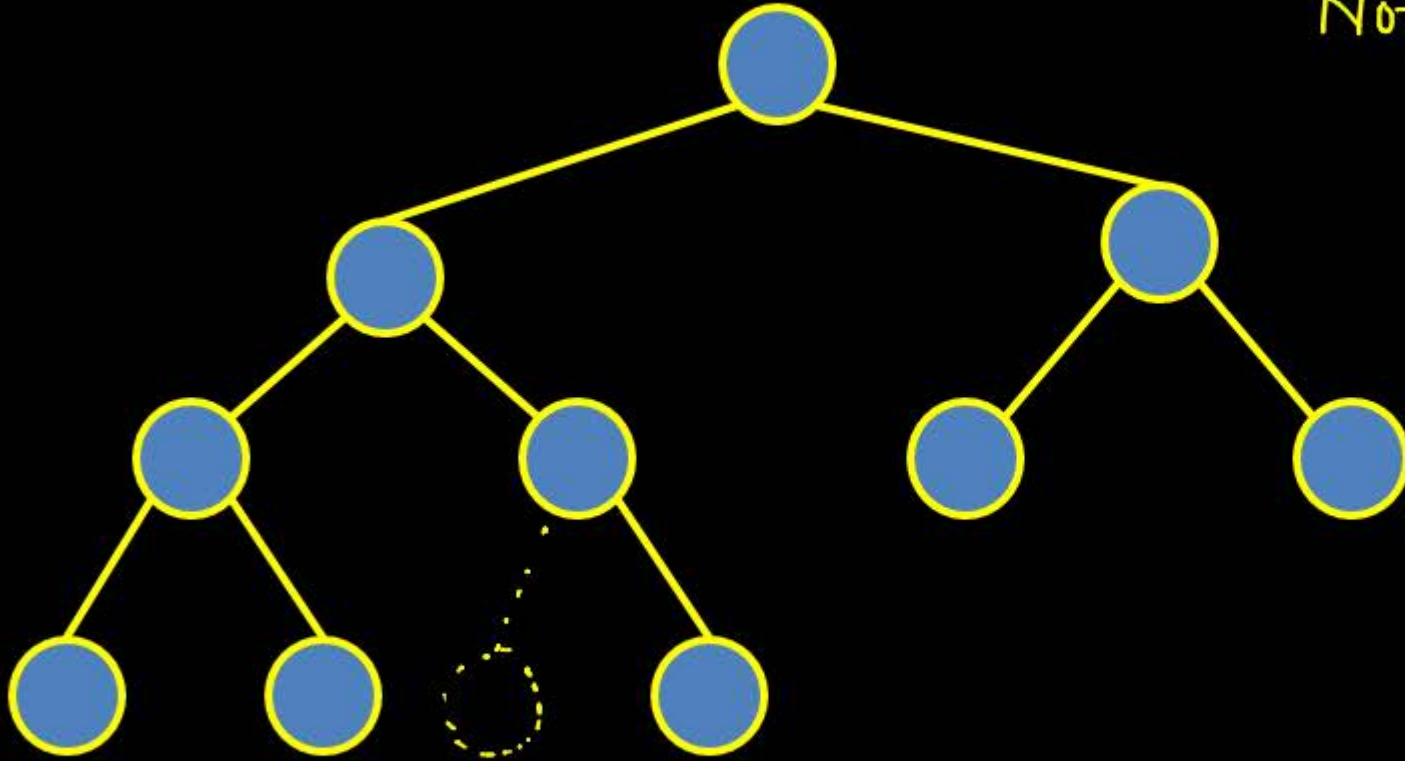
# Complete Binary Tree





# Not a Complete Binary Tree

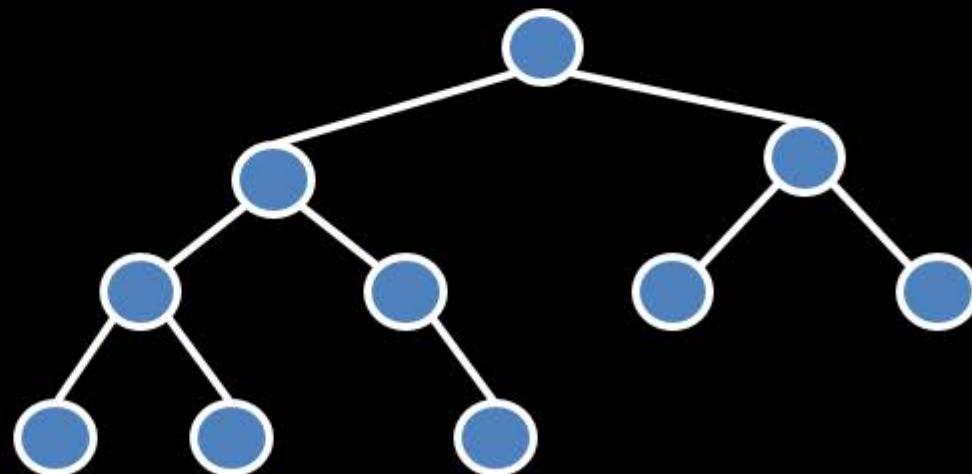
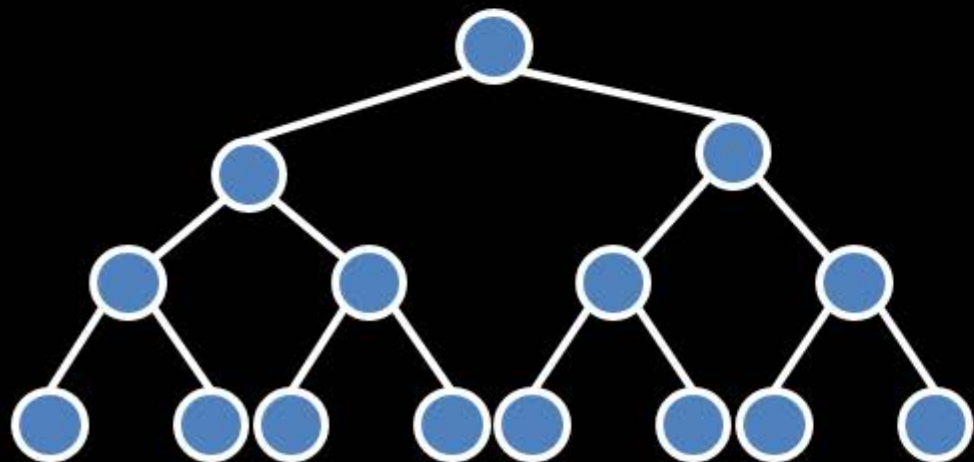
Not CBT



# Complete Binary Tree

- A complete binary tree is a binary tree in which every level, except possibly the **last**, is **completely filled**, and all nodes are as far **left** as possible.

## Not a Complete Binary Tree



## Question

The number of nodes a heap of height  $k$  can hold is

(A) ~~(A)~~  $2^k$  to  $2^{k+1} - 1$

(B)  $2^{k+1}$  to  $2^{k+1} - 1$

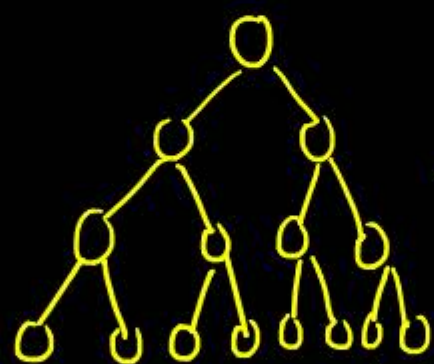
(C)  $2^{k-1}$  to  $2^{k+1} - 1$

(D)  $2^k - 1$  to  $2^{k+1} - 1$

Binary tree  $k$

Range - Minimum No. of Nodes  
Maximum No. of Nodes

$k=3$



maximum No. of Nodes  
 $2^0 + 2^1 + 2^2 + 2^3 = \frac{1(2^4 - 1)}{2 - 1}$

$2^0 + 2^1 + 2^2 + \dots + 2^{k-1} + 1$

$\frac{1(2^k - 1)}{2 - 1} + 1$

$2^{k-1} + 1 = \boxed{2^k}$

$\left[ \begin{aligned} &= 2^{k+1} - 1 \\ &= 2^{k+1} - 1 \end{aligned} \right]$

