

UPES
TECH

Date

02.06.12

① Cormen
② Google

Cosmos

Algorithms

Syllabus

- ① Analysis
- ② Divide & Conquer
- ③ Greedy Technique
- ④ Dynamic Programming
- ⑤ Graph, Tree
- ⑥ Hashing
- ⑦ P,NP,NPC,NPH

Algorithm

Definition: It is a combination of sequence of finite steps to solve a particular problem.

steps

Properties of Algorithm

- ① It should take finite time to produce o/p.
- ② It should produce the correct o/p.
- ③ Every step in the algo should be unambiguous (or) deterministic.
- ④ Every step in the algorithm should perform some task.
- ⑤ Every algo should produce atleast 1 output.
- ⑥ Every algo should take zero or more i/p.
- ⑦ Algorithm should be independent of programming language.

Non-Deterministic
Algo:-
Random no.
generator

Analysis Of Algorithm

Note: How to check in the available algorithms which is the best one?

① Time ② Space

How to find time complexity of the algo?

$T(A)$:- time complexity of the algorithm A

$T(A) = C(A) + R(A)$

Compile Run-time
time of A

- It depends on the compiler
- It depends on the processor
- $B/I/W$
- $H/I/W$

$\star n$ is considered to be very large

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Analysis

Apostasy

depends
on
compiler &
processor.

- ① It is programming of a compiler & b/w dependent analysis.
- ② It is dependent. The complexity/ answer changes from comp. to computer.
- ③ Exact answers.

Apportion

- ① It is independent of programming language & h/w.
- ② The answers will not change. (i.e. the complexity doesn't change from computer to computer.)
- ③ Approximated answers.

Apostasy Analysis:-

is the determination of order of magnitude of a statement

Main()

```
f int x,y,z;
x=y+z;
```

order of magnitude of this statement is 1.
(which means that this statement is executed once when the program executes.)

Main()

```
1. f int x,y,z,i,n;
   x=y+z;           → order of magnitude = 1
   for (i=1; i<n; i++)
       x=y+z;         → order of magnitude = n
   }
```

$n+2 = O(n)$

No. of statements & steps:

```
Main()
f int x,y,z,i,j,n;
x=y+z;           → order of magnitude = 1
for (i=1; i<n; i++)
    x=y+z;         → " " " " = 1
    for (j=1; j<n; j++)
        x=y+z;     → " " " " = n^2
    }
```

$n^2 + n = O(n^2)$

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④ Main()

```
{ int x,y,z,i,j,n;
    for (i=1 to n)
        for (j=1 to n/2)
            x = y + z;
```

→ order of magnitude = 1
 $\rightarrow \dots \dots \dots = 1$

$x = y + z; \quad \rightarrow \dots \dots \dots = n$
 $\rightarrow \dots \dots \dots = n$

$\rightarrow \dots \dots \dots = n/2$
 $\rightarrow \dots \dots \dots = n^2/2$

$$\frac{n^2}{2} + n \Rightarrow \frac{1}{2}n^2 = O(n^2) \rightarrow \text{as } n \text{ is constant}$$

therefore n^2 is dominant



⑤ Main()

```
{ int x,y,z,n;
    x = y + z;
    while (n > 1)
        { x = y + z;
        n = n/2; }
```

→ order of magnitude = 1
 $\rightarrow \dots \dots \dots = 1$

if $n = 16$ then loop will be executed 4 times.

if $n = 8$ then loop will be executed 3 times.

if $n = 4$ then loop will be executed 2 times.

if $n = 2$ then loop will be executed 1 time.

$$\log_2 n$$

∴ $2(\log_2 n)$ statements will be executed.
 $\approx 2\log_2 n + 2$
but we can neglect +2 multiple &
complexity is $\log_2 n$

but if $n = n/3$
then $\log_3 n$
if $n = n/10$
then $\log_{10} n$

but if $n = n-1$
then $O(n)$
if $n = n-2$
then $\frac{n}{2}, \text{ i.e. } O(n)$

⑥ Main()

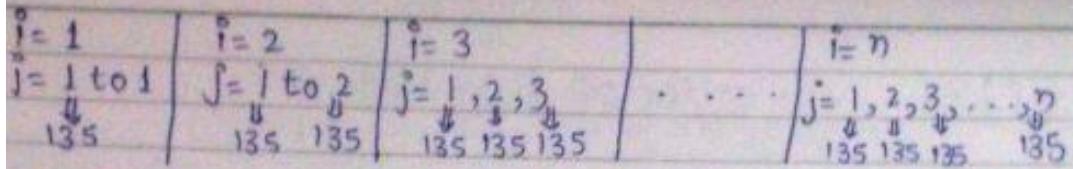
```
{ int x,y,z,i,j,k,n;
    for (i=1 to n)
        { for (j=1 to i)
            { for (k=1 to 135)
                { R = y + z; }}
```

→ order of magnitude = n
 $\rightarrow 1, 2, 3, \dots, n$

→ order of magnitude = 135

$135 \times n \left[\frac{n(n+1)}{2} \right] = \frac{135 \times n^2(n+1)}{2}$
 $= (135n^3 + 135n)/2$

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$$\begin{aligned}
 T &= 1 \times 135 + 2 \times 135 + \dots + n \times 135 \\
 &= 135 [1+2+\dots+n] \\
 &= 135 \frac{n(n+1)}{2} \Rightarrow O(n^2)
 \end{aligned}$$

Main()

{ int x, y, z, i, j, k, n;
 for (i = 1 to n)

{ for (j = 1 to i^2)

{ for (k = 1 to n/2)

{ x = y + z;

}

y
q

$$T = 1 \times \frac{n}{2} + 4 \times \frac{n}{2} + 9 \times \frac{n}{2} + \dots + n^2 \times \frac{n}{2}$$

$$= \frac{n}{2} [1 + 4 + 9 + \dots + n^2] = \frac{n}{2} \frac{n(n+1)(2n+1)}{6}$$

$\downarrow O(n^4)$

Main()
 { $n = 2^{2^k}$

for (i = 1; i <= n; i++)

{ $j = 2^i$

while ($j \leq n$)

{ $t = j^2$;

}

y
q

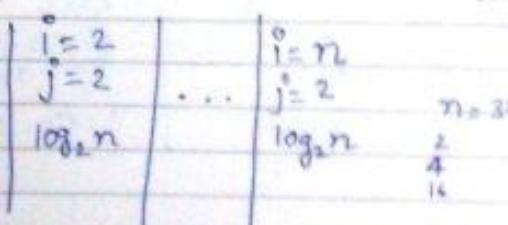
~~nextlog2n~~

~~nxlog~~

$n \times (k+1)$

$n \times [\log_2 \log_2 n] + n$

$\Rightarrow O(n \log_2 \log_2 n)$



$$\begin{aligned}
 n &= 2^{2^k} \\
 \log_2 n &= 2^k
 \end{aligned}$$

$$\log_2(\log_2 n) = k$$

2^{2^k}

2^{2^k-n}

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$k=1$	$k=2$	$k+1$
$n=4$	$n=16$	
$2 \leq 4$	$2 \leq 16$	
$\boxed{2}$	$\boxed{2}$	
$4 \leq 4$	$4 \leq 16$	
$\boxed{4}$	$\boxed{4}$	
$16 \leq 4$	$16 \leq 16$	
$\boxed{16}$	$\boxed{16}$	
2	$256 < 16$	
	$\boxed{256}$	
	3	

$O(1)$: It will take same time always

① $A(n)$

```

if (n ≤ 1) return;
else
    return (A( $\sqrt{n}$ ));
}

```

$\hookrightarrow O(\log \log n)$

$A(1000)$
 $\hookrightarrow A(33) \rightarrow 4$ times
 $\hookrightarrow A(6)$
 $\hookrightarrow A(3)$
 $\hookrightarrow A(1)$

$n=1$	$n=2$	$n=3$
$A(\sqrt{1})$	$A(\sqrt{2})$	$A(\sqrt{3})$
$O(1)$	$O(\log \sqrt{2})$	$O(\log \sqrt{3})$
$O(1)$	$O(\log \log 2)$	$O(\log \log 3)$
$O(1)$	$O(1)$	$O(1)$

$$T(n) = \begin{cases} O(1), & n=1 \\ T(\sqrt{n}) + O(1), & \text{otherwise} \end{cases}$$

$$\text{put } n = 2^k$$

$$T(2^k) = T(2^{k/2}) + O(1)$$

$$S(k) = S(k/2) + O(1)$$

$$2^{k/2} \cdot k \log 2^k = k^2$$

$$\therefore O(k \log k) = O(k^2)$$

$$\therefore O(\log k) = O(\log \log n)$$

② i/p: An array of n -elements in the range $[1 \dots n]$
o/p: print repeated elements.

What is the time complexity?

→ The best algo is:

① for ($i=1$ to n) $\rightarrow O(n)$

② for ($i=1$ to n) $\rightarrow n$

flag[i] = 0
 $\rightarrow n$
 $\text{if } (\text{flag}[a[i]] \neq 0)$ $\rightarrow n$
 $\text{flag}[a[i]] = 1$
 else
 $\text{print } [a[i]]$

Space complexity increases in this case

$\rightarrow O(n)$

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Multiplication

$$A = \begin{bmatrix} 1 & 2 & 3 \\ 4 & 5 & 6 \end{bmatrix}_{m \times n}$$

$$B = \begin{bmatrix} 1 & 4 \\ 2 & 5 \\ 3 & 6 \end{bmatrix}_{n \times p}$$

$$C = A \times B = \begin{bmatrix} * & 0 \\ 0 & * \end{bmatrix}_{m \times p}$$

each element will take n multiplications to compute.

& there are $m \times p$ elements

$$\therefore \text{total no. of multiplications} = m \times n \times p$$

$\therefore O(mnp)$

>Addition of $2 \times m$ matrices require order $O(1) = O(n^2)$.

Multiplication of $2 \times n$ matrices require $O(n^3)$.

Asymptotic Notation

Big-O-Notation (O)

Omega-Notation (Ω)

Theta-Notation (Θ)

little-O-Notation

$$(n) = O(g(n))$$

(n) is order of $f(n)$ iff

$$f(n) \leq c g(n) \quad \forall n, n \geq n_0$$

where c, n_0 are two constants $f: c > 0, n_0 \geq 1$

$$(n) = n$$

$$(n) = n^2$$

$$f(n) = O(g(n)) \quad \text{iff}, n \geq n_0$$

$$\downarrow$$

$$n \leq n^2, n \geq 1$$

$$(n) = n^2 + 10$$

$$g(n) = n^2$$

$$(n) = O(g(n))$$

$$n^2 + 10 \leq C \cdot n^2, n \geq n_0$$

$$\frac{1}{2}$$

$$\frac{1}{2}$$

$$\frac{1}{4}$$

C : Speed of the processor

n : no. of inputs
as no. of I/Os can't
be fractions, \therefore
 $n \in \mathbb{N}$

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- $f(n) = n^2$
- $g(n) = n$
- $f(n) \leq c \cdot g(n)$
- there is no c for these functions
 $\therefore f(n) \neq O(g(n))$

★ $g(n)$ is greater by factor ' c ' than $f(n)$.

Omega-Notation (Ω)

$$f(n) = \Omega(g(n))$$

or

$f(n)$ is omega of $g(n)$ iff
 $f(n) \geq c \cdot g(n) \quad \forall n, n \geq n_0$

where c & n_0 are 2 constants, $c > 0$ & $n_0 \geq 1$

$$f(n) = n^2 - 10$$

$$g(n) = n^2$$

$$f(n) = \Omega(g(n))$$

$$n^2 - 10 \geq c_1 \cdot n^2 \quad [n_0 \geq 5]$$

$g(n)$ is smaller than
 $f(n)$ by ' c ' times.

$$f(n) = n^2$$

$$g(n) = n$$

$$n^2 \geq c_1 \cdot n, n \geq 1$$

↓

$$f(n) = n$$

$$g(n) = n^2$$

$$n \geq c_1 \cdot n^2$$

there is no such c .
 $\therefore f(n) \neq \Omega(n^2)$

Theta-Notation

$$f(n) = \Theta(g(n))$$

$f(n)$ is theta of $g(n)$ iff

① $f(n)$ is Order of $g(n)$

$$f(n) \leq c_1 g(n) \text{ &}$$

② $f(n) = \Omega(g(n))$

$$\text{i.e. } f(n) \geq c_2 g(n)$$

such that there exist 2 constants

c_1, c_2 & n_0 where

$$c_1 > 0, c_2 > 0 \text{ & } n_0 \geq 1.$$

→ [the value of n_0 should be same for both ① & ②?]

e.g.

$$f(n) = n^2 + 10$$

$$g(n) = n^2$$

$$\textcircled{1} \quad n^2 + 10 \leq c_1 \cdot n^2$$

$$c_1 = 2$$

$$\textcircled{2} \quad n^2 + 10 \geq c_2 \cdot n^2$$

$$c_2 = 1$$

$$f(n) = n^2$$

$$g(n) = n^2$$

$$n^2 = O(n^2)$$

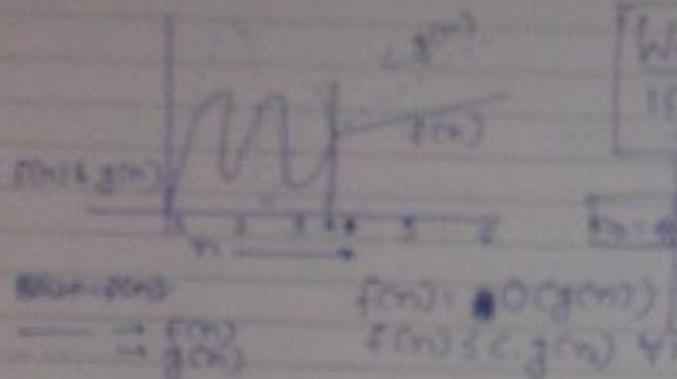
$$n^2 = \Omega(n^2)$$

$$n^2 = \Theta(n^2)$$

$$n^2 + 10 = \Theta(n^2)$$

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Big-O Notation



Worst Case

If $T(n) = O(n^3)$

It's meant that whenever n is given to us, it has to run at least n^3 times.

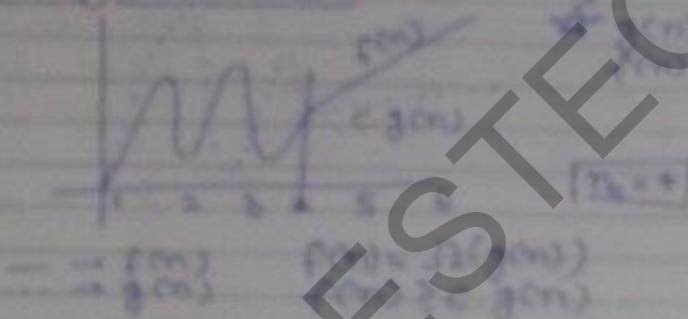
$T(n) = 1 - O(n^3)$

$T(n) = 1 + O(n^3)$

$T(n) = 1 + O(n^3)$

here, $g(n)$ is unbounded on all the values of $f(n)$.

Omega Notation



$f(n) \geq g(n)$ is greater than $g(n)$ by Ω times.

Best Case:

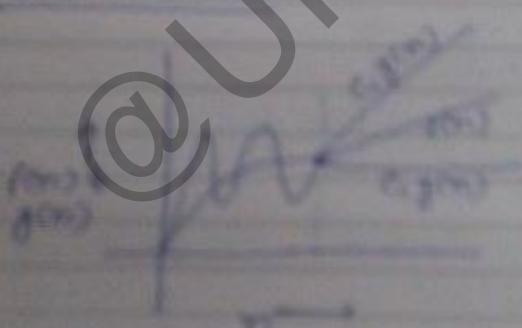
$T(n) = \Omega(n^2)$

It's meant that whenever n is given to us, it has to be less than n^2 times.

$T(n) = \Omega(n^2)$

$T(n) = \Omega(n^2)$

Theta Notation



$f(n) = \Theta(g(n))$

$f(n) > C_1.g(n) \rightarrow \text{Big-O Notation}$

$f(n) < C_2.g(n) \rightarrow \text{Omega Notation}$

C_1, C_2 may be different or may be same.

We can use any symbol for average time complexity

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★ If there are 2 algo A & B.

$T(A) = O(T(B)) \rightarrow A$ is better

$T(A) = \Omega(T(B)) \rightarrow B$ is better

$T(A) = \Theta(T(B)) \rightarrow$ Both are equivalent.

Conclusion :-

Big-Oh-Notation (O)

$n^2 = O(n^3) \rightarrow$ Tightest upper bound [the upper bound which is exactly equal to the $f(n)$.]

$n^2 = O(n^3)$

$n^2 \neq O(n)$

$n^2 = O(n^{100})$

$A = O(B)$ here B is upper bound, where B may or may not be tight upper bound.

Small-Oh-Notation :-

$n^2 = O(n^3) \quad f(n) = o(g(n))$
 $f(n) < c_1 g(n), \forall n, n \geq n_0$

$n^2 = O(n^{100}) \quad$ such that $c > 0$ & $n_0 \geq 1$.

$n^2 \neq o(n^3)$

$A = o(B)$, here B is upper bound, where B is not tightest upper bound.

Big-Omega Notation (Ω) :-

$n^2 = \Omega(n^2) \rightarrow$ tightest lower bound.

$n^2 = \Omega(n)$

$n^2 = \Omega(1)$

$A = \Omega(B)$, here B is lower bound which may or may not be tightest lower bound.

Small Omega Notation (ω) :-

$n^2 \neq \omega(n^3) \quad f(n) = \omega(g(n))$

$n^2 = \omega(n) \quad f(n) > c_2 g(n)$

such that $c > 0$ & $n \geq n_0$.

$\forall n \geq 1$

$A = \omega(B)$, here B is lower bound which is not tightest lower bound.

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Theta-Notation (Θ)

$n^2 = \Theta(n^2) \rightarrow$ Both Tightest Upper bound & tightest lower bound

$n^2 \neq \Theta(n)$

$n^2 \neq \Theta(n^3)$

$A = \Theta(B) \rightarrow B$ is both Tightest upper bound & tightest lower bound.

Types Of Time Complexity :-

(1) Constant time complexity $\Rightarrow O(1)$

(2) Logarithmic time complexity $\Rightarrow O(\log n)$

(3) Linear " $\Rightarrow O(n)$

(4) Quadratic " $\Rightarrow O(n^2)$

(5) Cubic " $\Rightarrow O(n^3)$

(6) Polynomial " $\Rightarrow O(n^k)$ $k \geq 1$

(7) Exponential " $\Rightarrow O(K^n)$ $K \geq 2$

$$n > (\log n)^2$$

$$n > (\log n)^{100} \rightarrow$$
 Value of n is so large that constant powers can't overpower them

$$n < (\log n)^c$$
 where c is a constant by $n < (\log n)^c$

① $T = \sum_{i=1}^n i = 1+2+3+4+\dots+n = \frac{n(n+1)}{2} = O(n^2) = \Omega(n^2)$

② $T = \sum_{i=1}^n i^2 = 1^2 + 2^2 + 3^2 + \dots + n^2 = \frac{n(n+1)(2n+1)}{6} = O(n^3), \Omega(n^3)$

* this means that the sum value can't cross n^3 .

To add the squares of n natural nos., it will take $O(n)$, ie. only one for loop.

③ $T = n \times n \times n \times \dots \times n$ [n times]

$T = O(n^n) \rightarrow$ this means T value can't exceed n^n . It will take $O(n)$ to compute T .

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(iii) $T = n!$

$$\begin{aligned} &= n \times (n-1) \times (n-2) \times \dots \times 3 \times 2 \times 1 \\ &\leq n \times n \times n \times \dots \times n \times n \times n \\ &= O(n^n) \rightarrow n! \text{ can't exceed } n^n \end{aligned}$$

It will take $O(n)$ time to solve it, i.e. to calculate factorial because N will take only one for loop.

(iv) $T = \sum_{i=1}^n x^i$

$$\begin{aligned} &= x + x^2 + x^3 + \dots + x^n \\ &\stackrel{\text{already equal}}{=} x \cdot (x^{n-1}) + O(x^n) \rightarrow \text{it will can't exceed } x^n \text{ with addition value of } x. \end{aligned}$$

① $f(n) = n^2$

$g(n) = 2^n$

$n^2 \leq C \cdot 2^n$

$\Rightarrow f(n) = O(g(n))$

$C = 1 \ \& \ n_0 = 4$

② $f(n) = 2^n$

$g(n) = n^n$

$n^n \geq 2^n$

$n = 1 \quad 2^n = 1$

$n = 2 \quad 2^n = 4$

$n = 3 \quad 2^n = 8$

$n = 4 \quad 2^n = 16$

$n = 5 \quad 2^n = 32$

$n = 6 \quad 2^n = 64$

$n = 7 \quad 2^n = 128$

$n = 8 \quad 2^n = 256$

$n = 9 \quad 2^n = 512$

$n = 10 \quad 2^n = 1024$

$n = 11 \quad 2^n = 2048$

$n = 12 \quad 2^n = 4096$

$n = 13 \quad 2^n = 8192$

$n = 14 \quad 2^n = 16384$

$n = 15 \quad 2^n = 32768$

$n = 16 \quad 2^n = 65536$

$n = 17 \quad 2^n = 131072$

$n = 18 \quad 2^n = 262144$

$n = 19 \quad 2^n = 524288$

$n = 20 \quad 2^n = 1048576$

$n = 21 \quad 2^n = 2097152$

$n = 22 \quad 2^n = 4194304$

$n = 23 \quad 2^n = 8388608$

$n = 24 \quad 2^n = 16777216$

$n = 25 \quad 2^n = 33554432$

$n = 26 \quad 2^n = 67108864$

$n = 27 \quad 2^n = 134217728$

$n = 28 \quad 2^n = 268435456$

$n = 29 \quad 2^n = 536870912$

$n = 30 \quad 2^n = 1073741824$

$n = 31 \quad 2^n = 2147483648$

$n = 32 \quad 2^n = 4294967296$

$n = 33 \quad 2^n = 8589934592$

$n = 34 \quad 2^n = 17179869184$

$n = 35 \quad 2^n = 34359738368$

$n = 36 \quad 2^n = 68719476736$

$n = 37 \quad 2^n = 137438953472$

$n = 38 \quad 2^n = 274877906944$

$n = 39 \quad 2^n = 549755813888$

$n = 40 \quad 2^n = 1099511627776$

$n = 41 \quad 2^n = 219902325552$

$n = 42 \quad 2^n = 439804651104$

$n = 43 \quad 2^n = 879609302208$

$n = 44 \quad 2^n = 1759218604416$

$n = 45 \quad 2^n = 3518437208832$

$n = 46 \quad 2^n = 7036874417664$

$n = 47 \quad 2^n = 14073748835328$

$n = 48 \quad 2^n = 28147497670656$

$n = 49 \quad 2^n = 56294995341312$

$n = 50 \quad 2^n = 112589990682624$

$n = 51 \quad 2^n = 225179981365248$

$n = 52 \quad 2^n = 450359962730496$

$n = 53 \quad 2^n = 900719925460992$

$n = 54 \quad 2^n = 1801439850921984$

$n = 55 \quad 2^n = 3602879701843968$

$n = 56 \quad 2^n = 7205759403687936$

$n = 57 \quad 2^n = 14411518807375872$

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$n = 59 \quad 2^n = 57646075229503488$

$n = 60 \quad 2^n = 115292150459006976$

$n = 61 \quad 2^n = 230584300918013952$

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$n = 63 \quad 2^n = 922337203672055808$

$n = 64 \quad 2^n = 1844674407344111616$

$n = 65 \quad 2^n = 3689348814688223232$

$n = 66 \quad 2^n = 7378697629376446464$

$n = 67 \quad 2^n = 14757395258752892928$

$n = 68 \quad 2^n = 29514790517505785856$

$n = 69 \quad 2^n = 59029581035011571712$

$n = 70 \quad 2^n = 118059162070023143424$

$n = 71 \quad 2^n = 236118324140046286848$

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$n = 73 \quad 2^n = 944473296560185147392$

$n = 74 \quad 2^n = 1888946593120370294784$

$n = 75 \quad 2^n = 3777893186240740589568$

$n = 76 \quad 2^n = 7555786372481481179136$

$n = 77 \quad 2^n = 15111572744962962358272$

$n = 78 \quad 2^n = 30223145489925924716544$

$n = 79 \quad 2^n = 60446290979851849432088$

$n = 80 \quad 2^n = 120892581959703698864176$

$n = 81 \quad 2^n = 241785163919407397728352$

$n = 82 \quad 2^n = 483570327838814795456704$

$n = 83 \quad 2^n = 967140655677629590913408$

$n = 84 \quad 2^n = 1934281311355259181826816$

$n = 85 \quad 2^n = 3868562622710518363653632$

$n = 86 \quad 2^n = 7737125245421036727307264$

$n = 87 \quad 2^n = 15474250490842073454614528$

$n = 88 \quad 2^n = 30948500981684146909229056$

$n = 89 \quad 2^n = 61897001963368293818458112$

$n = 90 \quad 2^n = 12379400392673658763691624$

$n = 91 \quad 2^n = 24758800785347317527383248$

$n = 92 \quad 2^n = 49517601570694635054766496$

$n = 93 \quad 2^n = 99035203141389270109532992$

$n = 94 \quad 2^n = 198070406282778540219065888$

$n = 95 \quad 2^n = 396140812565557080438131776$

$n = 96 \quad 2^n = 792281625131114160876263552$

$n = 97 \quad 2^n = 1584563252262228321752527088$

$n = 98 \quad 2^n = 3169126504524456643505054176$

$n = 99 \quad 2^n = 6338253009048913287010108352$

$n = 100 \quad 2^n = 1267650601809782657402021664$

$n = 101 \quad 2^n = 2535301203619565314804043328$

$n = 102 \quad 2^n = 5070602407239130629608086656$

$n = 103 \quad 2^n = 10141204814478261259216173312$

$n = 104 \quad 2^n = 20282409628956522518432346624$

$n = 105 \quad 2^n = 40564819257913045036864693248$

$n = 106 \quad 2^n = 81129638515826090073729386496$

$n = 107 \quad 2^n = 162259277031652180147458772992$

$n = 108 \quad 2^n = 324518554063304360294917545984$

$n = 109 \quad 2^n = 649037108126608720589835091968$

$n = 110 \quad 2^n = 1298074216253217441179670183936$

$n = 111 \quad 2^n = 2596148432506434882359340367872$

$n = 112 \quad 2^n = 5192296865012869764718680735744$

$n = 113 \quad 2^n = 10384593730025739529437361471488$

$n = 114 \quad 2^n = 20769187460051479058874722942976$

$n = 115 \quad 2^n = 41538374920102958117749445885952$

$n = 116 \quad 2^n = 83076749840205916235498891771808$

$n = 117 \quad 2^n = 166153499680411832470977783543616$

$n = 118 \quad 2^n = 332306999360823664941955567087232$

$n = 119 \quad 2^n = 664613998721647329883911134174464$

$n = 120 \quad 2^n = 132922799744329465976782226834896$

$n = 121 \quad 2^n = 265845599488658931953564453669792$

$n = 122 \quad 2^n = 531691198977317863907128907339584$

$n = 123 \quad 2^n = 1063382397954635727814257814679168$

$n = 124 \quad 2^n = 2126764795909271455628515629358336$

$n = 125 \quad 2^n = 4253529591818542911257031258716728$

$n = 126 \quad 2^n = 8507059183637085822514062517433456$

$n = 127 \quad 2^n = 17014118367274171645028125034866928$

$n = 128 \quad 2^n = 34028236734548343290056250069733856$

$n = 129 \quad 2^n = 68056473469096686580112500139467712$

$n = 130 \quad 2^n = 13611294693819337316022500268935424$

$n = 131 \quad 2^n = 27222589387638674632045000537870848$

$n = 132 \quad 2^n = 54445178775277349264090001075741696$

$n = 133 \quad 2^n = 108890357550554698528180002151483392$

$n = 134 \quad 2^n = 217780715101109397056360004302966784$

$n = 135 \quad 2^n = 435561430202218794112720008605933568$

$n = 136 \quad 2^n = 871122860404437588225440017211867136$

$n = 137 \quad 2^n = 1742245720808875176450880344223734272$

$n = 138 \quad 2^n = 3484491441617750352901760688447468544$

$n = 139 \quad 2^n = 6968982883235500705803520176894937088$

$n = 140 \quad 2^n = 139379657664710$

$$(n+k)^m \leq n^m + k^m$$

(b) $\sqrt{\log n} = O(\log \log n) \rightarrow F \quad \log n \leq k \log \log n$

(c) $0 < k < y$ then $(\log n)^k \leq \log \log n$
 $n^k = O(n^k) \rightarrow T \quad \frac{1}{2} \log \log n < \log \log n$

(d) $2^n \neq O(n^k)$ where k is constant $\rightarrow T$

$$2^{n+1} \geq 2 \cdot 2^n$$

* exponential is always faster than the polynomial.

Q) $T/F = P$

(a) $(n+k)^m = O(n^m)$ where k is constant $\rightarrow T$

(b) $2^{n+1} = O(2^n) \rightarrow T$

(c) $2^{2n} = O(2^n) \rightarrow F$

(b) $2^{n+1} \leq c \cdot 2^n$

(c) $2^{2n} \leq \frac{4}{3} \cdot 2^n$

$2 \cdot 2^n \leq 3 \cdot 2^n$

(a) $(n+k)^m \leq c \cdot n^m$

$$\begin{aligned} & n^m + mC_1 n^{m-1} k + mC_2 n^{m-2} k^2 + \dots + k^m \\ & \leq n^m + k^m \\ & \leq n^m + n^m \\ & = O(n^m) \end{aligned}$$

* if k is not constant, then $O(n^m)$ & $O(k^m)$ can both be the answer.

* constant is always smaller than the function.

Q) Consider the following two functions :-

$f(n) = n^3 \quad 0 \leq n < 10,000$

$n^2 / 10,000$

$g(n) = n^3 \quad 0 \leq n < 100$

$n^3 \quad n > 100$

Cosmos

* for n b/w 0 & 100

$n^3 \quad n$

$g(n) = O(f(n))$ as $f(n) = \Omega(g(n))$

$$f(n) = O(g(n))$$

* for n b/w 101 & 10,000

$n^3 \quad n^3$

$f(n) = O(g(n)) \quad n > 100$

$$(n+k)^m \leq n^m + k^m$$

- (b) $\sqrt{\log n} = O(\log \log n) \rightarrow F \quad \log n \leq \log \log n$
 (c) $0 < y < x$ then $(\log x)^{y^2} \leq (\log \log n)^{\frac{1}{2}} \quad \frac{1}{2} \log \log n < \log \log n$
 (d) $2^n \neq O(n^k)$ where k is constant. $\rightarrow T$

$$2^n > n^k$$

* exponential is always faster than the polynomial.

Q T/F. ?

- (a) $(n+k)^m = O(n^m)$ where k is constant. $\rightarrow T$
 (b) $2^{n+1} = O(2^n) \rightarrow T$
 (c) $2^{2^n} = O(2^n) \rightarrow F$

$$(b) 2^{n+1} \leq C \cdot 2^n$$

$$(c) 2^{2^n} \leq C \cdot 2^n$$

$$2 \cdot 2^n \leq 3 \cdot 2^n$$

$$(a) (n+k)^m \leq C \cdot n^m$$

$$\leq n^m + C \cdot n^{m-1} k + \dots + C \cdot n^{m-1} k^{m-1} + \dots + k^m$$

$$\leq n^m + k^m$$

$$\leq n^m + n^m$$

$$\leq O(n^m)$$

* If k is not constant then $O(n^m)$ & $O(k^m)$ can both be the answers.

* Constant is always smaller than the function.

Q Consider the following two functions.

$$f(n) = \begin{cases} 3 & 0 \leq n < 10,000 \\ n^2 & n \geq 10,000 \end{cases}$$

$$g(n) = \begin{cases} n^3 & 0 \leq n < 100 \\ n & n \geq 100 \end{cases}$$

Cosmos

• for n b/w 0 & 100

$$n^3$$

$$n$$

$$g(n) = O(f(n)) \text{ as } f(n) = \Omega(g(n))$$

• for $n \geq 10,000$

$$f(n) = O(g(n))$$

$$n^2$$

$$n^3$$

• for n b/w 101 & 10,000

$$n^3$$

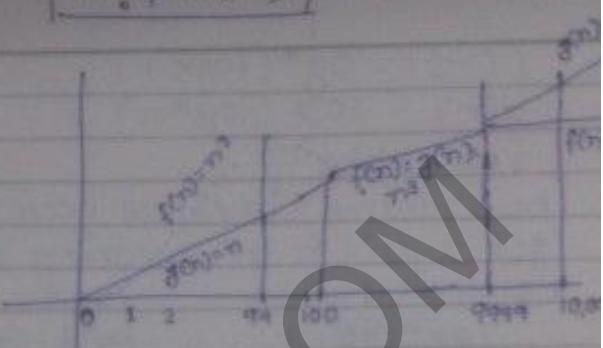
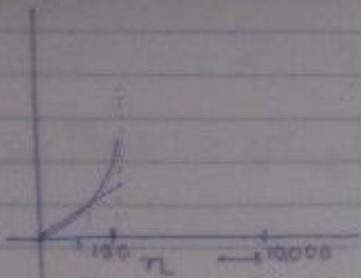
$$n^3$$

$$f(n) = \Theta(g(n)) \quad n \geq 100$$

Cosmos

Graph

$$\begin{aligned} n! &= o(n^n) \\ n! &\neq \omega(n^n) \end{aligned}$$



Q Consider the following fn. :-

$$f_1 = 2^n$$

$$f_2 = n^{3/2}$$

$$f_3 = n \log n$$

$$f_4 = n \log \log n$$

arrange above fn. in increasing order.

$$\text{Ans } n \log n < n^{3/2} < n \log \log n < 2^n$$

$$n \log n > n^{3/2}$$

because n^n is always greater than constant.

$$\log n > n^{1/2}$$

$$n > \log n$$

$$\log n > \log \log n$$

$$2^n$$

$$n \log 2$$

$$n \log n$$

$$\log n \times \log n$$

Q $f_1 = n!$

$$f_2 = n \log n$$

$$f_3 = (\log n)^{\log n}$$

$$(\log n)! < \log$$

$$f_1 = n!$$

$$f_2 = \log(n!) \leq \log(n^n)$$

$$f_3 = n^x$$

$$\log(n!)$$

as $n^x > x!$

$\uparrow f_1 < n^x$

$n^x > f_2 \wedge x! > f_3$

$\therefore n \log n = n^x$

$$\frac{(\log n)^{\log n}}{\log n \log \log n} < \frac{\log(n!)}{\log(n!)}$$

$$f_2 < f_1 < f_3$$

Cosmos

$$Q. f(n) = \log^*(\log n)$$

$$g(n) = \log(\log^* n)$$

what does it mean?

how many times we have to apply log so that we can get 1, this is the meaning of *.

$$\text{e.g. } \log^* 16 = 3$$

$$\log_2 3, \log_2 5, \dots$$

$$\log^* 2^{16} = 4$$

$$\log_2 3 = 1$$

$$\log_2 4 = 2$$

$$f(n) \approx \times O(\log \log n)$$

$$f(n) = \log^*(\log 65,536) = 4$$

$$g(n) = \log(\log^* 65,536) = \log_2 5 \approx 2$$

$$f(n) > g(n)$$

Properties Of Asymptotic Notation:-

① Reflexive

Reflexive property

$$(i) f(n) = O(f(n))$$

$$(ii) f(n) = \Omega(f(n))$$

$$(iii) f(n) = \Theta(f(n))$$

② Symmetric Property

$$(i) \text{ If } f(n) = O(g(n))$$

then $g(n) = \Omega(f(n))$

$$(ii) \text{ If } f(n) = \Omega(g(n))$$

then $g(n) = \Omega(f(n))$

$$(iii) \text{ If } f(n) = \Theta(g(n))$$

then $g(n) = \Theta(f(n))$

③ Transitive Property

$$(i) \text{ If } f(n) = O(g(n)) \text{ & }$$

$$g(n) = O(h(n))$$

then $f(n) = O(h(n))$

$$(ii) \text{ If } f(n) = \Omega(g(n)) \text{ & }$$

$$g(n) = \Omega(h(n))$$

then $f(n) = \Omega(h(n))$

$$(iii) \text{ If } f(n) = \Theta(g(n)) \text{ & }$$

$$g(n) = \Theta(h(n)) \text{ then}$$

$$f(n) = \Theta(h(n))$$

$$④ \text{ If } f(n) = O(g(n)) \text{ then}$$

$$2f(n) \neq O(2g(n))$$

because if $f(n) = 2n$

$$+ g(n) = n$$

$$2n = O(n)$$

but $2n \neq O(2^n)$

$$⑤ f(n) \neq O(f(\frac{n}{2}))$$

because

$$\text{take } f(n) = 2^{2n}$$

Cosmos

⑥ $f(n) \neq O(g(n))$

because take $f(n) = \frac{1}{n}$

$$\frac{1}{n} > O\left(\frac{1}{n}\right)$$

⑦ If $f(n) = O(g(n))$

$$d(n) = O(h(n))$$

$$O(g(n)+h(n))$$

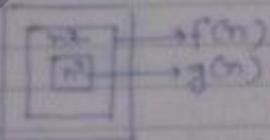
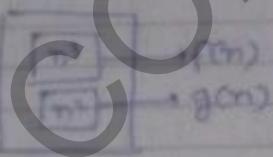
then

(i) $f(n) + d(n) = \max\{g(n), h(n)\}$

(ii) $f(n), d(n) = O(g(n), h(n))$

both are executed individually

nested loops



⑧ If $f(n) = O(g(n))$

then

$$h(n), f(n) = O(h(n), g(n))$$

e.g. * n^2 should be the function.

$$3 < 5$$

$$6 \times 3 < 6 \times 5$$

Q Consider following 4 fn :-

$$f(n) = O(g(n)) \quad g(n) = O(h(n)) \quad f(n)$$

$$\{ \quad g(n) = O(f(n)) \quad ; \quad h(n) = O(g(n))$$

True?

(a) $f(n) + g(n) = O(g(n)) \rightarrow T$ (a) By ~~O(f(n))~~ $f(n) = O(g(n))$
 $\therefore f(n) < g(n)$

(b) $f(n) = O(h(n)) \rightarrow T$ (by transitivity) $\therefore f(n) + g(n) = \max\{f(n), g(n)\}$
 $\text{but } g(n) \neq O(f(n))$

(c) $h(n) = O(f(n)) \rightarrow F$

(d) $h(n), f(n) = O(h(n), f(n)) \rightarrow T$

(e) $f(n) = O(h(n))$

$$h(n), f(n) = O(h(n), f(n))$$

(f) $h(n) = O(g(n))$

$$\text{but } g(n) \neq O(f(n))$$

$$\therefore h(n) \neq O(f(n))$$

Cosmos

$$f(n) = n^3$$

Q. Suppose $T_1(n) = O(g(n))$
 & $T_2(n) = O(f(n))$
 then

$$T_1(n) \leq C_1 \cdot f(n)$$

$$T_2(n) \leq C_2 \cdot f(n)$$

(a) $T_1(n) + T_2(n) = O(f(n)) \rightarrow T$

(b) $T_1(n) = O(T_2(n)) \rightarrow F$

(c) $T_1(n) = \Theta(T_2(n)) \rightarrow F$

(d) $T_1(n) = \Omega(T_2(n)) \rightarrow F$

Q. (i) $f(n) = 1 + 10 + \frac{1}{n} = 1 + 10 + 0 = 11 \Rightarrow O(1)$

(ii) $6n^2 2^n + n + \log n \Rightarrow O(n^2 2^n)$

(iii) $f(n) = n$

$$g(n) = n^{\sin n}$$

$$f(n) = n$$

$$g(n) = n \cdot n^{\sin n}$$

$$\frac{n}{1} \quad \frac{n \cdot n^{\sin n}}{n^{\sin n}}$$

→ Nothing can be said, as we don't know the term b/w $T_1(n)$ and $T_2(n)$.
 $T_1(n)$ can be n^2 and $T_2(n)$ can be $n^{1/2}$. Information of $f(n)$ is not given.

n	f(n)	g(n)
0	0	0
90	90	90
180	180	180
270	270	270
360	360	360

This repeats for every 360° cycle.

(iv) $f(n) = n^{\sin n}$
 $g(n) = n^{\cos n}$

→ These two fn. are incomparable.

n	f(n)	g(n)
0	0	0
30	$30^{1/2}$	$30^{\sqrt{3}/2}$
45	$45^{1/2}$	$45^{1/\sqrt{2}}$
60	$60^{1/2}$	$60^{\sqrt{3}/2}$
90	90	1

Date

09.06.12

Cosmos

* Problem is small
when no. of element
is only 1.

Binary Search

T(n):

$a[i] = 10 \quad 20 \quad 30 \quad 40 \quad 50 \quad 60 \quad 70$
 $i = 1 \quad 2 \quad 3 \quad 4 \quad 5 \quad 6 \quad 7$

~~BS(a, i, j, x)~~ → no. to search
est. by
method

if ($i == j$)
{ if ($a[i] == x$) → O(1)
return i ;
else
return (-1);

else
if ($i < j$)
{ mid = $(i+j)/2$; → O(1)
if ($a[mid] == x$) return (mid); → O(1)
else
if ($a[mid] > x$) → O(1)
BS($a, mid+1, j, x$);
else
BS($a, i, mid-1, x$);

T(n) = ~~O(1)~~ O(1), if $n=1$
{ O(1)+O(1)+O(1)+T($\frac{n}{2}$) otherwise
= T($\frac{n}{2}$) + c

T(n) = T($\frac{n}{2}$) + c
= T($\frac{n}{4}$) + c + c
= T($\frac{n}{8}$) + c + c + c
= T($\frac{n}{2^k}$) + kO(1)
= O(1) + O(log n)

$$\begin{aligned}n &= 2^k \\ \log_2 n &= k\end{aligned}$$

Cosmos

Q1. If p: A sorted array of n elements

qf: Find 2 elements $a+b$ such that $a+b>1000$.

func(a, b)

{ }

a[0] = 1000 2000 3000 4000 5000 6000 7000 8000 9000
i = 1 2 3 4 5 6 7 8 9

Answe...

a[0], a[1], a[2], a[3]

This will take O(n) to search the element after which we want to add. This will take O(n) to add five-element after the given elements.

Link List

□ → □ → □ → □ → □

This will take O(n) to search the address of the node after which we want to add the element. It will take O(1) to add the element.

→ referential operation
→ disreferential operation

Solution:- Take the first two elements & add them, if they sum is greater than 1000 then it is the answer, if they don't give then no other combination will give as it is the largest combination.

algo :- 1. read 2-element (a,b) \rightarrow O(1) [as it an array]
2. (a+b>1000) return (a,b) \rightarrow O(1) [one comparison to check greater than 1000]
3. else
4. return (-1);

only one comparison complexity = $O(1) + O(1) = O(1)$

Cosmos

Q2. similar to Q1.
but only $a+b=1000$.

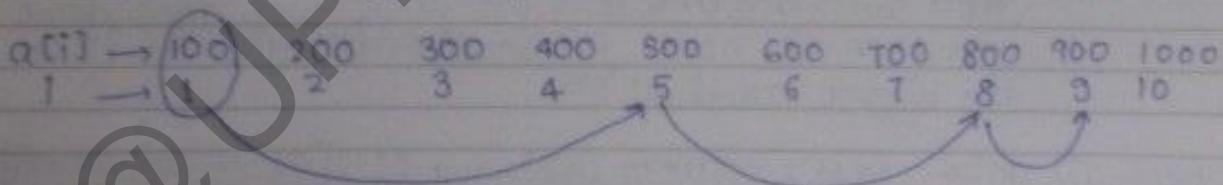
```
for(i=1; i<n; i++)  
{ for(j=i+1; j<n; j++)  
    { if(a[i]+a[j]==1000)  
        return (a[i], a[j]);  
    else  
        return (-1);  
}
```

Time Complexity:

$O(n^2)$

- Algo:-
- ① For the element a apply b to find another element b such that $a+b=1000 \rightarrow O(n^2)$
 - ② Continue for all elements until $a+b=1000 \rightarrow O(n^2) \rightarrow O(n^2)$

Improvement using Binary Search:-

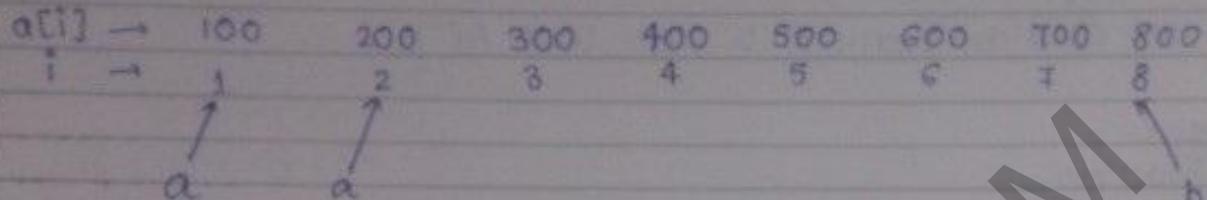


- ① take a
 - ② search b for ea every a which will take $O(\log n)$
there are n a 's.
- Complexity = $\Theta(n \times \log n) \rightarrow O(n \log n)$

Cosmos

3rd Improvement:-

$$a+b=1300$$



$$a[1]+a[8]=300 < 1300$$

increase 1 to 2

$$a[2]+a[8]=1000 < 1300$$

increase 2 to 3

$$a[3]+a[8]=1100 < 1300$$

increase 3 to 4

$$a[4]+a[8]=1200 < 1300$$

increase 4 to 5

$$a[5]+a[8]=1300 \rightarrow a=50, b=800$$

∴ it will take only one scan
complexity (time) O(n)

{ → Greedy
Technique.

Algo :-

① Take 2 variables A & B.

A → 1st element.

B → last element.

② If (A+B == C)

return (A, B);

else

(A+A, B)

A=A+1;

else

A=A-1;

③ continue 2nd step until A+B==C.

But if there are no elements with A+B==C, then stop
when i=j, (i.e. when the position of A & B are equal).

Cosmos

Q. i/p:- A sorted array of n-distinct elements both tve or -ve.
o/p:- find an element b such that $A[i] = b$.

Algo:-

My Practice:

① Go to the middle element & check whether it is tve or -ve.

② If

```
func(a,i,j){  
    for(i<1 / i <n; i++)  
        if (mid =  $\frac{i+j}{2}$ ) ; if (a[mid] == mid) return (mid);  
        if (a[mid] > 0)  
            i = mid+1;  
        else  
            j = mid-1;  
    func(a,i,j);  
}
```

Sir's Soln.:-

Using Linear search.

Check

```
for(i=1; i < n; i++)  
    if (a[i] == i) return (i);  
→ O(n)
```

g

Using Binary search

Cosmos

$$\text{mid} = \frac{i+1}{2}$$

```
if (a[mid] == mid)
    return (mid),
if (a[mid] < i)
```

$a[i] \rightarrow -100 \ -50 \ -35 \ 4 \ 10 \ 12 \ 13 \ 4 \ 17 \ 110 \ 125 \ 135 \ 140$
1 → 1 2 3 4 5 6 7 8 9 10 11 12 13

example:-

$a[i] \rightarrow$ 14
 $9 \rightarrow$ 8

algo:-

```
if (position > value)
    go right
else
    go left
```

O(log n)

as we can see

$$8 < 14$$

∴ the 7th element can be 7,
∴ go left.

We can't go right because
8th element will be > 14

[\because since ~~no~~ distinct elements,
in worst case we will have
8th element as 15]

10th " " 16

11th " " 17

∴ position can never be equal
to value.]

- i/b:- A sorted array of n -elements contain only 0's or 1's which is greater, i.e. whether no. of zeroes are greater or no. of 1's are greater.

Cosmos

Algo:-

```
    n0=0; n1=0;  
    for (i=1; i<n; i++)  
        if (a[i]==0)  
            n0++;  
        else  
            n1++;  
    if (n0>n1)  
        return 0;  
    else  
        return 1;
```

→ O(n)

a[i] → 0 0 0 0 0 0 1 1 1
i → 1 2 3 4 5 6 7 8 9 10

∴

- ① go to mid element,
- ② check mid element / If it is 0, then check
 - if n is even.
 - if ($\frac{n}{2}$) is 0 & ($\frac{n+1}{2}$) is 0,
 - then no. of 0's greater
 - else if ($\frac{n}{2}$) is 0 & ($\frac{n+1}{2}$) is 1
 - then no. of 0's = no. of 1's
 - else if ($\frac{n}{2}$) is 1 & ($\frac{n+1}{2}$) is 1 then no. of 1's greater.
 - if n is odd.

{ → O(1)}

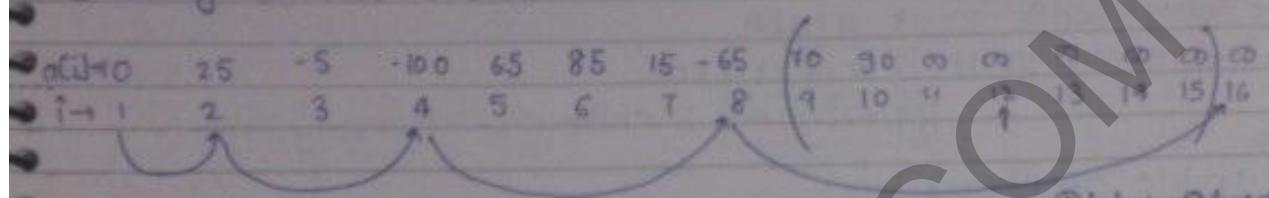
If $n+1$ is 0, then no. of 0's are greater. } → O(1)
else no. of 1's are greater.

Q. i/p :- An array of n elements unknown size, which contain both +ve & -ve no. until some place & afterwards all are 0.
q/p :- Find the 1st infinite place in the array.

Cosmos

$a[i] \rightarrow 0 -35 25 65 -5 100 \infty \infty \infty \infty$
 $i \rightarrow 1 2 3 4 5 6 7 8 9 10$

① Using Linear Search $\rightarrow O(n)$.



Algo:-

① Start with 1st element, if $a[i] == \infty$ then stop
else multiply the position by 2

continue till $a[i] == \infty$. position i

② After reaching the ∞ , then check whether the position before that ∞ is ∞ also or not, then apply binary search
b/w $\frac{i+1}{2}$ & $i-1$; & check whether middle element is ∞

if it is go left otherwise go right

③ If ∞ is found
then apply b/w $\frac{i+1}{2}$ & $i-1$
if ∞ is not found
then apply b/w $\frac{i+1}{2}$ & $i-1$

* If we find ∞ , which is the answer

We Complexity: $O(\log n)$

Graph

- ① NO root element.
- ② If there is a path b/w any two vertices then it is connected graph.

If there is no path b/w any two vertices then it is non-connected graph.

May or may not be connected

- ③ May or may not be a directed graph.

Tree

- ① Root element is present.
- ② Tree is always connected.

③ It is always directed.
(By default the directions are from top to bottom.)

Cosmos

May be cyclic or
acyclic.

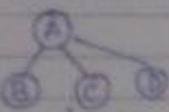
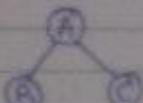
④ It is always acyclic.

Every tree is a graph,
but every graph is not a tree.

Maximum 2-children \rightarrow Binary Tree

Example of Binary Trees:

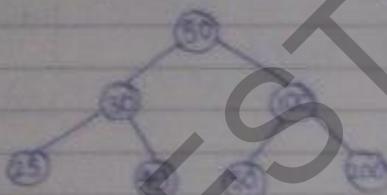
(i)



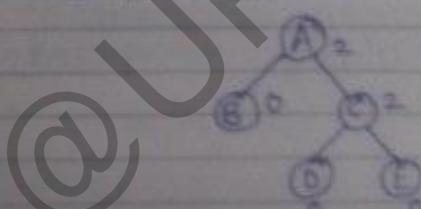
not Binary Tree

Binary Search Tree: In a given binary tree, at every node, root is \geq all nodes present in left subtree & \leq all nodes present in right subtree.

e.g.

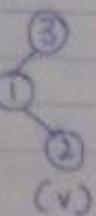
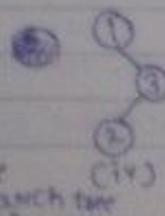
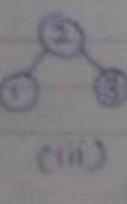
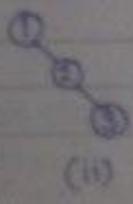


Strict Binary Tree:



Every node can have 0 children
or 2 children [not a single child]

how many Binary Search Tree possible with 3 nodes.
1, 2, 3



(iii) this is the
binary search tree
made by binary search algo.

Cosmos

* No. of levels created by Binary Search algorithm = $\log_2 n$ [n = no. of elements]

* height of tree = no. of levels - 1

* For Binary tree (n=5)

→ Max. levels = 5

→ Max. height = 5-1 = 4

* For Binary Search Tree : (n=5)

→ no. of levels (max.) = 5

→ Max. height = 4

* For Balanced Binary Search Tree (n=5)

→ no. of levels = $\log_2 5 \approx 3$

→ Max. height = 3-1 = 2.

* No. of binary search trees possible with n-elements :-

$${}^n C_n$$

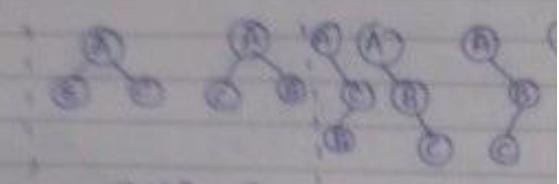
$${}^n C_n$$

→ if n=3

$${}^n C_3 = \frac{6}{3! 3!} = \frac{6}{6 \times 6} = 1$$

$$\frac{{}^n C_3}{4} = \frac{5 \times 4}{4} = 5$$

* No. of Binary trees with 3 nodes :-



$$12 + 12 + 6 = 30$$

* No. of binary trees with n-nodes :-

$$n! \times \binom{{}^n C_n}{n+1}$$

Cosmos

★ No. of unlabeled Binary Trees = no. of binary search trees = $\frac{2^n C_n}{n+1}$.

★ No. of labeled Binary Trees = no. of binary trees = $n! \times \frac{2^n C_n}{n+1}$.

Q. A set of n -distinct elements & an unlabeled binary tree with n -nodes.

In how many ways we can populate the tree with the given set of elements so that it becomes BST.

- (A) 1
- (B) 0
- (C) $n!$
- (D) $\frac{2^n}{n+1} C_n$

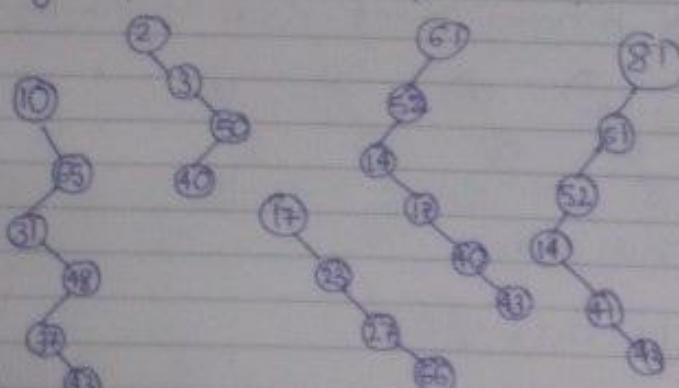
→ My answer: because only 1 tree is given. With 1 tree, we can arrange the nodes in only 1 way so that it becomes BST.

Q. A binary search tree is used to locate no. 45, then which of the following sequence is not possible?

- (A) 61, 52, 14, 17, 10, 43
- (B) 2, 3, 50, 40, 60, 43
- (C) 10, 65, 3, 48, 37, 43
- (D) 81, 61, 51, 14, 11, 43
- (E) 17, 23, 21, 16, 18, 43

To check :-

10 (B)



Cosmos

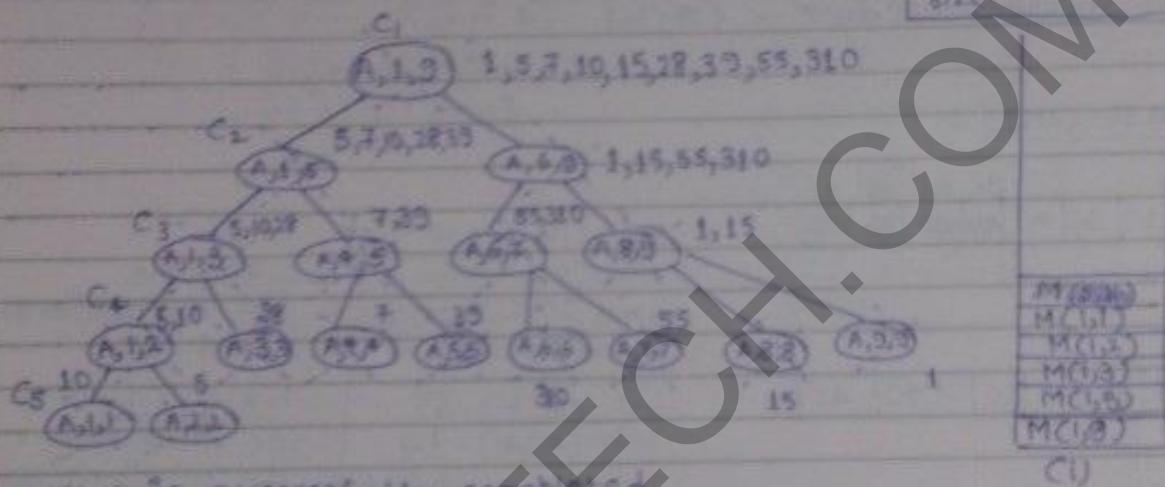
Merge Sort

Note: Merging 8 sorted subarrays

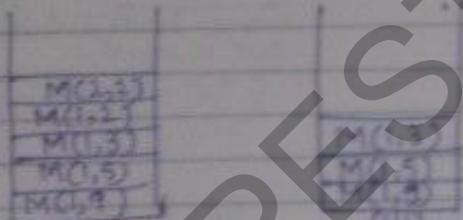
Ex:-

A [10 8 29 7 33 310 55 15 1]

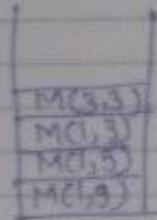
* Max. Stack size:
no. of levels in the tree.
So the levels & height are calculated to measure the stack size.



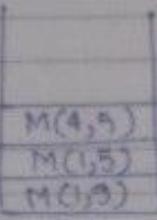
* M(1,1) is successfully completed.



∴ M(2,5) is successfully completed.



∴ M(3,3) is completed.



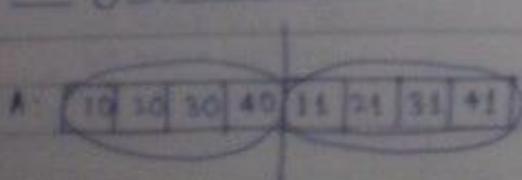
∴ M(4,4) is completed
∴ M(2,4) is completed
because its both children are completed.

* Space Complexity: i/p size + stack size.

→ i/p size + $\sum_{i=1}^{\log n} m_i$ i.e. $(n - \text{each level})$

* Time Complexity = sum of all function calls.
Time complexity = $T(n) = f(n) * g(n)$,
 $f(n)$ = no. of function calls.

Merge procedure



- sorting with using the same array:- in-place sorting.
- Sorting using the diff. array:- outplace sorting.

Cosmos

i/p to merge-procedure $\rightarrow M(a, i \rightarrow \text{mid}, \text{mid}+1 \rightarrow j)$

Sorted array from i to mid
Sorted array from $\text{mid}+1$ to j .

o/p of merge-procedure $\rightarrow \text{C}(a, i \rightarrow j)$

Sorted array from i to j .

Worst Case :-

A:	10	20	30	40	15	25	35	45
	1	2	3	4	5	6	7	8

B:	30	25	20	24	30	31	40	41
	1	2	3	4	5	6	7	8

$$\begin{aligned}\min(10, 11) &= 10 \\ \min(20, 15) &= 15 \\ \min(30, 25) &= 25 \\ \min(40, 30) &= 30 \\ \min(40, 31) &= 31 \\ \min(40, 40) &= 40 \\ \min(40, 41) &= 40\end{aligned}$$

→ Total no. of comparisons
 $4+4-1=7$.

Worst case :-

Time complexity :-

$$m+n-1 \quad \left\{ \begin{array}{l} m+n \\ m+n \end{array} \right.$$

$O(m+n)$

When both the array size is equal -

$$\frac{m+n}{2}-1 = O(n-1)=O(n)$$

Best Case :-

A:	10	20	30	40	15	25	35	45
P:	1	2	3	4	5	6	7	8

B:	1	3	5	7	10	20	30	40
	1	2	3	4	5	6	7	8

$$\begin{aligned}\min(10, 1) &= 1 \\ \min(10, 5) &= 5 \\ \min(10, 7) &= 7 \\ \min(10, 10) &= 10\end{aligned}$$

→ Best Case

Time complexity :-

no. of comparisons :-

if 1st part of array has size m

2nd part of array P has size n .

Best Case complexity

$$O(\min(m, n))$$

If both are of $\frac{n}{2}$ size

$$O(\frac{n}{2})$$

$\frac{n}{2} \geq n$

It can't go less than this.

(as we have to atleast read all the n -elements.)

If we don't use the second array B , then we have to re-sort the two array parts of A which increases the time complexity.

Cosmos

```
merge([l, mid, mid+1, r])
{
    while(l < mid) && k < j)
        if (arr[l] < arr[k])
            swap = arr[l];
            l++;
            k++;
        else
            break;
    else
        if (arr[mid] < arr[k])
            swap = arr[mid];
            mid++;
            k++;
        else
            break;
    for (j; j < mid; j++)
        if (arr[j] < arr[k])
            swap = arr[j];
            arr[j] = arr[k];
            k++;
    for (j; j <= mid; j++)
        arr[j] = swap;
}
```

Worst Case:

$$T(n) = \Theta(n^2) = O(n^2)$$

Best 60

$$T(n) \geq n - \Omega(n)$$

Average Case :-

10

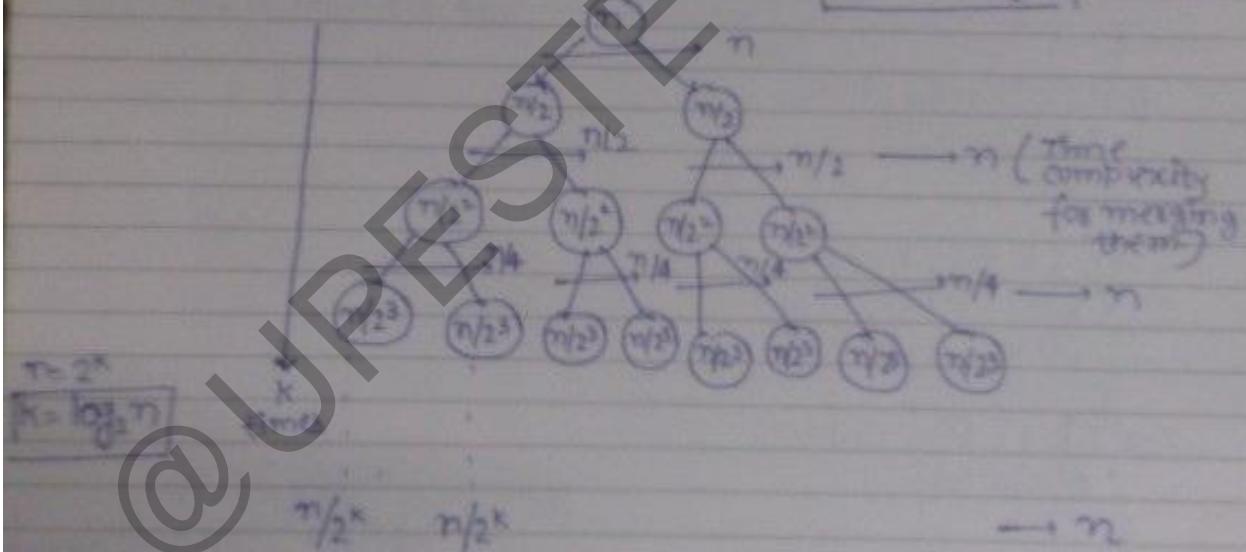
$$T(n) = \begin{cases} O(1), & \text{if } n=1 \\ T\left(\frac{n}{2}\right) + T\left(\frac{n}{2}\right) + O(n) & \text{otherwise} \\ = 2T\left(\frac{n}{2}\right) + O(n) \\ \Rightarrow 2T\left(\frac{n}{2}\right) + n \end{cases}$$

```
    return (a);
```

Cosmos

$$\begin{aligned}T(n) &= 2T\left(\frac{n}{2}\right) + n \\&= 2\left[2T\left(\frac{n}{4}\right) + \frac{n}{2}\right] + n \\&= 2\left[2\left[2T\left(\frac{n}{8}\right) + \frac{n}{4}\right] + \frac{n}{2}\right] + n \\&= 2^2 T\left(\frac{n}{8}\right) + \frac{n}{2} + n \\&= 2^3 T\left(\frac{n}{16}\right) + 2n + n \\&\quad \vdots \\&= 2^k T\left(\frac{n}{2^k}\right) + kn\end{aligned}$$

$$T(n) = O(n \log_2 n)$$



no. of levels = $k = \log_2 n$

4 at each level the time complexity = n .

Time Complexity = $n \log_2 n$

Cosmos

Merge-Sort is not Inplace sorting technique because in the merging procedure we are taking an extra array of size n .

Space Complexity = $2n + \lceil c \log n \rceil + 2n$ $\Rightarrow O(n \log n)$

array size of n $\xrightarrow{\text{function}}$ no. of variable size in each function

A [n-element array] $\xrightarrow{\text{array}} \xrightarrow{\text{size of each slice}} \xrightarrow{\text{element of 2n}} \xrightarrow{\text{total size}} 2n$

B

no. of function calls from the user of they pages

Note:- If the array size is very small, merge sort is not advisable (insertion sort is advisable). So for larger size arrays merge sort is advisable.

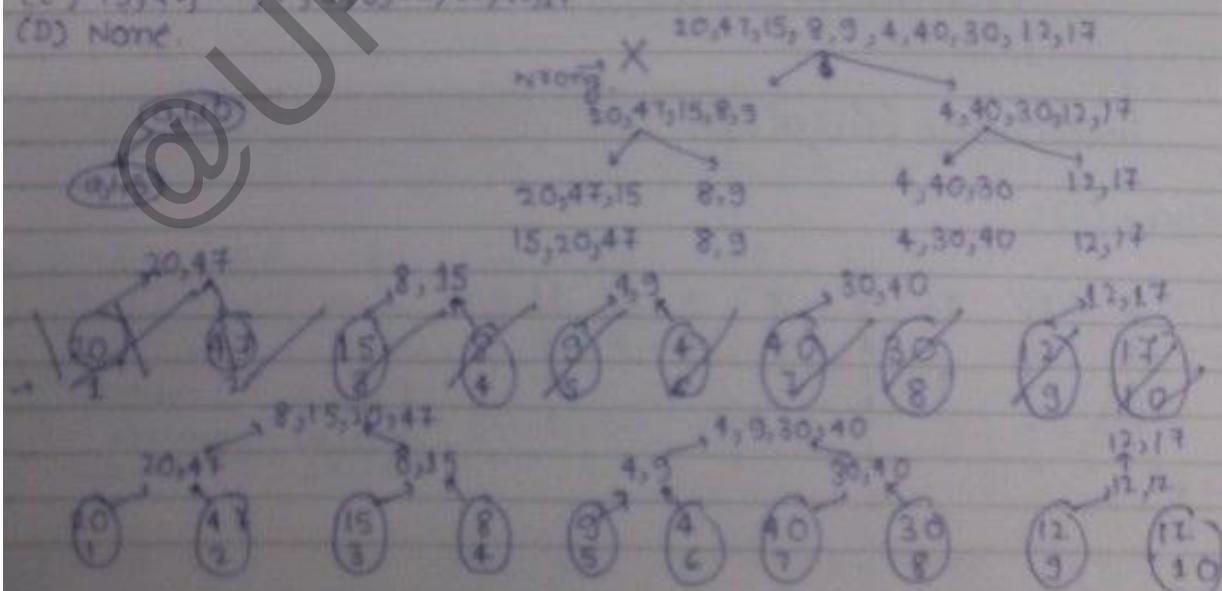
straight

Q. If one uses 2-way merge sort algo to sort following elements.

20, 47, 15, 8, 9, 4, 40, 30, 12, 17,

then the orders of these elements after 2nd pass of the algo. is

- (A) 8, 9, 15, 20, 47, 4, 12, 30, 40
- (B) 8, 15, 20, 47, 4, 30, 40, 12, 17
- (C) 15, 9, 47, 4, 8, 9, 12, 30, 40, 17
- (D) None



* Quick Sort is used to find out the n -th smallest element in the array.

* In straight 2-way merge-Sort

• We combine & sort 1st & 2nd element then 3rd & 4th, then 5th & 6th, & so on. [In 1st pass.]

• In 2nd pass we merge 1st 2nd & 3rd 4th element & sort them, then 5th 6th 7th 8th, & so on.

→ In above example, no. of levels required to sort is $\log n$.

∴ no. of levels = $\log_2 n$

& each level take n time

∴ complexity is $n \log_2 n$.

Quicksort :- [Tony Hoare]

① It uses Divide & Conquer Algorithm.

② In-place Sorting algo.

③ Not stable.

Randomized Quicksort
(when pivot element
is chosen randomly).

Normal Quicksort
(when pivot element
is chosen from same
position.)

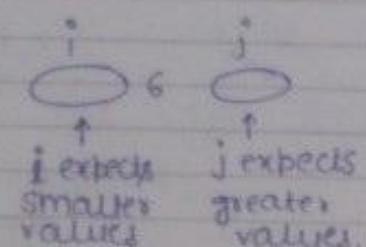
Cosmos

Partition(a, p, q)

```
x = a[p]; i = p;
for(j=p+1; j <= q; j++) {
    if(a[j] < x) {
        i = i + 1;
        interchange(a[i], a[j]);
    }
}
interchange(a[i], a[p]);
```

return i;

$a[] \rightarrow$	6	10	13	5	8	3	2	11	
\rightarrow	1	2	3	4	5	6	7	8	
$i = 6$	↑	↓	↑	↑	↑	↑	↑		
$j = p$	↓	↓	↓	↓	↓	↓	↓		



Cosmos

$a[i] \rightarrow 6 \ 5 \ 10 \ 13 \ 8 \ 8 \ 9 \ 3 \ 11$
 $i \rightarrow 1 \ 2 \ 3 \ 4 \ 5 \ 6 \ 7 \ 8$
↓ ↓ ↓ ↓ ↓

$a[i] \rightarrow 6 \ 5 \ 13 \ 10 \ 8 \ 8 \ 9 \ 11$
 $i \rightarrow 1 \ 2 \ 3 \ 4 \ 5 \ 6 \ 7 \ 8$
↓ ↓ ↓ ↓ ↓

$a[i] \rightarrow 6 \ 5 \ 13 \ 10 \ 8 \ 13 \ 8 \ 11$
 $i \rightarrow 1 \ 2 \ 3 \ 4 \ 5 \ 6 \ 7 \ 8$
↓ ↓ ↓ ↓ ↓

$a[i] \rightarrow 8 \ 5 \ 13 \ 10 \ 8 \ 13 \ 10 \ 11$
 $i \rightarrow 1 \ 2 \ 3 \ 4 \ 5 \ 6 \ 7 \ 8$
↑
P ↑

exchange ($a[i], a[p]$)

Smaller than 6 greater than 6

(2 5 3) 6 (8 13 10 11)

Pivot
element

* Apply partition algo in the following elements.

$a[i] \rightarrow 65 \ 70 \ 75 \ 80 \ 85 \ 60 \ 55 \ 50 \ 45$
 $i \rightarrow 1 \ 2 \ 3 \ 4 \ 5 \ 6 \ 7 \ 8 \ 9$
↑ ↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓

$a[i] \rightarrow 65 \ 60 \ 75 \ 80 \ 85 \ 70 \ 55 \ 50 \ 45$
 $i \rightarrow 1 \ 2 \ 3 \ 4 \ 5 \ 6 \ 7 \ 8 \ 9$
↑ ↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓

$a[i] \rightarrow 65 \ 60 \ 55 \ 80 \ 85 \ 70 \ 75 \ 50 \ 45$
 $i \rightarrow 1 \ 2 \ 3 \ 4 \ 5 \ 6 \ 7 \ 8 \ 9$
↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓ ↓

Cosmos

$a[i] \rightarrow 65 \ 60 \ 55 \ 50 \ 85 \ 70 \ 75 \ 80 \ 45$
 $i \rightarrow 1 \ 2 \ 3 \ 4 \ 5 \ 6 \ 7 \ 8 \ 9$
↑
↑
↓

$a[i] \rightarrow 65 \ 60 \ 55 \ 50 \ 45 \ 70 \ 75 \ 80 \ 85$
 $i \rightarrow \uparrow \ \uparrow$

$a[i] \rightarrow (45 \ 60 \ 55 \ 50) \ 65 \ (70 \ 75 \ 80 \ 85)$
 $i \rightarrow 1 \ 2 \ 3 \ 4 \ 5 \ 6 \ 7 \ 8 \ 9$

* As there is no combination, it is not divide & conquer,
it is partial divide & conquer.

$a[i] \rightarrow 25 \ 57 \ 48 \ 38 \ 11 \ 90 \ 89 \ 29$
 $i \rightarrow 1 \ 2 \ 3 \ 4 \ 5 \ 6 \ 7 \ 8$
↑
↑
↑
↑
↓
↓
↓
↓

$a[i] \rightarrow 25 \ 41 \ 38 \ 38 \ 57 \ 90 \ 89 \ 29$
 $i \rightarrow 1 \ 2 \ 3 \ 4 \ 5 \ 6 \ 7 \ 8$
↑
↑
↑
↑
↑
↑
↑
↑

Quicksort(a, p, q) ($40 \ 70 \ 10 \ 20 \ 60 \ 50 \ 30$)

If ($p < q$)
return ($a[p]$);

else

{
m = partition(a, p, q); $\rightarrow O(n) \rightarrow n$

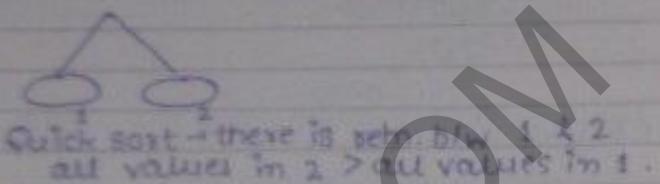
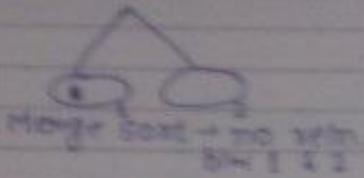
Quicksort($a, p, m-1$); $\rightarrow T(\frac{n}{2})$

Quicksort($a, m+1, q$); $\rightarrow T(\frac{n}{2})$

return (a);

Cosmos

- * If position in Merge sort \rightarrow mid = 1, 1 $\rightarrow O(1)$
- * If partition in Quick sort \rightarrow m = partition(a, p, q) $\rightarrow O(n)$



- * Let $T(n)$ be the amount of time req. to sort n elements using Quicksort, then $T(n)$

$$T(n) = \begin{cases} O(1), & n=1 \\ 2T(\frac{n}{2}) + O(n), & \text{if } n>1 \quad T(\frac{n}{2}) + T(\frac{n}{2}-1) \end{cases}$$

$$T(n) = \begin{cases} O(1), & n=1 \\ 2T(\frac{n}{2}) + n, & n>1 \end{cases} \rightarrow O(n \log_2 n)$$

Best Case: $O(n \log_2 n)$
Worst Case: $O(n^2)$

partition cuts

partition cuts

partition cuts

partition cuts

(this is merge time in merge sort.)

Worst Case: $O(n^2)$

In worst case the partition will create 0 elements on one side + $n-1$ elements on other side.

$$T(n) = \begin{cases} O(1), & n=1 \\ n + T(0) + T(n-1) & \text{if } n>1 \\ \vdots n + T(n-1) \\ \vdots T(n-1) + n \end{cases} \rightarrow O(n^2)$$

$n + n-1 + \dots + 1$

~~1 + 2 + ... + n~~

$\leq n + n - 1 + \dots + 1$

$\leq n \cdot n$

$\leq n^2$

$O(n^2)$

★ When array is not at all sorted, then Quicksort is the best sort.

$$\begin{aligned}T(n) &= T\left(\frac{n}{2}\right) + T\left(\frac{n}{2}-1\right) + 2n \\&\approx 2T\left(\frac{n}{2}\right) + n \\&= n \log_2 n\end{aligned}$$

Average Case:-

$$T(n) = 2T\left(\frac{n}{2}\right) + n \rightarrow \text{Lucky Case}$$

$$T(n) = T(n-1) + n \rightarrow \text{Unlucky Case}$$

$$\begin{aligned}T(n) &= 2T\left(\frac{n}{2}\right) + n \\&= 2\left[T\left(\frac{n-1}{2}\right) + \frac{n}{2}\right] + n \quad [\text{Lucky followed by Unlucky}] \\&= 2T\left(\frac{n-1}{2}\right) + 2n \\&\approx 2T\left(\frac{n}{2}\right) + n \rightarrow O(n \log_2 n) \\&\text{which is similar to Best Case}\end{aligned}$$

$$\begin{aligned}T(n) &= T(n-1) + n \\&= 2T\left(\frac{n-1}{2}\right) + n-1 + n \\&= 2T\left(\frac{n-1}{2}\right) + 2n-1 \quad \rightarrow \text{constants can't change the complexity.} \\&\approx 2T\left(\frac{n}{2}\right) + n\end{aligned}$$

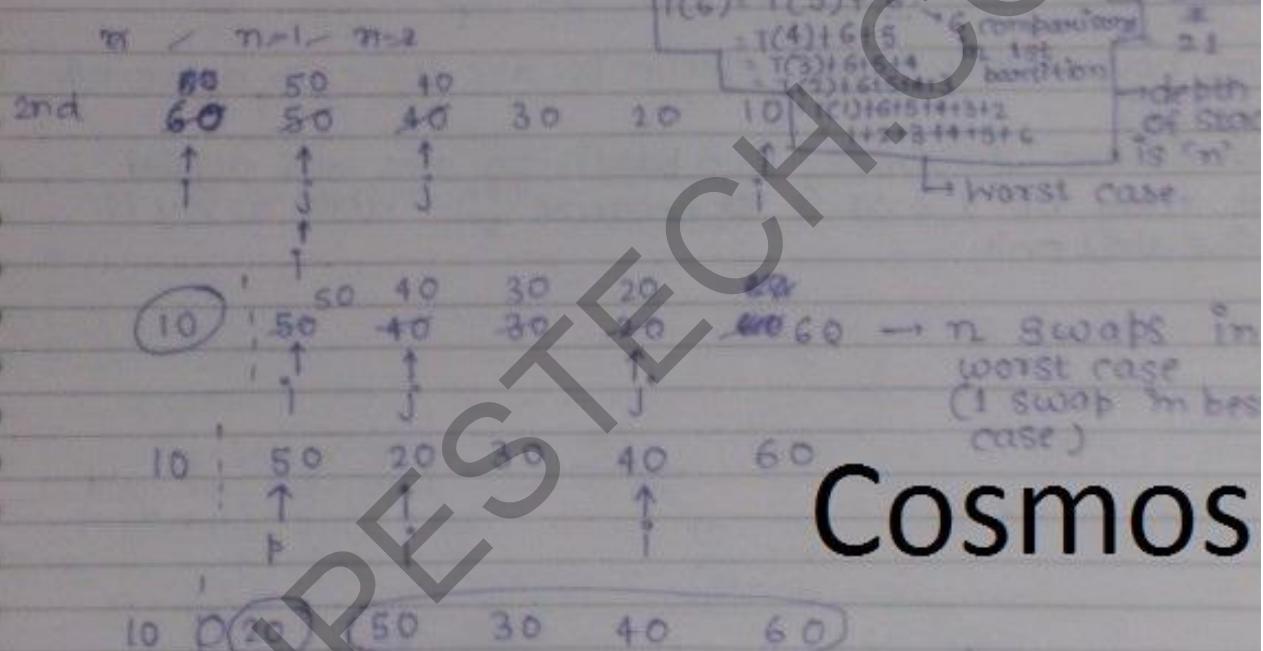
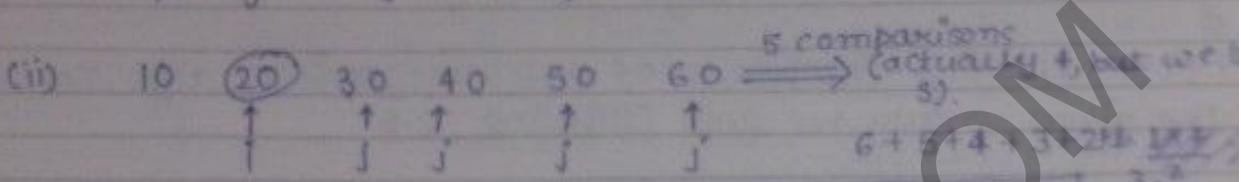
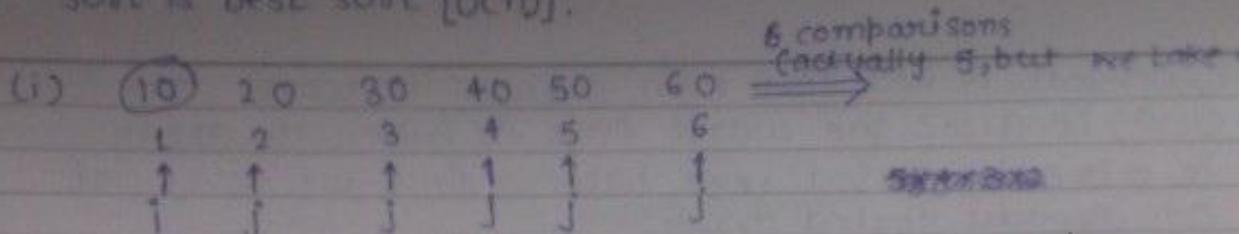
Quicksort is run on 2 ips shown below to sort in ascending order

- (i) 1, 2, 3, 4, ..., n
- (ii) n, n-1, n-2, ..., 1

Let C_1 & C_2 be the no. of comparisons made for ips (i) & (ii) resp., then

- (A) $C_1 < C_2$ (B) $C_1 > C_2$ (C) $C_1 = C_2$ (D) Not comparable

* If array is almost/already sorted then insertion sort is best sort [$O(n)$].



* 1st time partition $\rightarrow 6$ comparisons
 2nd " $\rightarrow 5$ "
 3rd " $\rightarrow 4$ "

* In descending order, the last two will remain $(n-1) \times 0$ even which gives $O(n^2)$ time complexity.

$$\therefore T(6) = T(5) + 6 = T(4) + 6 + 5 = O(n^2)$$

* Quicksort gives worst case when array is sorted (whether in descending or ascending).



Cosmos

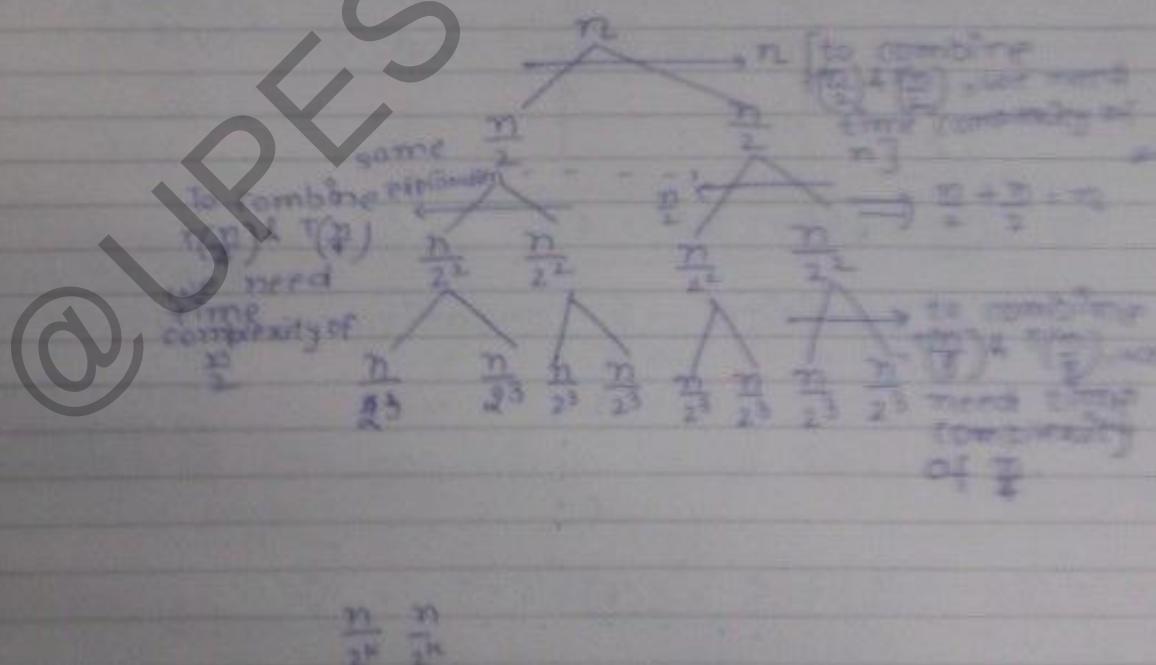
- ★ Quicksort is best sort even though its worst case is $O(n^2)$ because the worst case i.e. (when the array is already sorted) never happens since we never sort an already sorted array.
- ★ After applying few passes of quicksort, the given array we got following C/P.

1 10 5 8 25 ↑ 44 55 30 70

then how many pivot elements are there in above off.

Ans. 5

maximum 3 times the partition algo was applied it may be 1, 2 or 0 because [0 → when array is like that only.]



Date

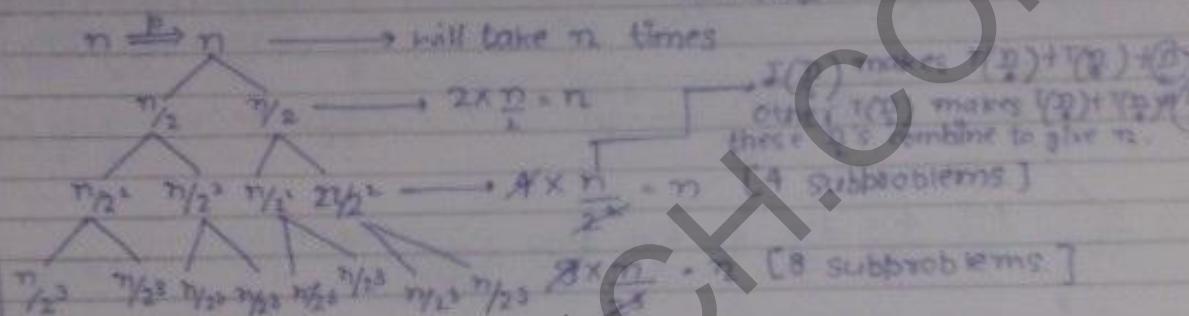
Cosmos

10.06.12

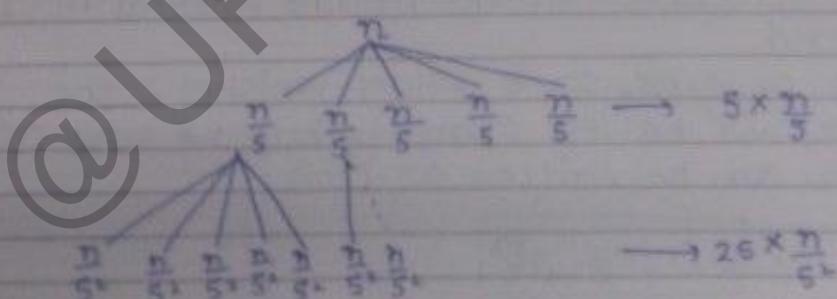
Recursive Tree Method :-

$$T(n) = 2T\left(\frac{n}{2}\right) + n \quad \begin{matrix} \rightarrow \text{combination} \\ \text{subproblems algo} \end{matrix}$$

$$\therefore T\left(\frac{n}{2}\right) + T\left(\frac{n}{2}\right) + n, \quad \begin{matrix} \text{[method is useful when there are 3 subproblems]} \\ \text{elements] } \end{matrix}$$



$$\therefore T(n) = 5T\left(\frac{n}{5}\right) + n$$



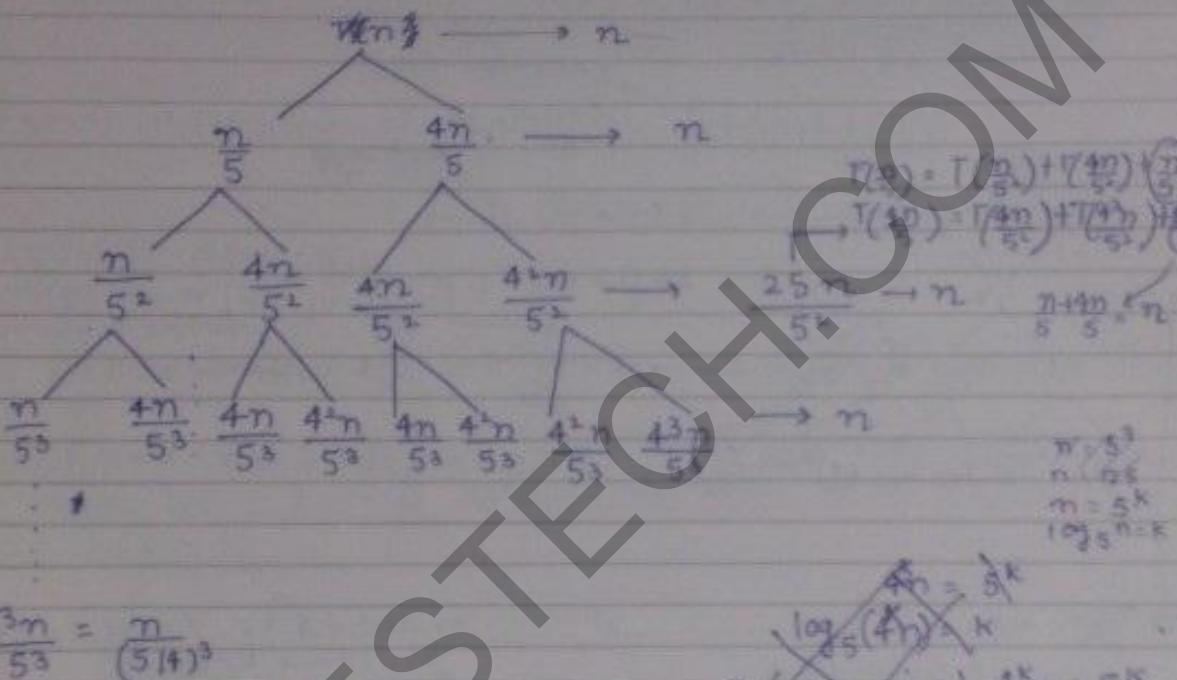
$$5^k = n$$
$$k = \log_5 n$$

$$T(n) = O(n \log_5 n) + O(n)$$

because both sides have same height. $= O(n \log_5 n)$ [max. of $O(n \log_5 n)$ & $O(n)$]

Cosmos

$$T(n) = T\left(\frac{n}{5}\right) + T\left(\frac{4n}{5}\right) + n$$



$$\frac{4^3 n}{5^3} = \frac{n}{(5/4)^3}$$

Dividing by $5/4$ will create more levels, so $n/(5/4)$ creates most no. of levels r . We for max. no. of levels we equate n with $(\frac{5}{4})^r$.

* $n/5^3$ will stop somewhere in the middle, whereas $n/(5/4)^r$ will go till the end.

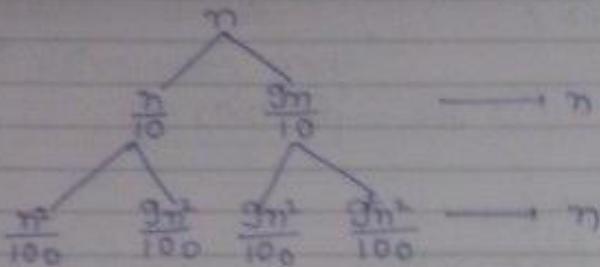
* after some no. of levels, some values vanishes & the position cost will be less than n , but we take $O(n)$, as less than n can be written as $O(n)$.

↑ Sia's answer → $O(n \log_{5/4} n)$

$$T(n) = T\left(\frac{7n}{10}\right) + T\left(\frac{3n}{10}\right) + n$$

Cosmos

Similar to previous one



Complexity :- $O(n \log_{10/9} n)$

$$T(n) = T\left(\frac{n}{5}\right) + T\left(\frac{3n}{5}\right) + n$$

$$T(n) = T\left(\frac{n}{5}\right) + T\left(\frac{3n}{5}\right) + \frac{n}{5}$$

$$T\left(\frac{3n}{5}\right) = T\left(\frac{3n}{5}\right) + T\left(\frac{3n}{5}\right)$$

$$\begin{aligned} & T\left(\frac{n}{5}\right) \\ & \frac{n}{5} \rightarrow \frac{4n}{5} \\ & \frac{4n}{5} \rightarrow \frac{16n}{25} \\ & \frac{16n}{25} \rightarrow \frac{40n}{125} \end{aligned}$$

$$\begin{aligned} & T\left(\frac{3n}{5}\right) \\ & \frac{3n}{5} \rightarrow \frac{3n}{5} \end{aligned}$$

$$\frac{3n}{5} = \frac{3n}{5} + \frac{3n}{5} = \frac{11n}{5}$$

$$\frac{11n}{5} = \frac{4n}{5}$$

$$T = \frac{4n}{5} + \frac{4^2 n}{5^2} + \dots + \frac{4^k n}{5^k}$$

$$\log_{5/3} n = k$$

$$\frac{n[1 - (\frac{4}{5})^{\log_{5/3} n} - 1]}{\frac{4}{5} - 1} = 5n [1 - (\frac{4}{5})^{\log_{5/3} n}]$$

this is less than 1

$$\therefore \text{Complexity} = 5n [1 - (\frac{4}{5})^{\log_{5/3} n}] \approx 5n$$

~~$\approx 5n$~~ $\leq 5n \rightarrow O(n)$

Cosmos

Note:-

$$\text{If } T(n) = T\left(\frac{n}{a}\right) + T\left(\frac{n}{b}\right) + n \quad \text{if } \frac{n}{a} + \frac{n}{b} = n$$

then complexity is
 $\boxed{O(n \log n)}$

$$\text{but if } \frac{n}{a} + \frac{n}{b} < n$$

then complexity is $\boxed{O(n)}$

$$1. T(n) = 8T\left(\frac{n}{2}\right) + n^2 \rightarrow O(n^2 \log n)$$

$$2. T(n) = T\left(\frac{n}{5}\right) + T\left(\frac{7n}{5}\right) + n$$

this means problem is Increasing Stepwise

$$\begin{aligned} & \text{Diagram: } T(n) = T\left(\frac{n}{5}\right) + T\left(\frac{7n}{5}\right) + n \\ & \text{Step 1: } T(n) = T\left(\frac{n}{5}\right) + T\left(\frac{7n}{5}\right) + n \\ & \text{Step 2: } T\left(\frac{n}{5}\right) = T\left(\frac{n}{5^2}\right) + T\left(\frac{7n}{5^2}\right) + \frac{n}{5} \rightarrow \frac{n}{5} + \frac{n}{5^2} = \frac{6n}{5^2} \\ & \text{Step 3: } T\left(\frac{7n}{5}\right) = T\left(\frac{7n}{5^2}\right) + T\left(\frac{7^2n}{5^2}\right) + \frac{7n}{5} \rightarrow \frac{7n}{5} + \frac{7^2n}{5^2} = \frac{82n}{5^2} \end{aligned}$$

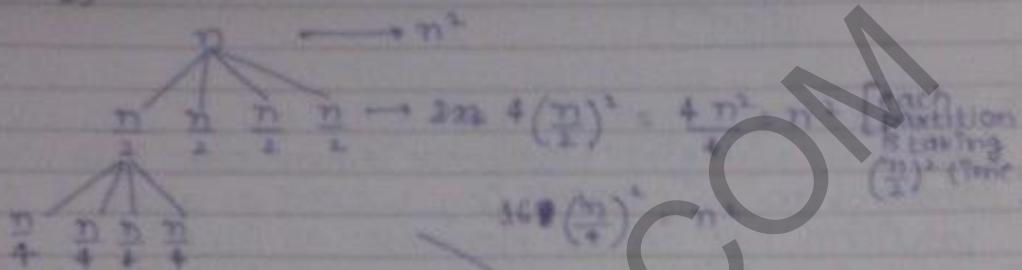
$$\begin{aligned} & T(n) = \frac{6n}{5^2} + \frac{82n}{5^2} + n \\ & \frac{n}{5} \left[\frac{6}{5} + \frac{82}{5} - 1 \right] = \frac{5n}{3} \left[\left(\frac{8}{5}\right)^{\log_5 7^2} - 1 \right] \\ & = \Theta\left(\left(\frac{8}{5}\right)^{\log_5 7^2}\right) \\ & \approx n \times \left(\frac{8}{5}\right)^{\log_5 7^2} \approx n \times n^{2 \cdot \log_5 7^2} \\ & \therefore \text{complexity is } \boxed{O(n \times n^{\log_5 7^2})} \end{aligned}$$

Cosmos

$$T(n) = 4T\left(\frac{n}{2}\right) + \left(\frac{n}{2}\right)^2$$

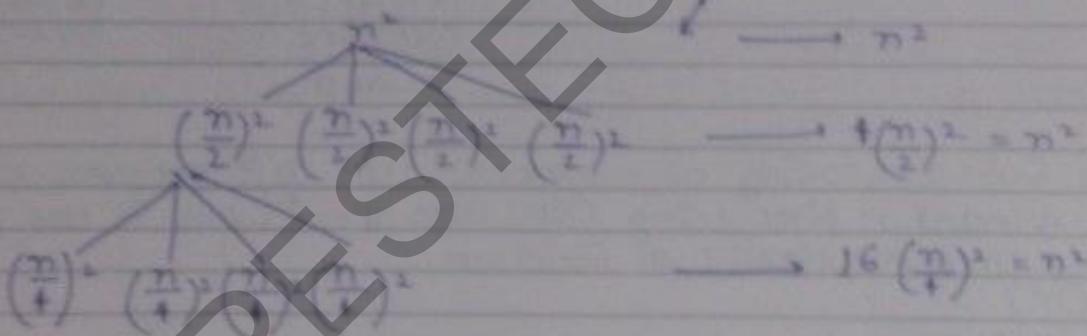
RECURSION

Q. $T(n) = 4T\left(\frac{n}{2}\right) + n^2$



no. of levels $\rightarrow n = 2^k \rightarrow k = \log_2 n$

\therefore Complexity $\underline{\underline{O(n^2 \log n)}}$



Quicksort

* Quicksort will give the best case even when a single element is on one side of partition & even zeroes of elements on other side

$$T(n) = T(m) + T(n-m) + n \quad 0 < \alpha < 1 \quad [\text{not equal, because if } m=0 \text{ or } n \text{ then it will give the worst case}]$$

[Best Case]

* $T(n) = T(10) + T(n-10) + n$

$O(n^2)$ \rightarrow Worst case [as n is very large & hence $(n-10)$ won't make any effect]
 no. of levels $\rightarrow \frac{n}{10}$ & each level complexity is n
 $\frac{n^2}{10} \rightarrow O(n^2)$

Cosmos

$$T(n) = T(1,00,000) + T(n-1,00,000) + n$$

\downarrow
 $O(n^2)$

★ Worst-Case:-

Quicksort will give Worstcase when one partition has constant no. of elements (e.g. 1,00,000 as above) & other partition has no. of elements as function of n.

★ Best Case will happen when both partition will have no. of elements as function of n.

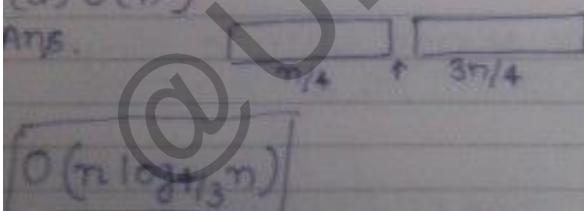
Worst-Case :- $T(n) = T(c) + T(n-1+1) + n$

C :- constant
C+1 :- 1 because of pivot element [it won't be taken in the partition]
but as +1 \leftarrow
 $n-1+1$ won't affect the answer so
∴ we can write it as $1(n-1)$.

Q. In Quicksort, sorting of n-elements, the $(\frac{n}{4})^{th}$ smallest element is selected as pivot using $O(n)$ algo, then what is the worst case time complexity of Quicksort.

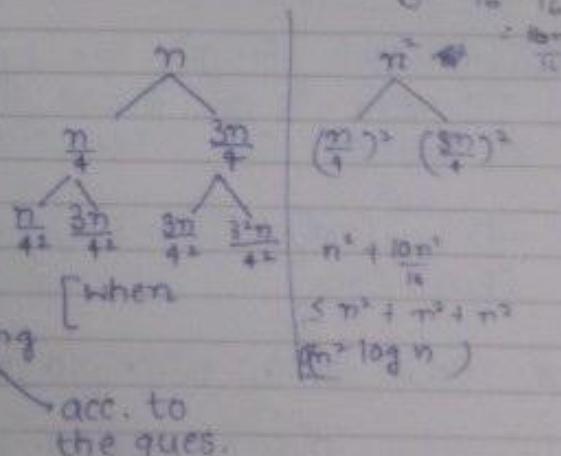
- (a) $O(n^2)$
(b) $O(n \log n)$
(c) $O(n)$
(d) $O(n^3)$

Ans.



$$T(n) = T\left(\frac{n}{4}\right) + T\left(\frac{3n}{4}\right) + P(n) + Q(n)$$

place pivot at correct position selecting pivot



$$T(n) = T\left(\frac{n}{4}\right) + T\left(\frac{3n}{4}\right) + 2n$$

Cosmos

If we have chosen n^{th} smallest element :-
then it is worst case.

- Q. The median of n -elements can be found using $O(n)$ algo. Which one of the following is correct about complexity of quicksort if median is selected as pivot?
- (A) $O(n^2)$
 - (B) $O(n \log n)$
 - (C) ~~O(n)~~ $O(n)$
 - (D) $O(n^3)$

Median :- The middle element of a sorted array.
this means $(\frac{n}{2})^{\text{th}}$ smallest element.

Stable Sorting Technique :-

- The relative order of repeated elements not changed after sorting, then sorting technique is called Stable Sorting Technique.

e.g.

$a[0] \rightarrow 10_a, 11, 20, 10_b, 40, 50, 60$
i = 1 2 3 4 5 6 7
 ↑ ↑ ↑ ↑ ↑ ↑ ↑

$a[0] \rightarrow 10_a, 10_b, 20, 11, 40, 50, 60$ now, interchange
i = 1 2 3 4 5 6 7
 ↑ ↑ ↑ ↑ ↑ ↑ ↑

$a[0] \rightarrow 10_b, 10_a, 20, 11, 40, 50, 60$
i = 1 2 3 4 5 6 7

* Quicksort is not Stable, but Mergesort is stable.

Randomized Quicksort :-

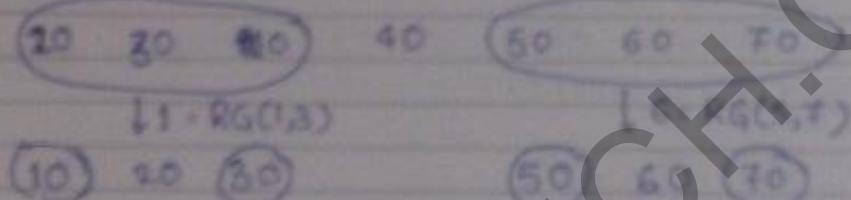
Cosmos

a[10] 10 30 40 50 60 70
1 2 3 4 5 6 7

↓ choose pivot element randomly using rand
to generate or
↓ suppose we get 4 as pivot element pos
 $\text{swap}(a[1], a[4])$

a[7] - 40 20 30 10 50 60 70
1 2 3 4 5 6 7

↓ QuickSort



- ① Choosing ~~the~~ pivot element randomly is called randomized quicksort
- ② NO specific I/P will generate worst case performance for both sorted & unsorted array will have $O(n \log n)$ complexity.
- ③ It is independent of I/P order.

Randomized Quicksort :-

```
RandomizedQS(a, p, r)
    if (p <= r)
        T = partition(a, p, r);
        RandomizedQS(a, p, T-1);
        RandomizedQS(a, T+1, r);
```

Cosmos

Quicksort

Best: $n \log n$

Avg.: $n \log n$

Worst: n^2

(almost sorted)

20% its not going to happen.

Randomized Quicksort

$n \log n$

$n \log n$

n^2

Given all the elements are same
99.99999999999999 its not going to happen.

Selection Procedure:-

i/p:- An array of n -element & integer k

o/b:- Selecting k th smallest element

e.g. $\begin{array}{ccccccc} 40 & 70 & 20 & 60 & 10 & 50 & 30 \\ 1 & 2 & 3 & 4 & 5 & 6 & 7 \end{array} | k=4$

Algo-1

① Find 1st element & delete.

② " 2nd " "

③ " 3rd " "

④ " k th " & return it

$\rightarrow O(kn)$ when $k=1$
when $k=n$ $O(n)$ - best
 $O(n^2) \rightarrow$ worst case

Algo-2

① Sort the array

$\rightarrow n \log n$

Best &

② Return $a[k]$

Worst case $\rightarrow O(n \log n)$

Algo-3

$\begin{array}{ccccccc} 40 & 10 & 20 & 60 & 10 & 50 & 30 \\ 1 & 2 & 3 & 4 & 5 & 6 & 7 \end{array}$

$\nwarrow k^{th}$ smallest element

Selection procedure (a, i, j, k)

{ if ($i=j$)

{ if ($i=k$)

return ($a[i]$);

else

return ($a[i]$);

else { $m = \text{partition}(a, i, j)$;

if ($m=k$)

return ($a[m]$);

else

{ if ($m < k$)

bootit

Selection procedure (a, i, m)

else

Selection procedure (a, i, n)

Cosmos

Let $T(n)$ be the amount of time req., then

$$T(n) = \begin{cases} O(1) & \text{if } n=1 \\ O(n \log n) & \text{if } n > 1 \end{cases}$$

→ My answer

Sir's answer:-

$$T(n) = \begin{cases} O(1), & n=1 \\ \text{Best case} \\ n+2+T\left(\frac{n}{2}\right) & \text{if } n>1 \\ \text{time for partition} \\ = T\left(\frac{n}{2}\right) + n \\ = \Omega(n) & \text{when the partition algo creates "constant" no. of elements on both sides.} \end{cases}$$

Worst Case:-

$$T(n) = \begin{cases} O(n) & \text{if } n=1 \\ \text{Worst case} \\ n+2+T(n-1) & \text{if } n>1 \\ \text{time for partition} \\ = T(n-1) + n \\ = O(n^2) & \text{when the partition algo creates partition when one partition contains "constant" no. of elements.} \end{cases}$$

Strassen's Matrix Multiplication :-

D) Without Divide & Conquer :-

$A_{n \times n}, B_{n \times n}$

$$\begin{aligned} 1. \quad C_1 &= A+B \rightarrow O(n^2) \\ 2. \quad C_2 &= B-B \rightarrow O(n^2) \end{aligned}$$

$C_1, 2$: To select one element it will take $O(n^2)$
to add two elements it will take $O(1)$
Complexity :- $O(n^2)$

C_3 : To get the element in final matrix $\rightarrow O(mnp)$
 $m \times n \times p$

D) Using Divide & Conquer :-

i) If the given two matrices are $\leq 2 \times 2$, then the problem is small.

ii) Only for square matrices.

iii) The size of square matrices should be powers of 2.

Cosmos

$$A = \begin{bmatrix} A_{11} & A_{12} \\ A_{21} & A_{22} \end{bmatrix} \quad 4 \times 4$$

$$B = \begin{bmatrix} B_{11} & B_{12} \\ B_{21} & B_{22} \end{bmatrix} \quad 4 \times 4$$

① divide the size of matrices by 2 till we reach the matrix size of 2
 (e.g. the above is divided till we get 2×2)

$$\begin{aligned} \text{e.g. } T(16) &= T(8) \\ &= T(4) \\ &= T(2) \end{aligned}$$

$$C = \begin{bmatrix} C_{11} & C_{12} \\ C_{21} & C_{22} \end{bmatrix} \quad 4 \times 4$$

$$C_{11} \times \left[\begin{array}{l} 1 \times a + 2 \times c \\ 3 \times a + 4 \times c \end{array} \right] \quad \left[\begin{array}{l} 1 \times b + 2 \times d \\ 3 \times b + 4 \times d \end{array} \right]$$

$$T(4) = 8 T\left(\frac{4}{2}\right) + 4 \times \text{Complexity of } 4 \times 4 \text{ matrix}$$

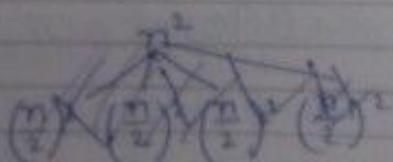
↳ 8 multiplications of matrices 2×2
 ↳ 4 additions of matrices of sizes 2×2

$$T(8) = 8 T\left(\frac{8}{2}\right) + 4 \times \text{Complexity of } 8 \times 8 \text{ matrix}$$

$$T(16) = 8 T\left(\frac{16}{2}\right) + 4 \times \text{Complexity of } 16 \times 16 \text{ matrix}$$

↳ 8 matrix multiplications of size 8×8
 ↳ 4 matrix additions of size 8×8

$$T(n) = 8 T\left(\frac{n}{2}\right) + n^2$$



$$\begin{aligned} T(n) &= 8 T\left(\frac{n}{2}\right) + n^2 = 64 T\left(\frac{n}{4}\right) + 8 \frac{n^2}{4} + n^2 \\ &= 8^3 T\left(\frac{n}{8}\right) + 64 \cdot \frac{n^2}{8} + 8 \frac{n^2}{4} + n^2 \end{aligned}$$

each addition takes $O(n^2)$ complexity
 ∴ a 8×8 matrix will take $(8)^2$

Cosmos

$$\leq 2^k T\left(\frac{n}{2^k}\right) + n^3 [1 + 2^1 + 2^2 + 2^3 + \dots + 2^{k-1}]$$

$$\leq \frac{n^3}{2} + n^3 - n^2$$
$$\leq \frac{3n^3}{2} - \frac{n^2}{2}$$
$$\boxed{\Theta(n^3)}$$

Note:

Using divide & conquer & without using it, it will take same time $O(n^3)$ or $\Theta(n^3)$.

④ Without using divide & conquer is better because of stack space.

* Strassen Method:-

$$T(n) = \begin{cases} O(1), & \text{if } n \leq 2 \times 2 \\ 7T\left(\frac{n}{2}\right) + 16 \times \left(\frac{n}{2}\right)^2 & \end{cases}$$

$\frac{7}{2} \log_2 n = n^{1.327}$

$f(n) = n^2$ (as constants don't affect complexity)

$n^{1.327} + 2n^2 \therefore \text{complexity: } \boxed{O(n^{1.327})}$

$\frac{7}{2} \log_2 n \times n^2$ additions of size $\frac{n}{2} \times \frac{n}{2}$ for $m \times n$

$\frac{7}{2} \log_2 n \times n^2$ multiplications of size $\frac{n}{2} \times \frac{n}{2}$ for $m \times n$

$\boxed{O(n^{2.327})}$ → Strassen method.

But the best case is $\rightarrow \boxed{O(n^{2.327})}$

Comparison:

① Max. in n elements $\rightarrow 2T\left(\frac{n}{2}\right) + 2 \rightarrow O(n)$

② Power of an element $\rightarrow T\left(\frac{n}{2}\right) + 1 \rightarrow O(\log n)$

③ Binary Search $\rightarrow T\left(\frac{n}{2}\right) + c \rightarrow O(\log n)$

④ Merge Sort $\rightarrow 2T\left(\frac{n}{2}\right) + n \rightarrow O(n \log n)$

⑤ Quick Sort $\rightarrow \begin{cases} 2T\left(\frac{n}{2}\right) + n & \rightarrow O(n \log n) \\ T(n-1) + n & \rightarrow O(n^2) \end{cases}$

Cosmos

④ Selection procedure

$$T\left(\frac{n}{2}\right) + n \rightarrow O(n)$$

Avg.

$$T(n-1) + n \rightarrow O(n^2)$$

⑤ Matrix Multiplication

$$T(n) = 8T\left(\frac{n}{2}\right) + n^2 \rightarrow O(n^3)$$

$$T(n) = T\left(\frac{n}{2}\right) + n^2 \rightarrow O(n^{1.5})$$

Q.

$A(n)$

```

if (n ≤ 1) return;
else
    return (A(√n));
  
```

(A) $O(n)$

(B) $O(\log n)$

(C) $O(\log \log n)$

(D) $O(n^2)$

Q.

$DNA(n)$

```

if (n ≤ 1) return;
else
  
```

```

    return (DNA(1) + DNA(2) + 100);
  
```

$T(n) = \begin{cases} O(1), & n \leq 1 \\ 2T\left(\frac{n}{2}\right) + C, & \text{otherwise} \end{cases}$

$$= 2 \left[2T\left(\frac{n}{4}\right) + C \right] + C$$

$$= 2^k T\left(\frac{n}{2^k}\right) + 2C + C$$

$$= 2^k \left[2^k T\left(\frac{n}{2^k}\right) + C \right] + 2C + C$$

$$= 2^{2k} T\left(\frac{n}{2^k}\right) + 4C + 2C + C$$

$$= 2^k T\left(\frac{n}{2^k}\right) + 2^{k+1} C + 2^{k-1} C + C$$

Rec
T(n) =

$$T(n) = \begin{cases} O(1), & n \leq 1 \\ T\left(\frac{n}{2}\right) + O(1), & \text{otherwise} \end{cases}$$

$$T(n) = T(\sqrt{n}) + O(1)$$

$$= T(n^{1/2}) + O(1)$$

$$= T(n^{1/2^k}) + O(1)$$

$$= T(1) + kC$$

$$= O(1) +$$

$$c \log \log n$$

$$= O(\log \log n)$$

$$\log_2 \frac{n}{2^k} = k$$

$$\frac{1}{2^k} \log_2 n = \log_2 n$$

$$\frac{1}{C_1} \log_2 n = 2^k$$

$$\log_2 \log_2 n = k$$

to calculate
 \sqrt{n}

Cosmos

$$T(n) = nT(1) + C_1 \quad [n = 2^k]$$

$\bullet = n + C_1$
 $= O(n)$

```

    A(n)
    { If (n ≤ 1)
      return;
      else
      return(A(⌈n/2⌉) + A(⌊n/2⌋) + n);
    }
  
```

Similar to:

$$\begin{aligned} b &= A(\frac{n}{2}); \\ c &= A(\frac{n}{2}); \\ d &= b + c + n; \\ \text{return}(d); \end{aligned}$$

This is just addition.
It will take $O(1)$ time for addition.
[not a function call.]

$$\begin{aligned} T(n) &= \begin{cases} O(1), & n \leq 1 \\ T(\frac{n}{2}) + T(\frac{n}{2}) + n, & \text{otherwise} \end{cases} \\ &= 2T(\frac{n}{2}) + n \\ &= 2\left[2T(\frac{n}{4}) + \frac{n}{2}\right] + n \\ &= 2^2\left[2T(\frac{n}{8}) + \frac{n}{4}\right] + n + n \\ &= 2^3\left[2T(\frac{n}{16}) + \frac{n}{8}\right] + n + n \\ &= 2^4T(\frac{n}{32}) + kn \\ \text{but } 2^k &= n \\ \therefore nT(1) + kn &= O(n) \end{aligned}$$

→ My mistake.
[taken n as function call.]

```

    return (A(x) * A(y));
    T(n) = 2T(\frac{n}{2}) + 'c' → for multiplication.
  
```

* Master theorem is applicable when $f(n)$ is a ~~linear~~ polynomial function.

Master Theorem:-

It is applicable only in the form of divide & conquer, e.g.

$$T(n) = aT\left(\frac{n}{b}\right) + f(n) \quad a \geq 1 \quad b > 1$$

Case 1: $f(n) = O(n^{\log_b a - \epsilon})$ where $\epsilon > 0$

then $T(n) = \Theta(n^{\log_b a})$

Case 2: $f(n) = \Omega(n^{\log_b a + \epsilon})$ where $\epsilon > 0$

then $T(n) = \Theta(f(n))$

Case 3: $f(n) = \Theta(n^{\log_b a})$

then $T(n) = \Theta(n^{\log_b a} \cdot \log n)$

e.g. $OT(n) = 8T\left(\frac{n}{2}\right) + n^2 \rightarrow a=8, b=2 \quad n^{\log_b a} = n^3$

$n^2 = O(n^3)$

$f(n) < n^{\log_b a} \quad \Theta(n^3) \rightarrow \text{Case 1}$

① $T(n) = 2T\left(\frac{n}{2}\right) + n \rightarrow a=2, b=2 \quad n^{\log_b a} = n^2$

$f(n) = n^{\log_b a}$

$\Theta(n \log n) \rightarrow \text{Case 3}$

② $T(n) = 2T\left(\frac{n}{2}\right) + 1$

$n^{\log_b a} = n$

$f(n) = 1$

$f(n) < n^{\log_b a} \rightarrow \Theta(n) \rightarrow \text{Case 2}$

③ $T(n) = T\left(\frac{n}{2}\right) + C$

$n^{\log_b a-1} = n = 1$

$f(n) = C$

$n^{\log_b a} = f(n)$

$\therefore \Theta(n^0 \log n) = O(\log n)$

④ $T(n) = 4T\left(\frac{n}{2}\right) + n^3$

$n^{\log_b a} = n^2$

Case 1: $\Theta(n^3)$

Imp.

⑤ $T(n) = 8T\left(\frac{n}{2}\right) + n^2$

$\Theta(n^3)$

* ϵ tells that

$n^{\log_b a} = n^3$

n^3 is how many times greater than

n^2

$n^2 = O(n^3)$

$n^2 = O(n^{3-\epsilon})$

$f(n) = n^2$

$n^2 = O(n^{3-\epsilon})$

* Master theorem is applicable when $f(n)$ is a sum polynomial function.

Master Theorem:

It is applicable only in the form of divide & conquer, e.g.

$$T(n) = aT\left(\frac{n}{b}\right) + f(n) \quad a \geq 1 \quad b > 1$$

Case 1: $f(n) = O(n^{\log_b a - \epsilon})$ where $\epsilon > 0$
then

$$T(n) = \Theta(n^{\log_b a})$$

Case 2: $f(n) = \Omega(n^{\log_b a + \epsilon})$ where $\epsilon > 0$
then $T(n) = \Theta(f(n))$

Case 3: $f(n) = \Theta(n^{\log_b a})$
then $T(n) = \Theta(n^{\log_b a} \cdot \log n)$

Ex 1: $T(n) = 8T\left(\frac{n}{2}\right) + n^2 \rightarrow a=8, b=2, n^{\log_b a} = n^3$
 $n^2 = O(n^2)$
 $f(n) < n^{\log_b a}$ $\rightarrow [O(n^3)] \rightarrow \text{Case 1}$

Ex 2: $T(n) = 2T\left(\frac{n}{2}\right) + n \rightarrow a=2, b=2, n^{\log_b a} = n^2$
 $f(n) = n^{\log_b a}$ $\rightarrow [O(n^2)] \rightarrow \text{Case 3}$

Ex 3: $T(n) = 2T\left(\frac{n}{2}\right) + n^{\log_2 2} = n^2, f(n) = 1 \quad f(n) < n^{\log_2 2} \rightarrow [O(n)] \rightarrow \text{Case 1}$

Ex 4: $T(n) = T\left(\frac{n}{2}\right) + C$
 $n^{\log_2 1} = n^0 = 1 \quad f(n) = C$
 $n^{\log_2 a} = f(n) \quad \therefore \Theta(n^0 \log n) = O(\log n)$

Ex 5: $T(n) = 4T\left(\frac{n}{2}\right) + n^3$ Case 2: $[O(n^3)]$
 $\log_2 4 = n^1$
 $n^{\log_2 4} = n^2$

Imp.

Ex 6: $T(n) = 8T\left(\frac{n}{2}\right) + n^2$ $\Theta(n^3)$ * ϵ tells that
 $n^{\log_2 8} = n^3$ n^3 is how many
 $n^{\log_2 8} = n^3$ times greater than
 $f(n) = n^2$ $n^2 = O(n^3)$ $n^3 = \boxed{E=1}$
 $f(n) = n^2$ $n^2 = O(n^{3-\epsilon})$

Cosmos

$n^{\log_b a}$ must be at least polynomial times greater than $f(n)$. $f(n)$ must be a polynomial.

case 1:- $n^{\log_b a}$ is polynomial times greater than $f(n)$.

case 2:- $n^{\log_b a}$ is polynomial times smaller than $f(n)$.

case 3:- $n^{\log_b a}$ is asymptotically equal.

$$T(n) = 2T\left(\frac{n}{2}\right) + n \log n$$

$$n^{\log_2 2} = n \quad f(n) = n \log n$$

$$f(n) > n^{\log_2 2} \rightarrow \text{Case 2}$$

$$\frac{f(n)}{n^{\log_2 2}} = \log n \quad \therefore \text{but not com. w.r.t. } n \log n \text{ in terms of } n$$

$n^{\log_2 2}$ is logarithmic time smaller than $f(n)$, so master theorem is not applicable. So, $\Theta(n \log n)$.

$$? T(n) = T(\sqrt{n}) + c \rightarrow ?$$

$$n^{\log_2 2} = 1 \quad [a=1, b=2] \quad \text{but } b \text{ should be greater than 1.}$$

$\Theta(n \log n)$

The above method is not in divide & conquer format.

Now to use master theorem, we will convert it into divide & conquer format.

Step 1:- Assume $n = 2^k$

$$T(2^k) = T(2^{k-1}) + c$$

Step 2:- Assume $T(2^k) = S(k)$

$$S(k) = S\left(\frac{k}{2}\right) + c$$

$$n^{\log_2 2} = 2^k \quad k^{\log_2 2} = k^2 = 1$$

$$\text{then, } \Theta(n^2 \log n) \quad \text{Case 3: } \Theta(n^2 \log \log n)$$

$$T(n) = 2T(\sqrt{n}) + n \log n$$

$$\text{put } n = 2^k$$

$$T(2^k) = 2T(2^{k-1}) + \log_2 2^k$$

$$T(2^k) = 2T(2^{k-1}) + k$$

$$\text{put } S(k) = 2S\left(\frac{k}{2}\right) + k$$

$$k^{\log_2 2} = k^2 = k$$

$$k < k^2$$

$$\Theta(n^2) - \Theta(\log(n^2))$$

$$\Theta(k \log k) \rightarrow \Theta(n^2 \log n)$$

Cosmos

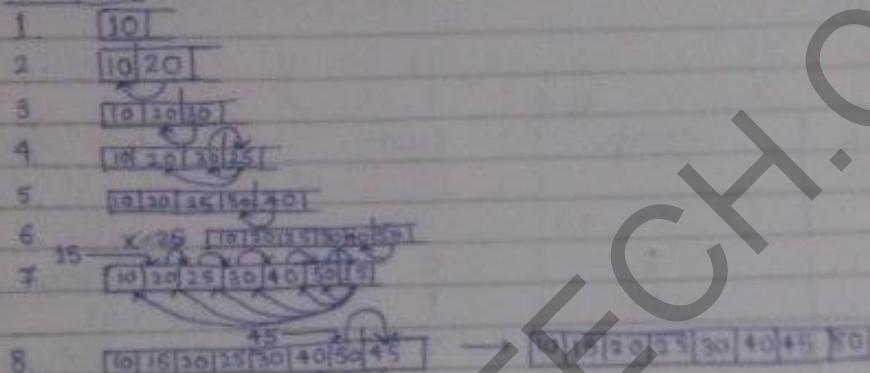
Insertion Sort:-

Note :- Insert & Sort.

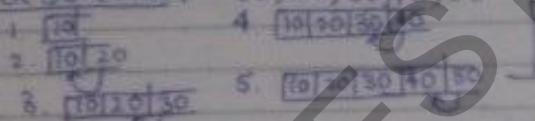
example:- $A[10 \ 20 \ 30 \ 25 \ 40 \ 50 \ 15 \ 45]$

★ It is in-place sorting technique.

1st pass:-



Best Case:- $10, 20, 30, 40, 50$ $\rightarrow n-1$ comparisons

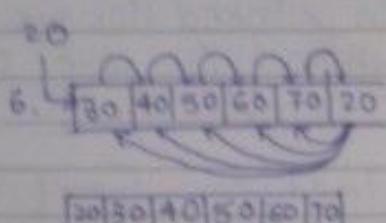
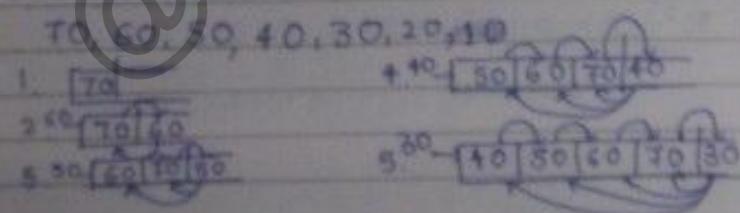


$\Omega(n)$ \rightarrow Best Case
(when it is already sorted)

Note:- To sort n elements using insertion sort, it will take $(n-1)$ comparisons in the best case.

- ② If array is almost sorted, then insertion sort is the best.
- ③ If array size is small, then insertion sort is best sort (merge sort is worse in this case.)

Worst Case:-



Comparisons	Swap
0	0
1	1
2	2
3	3
4	4
5	5
$n-1$	$n-1$
$\frac{n(n-1)}{2}$	$\frac{n(n-1)}{2}$

$$2n^2 \rightarrow O(n^2) \rightarrow \text{worst case}$$

Average Case:-

When half of the elements are to be sorted, like

10, 20, 30, 20, 60, 50

$$\frac{n}{2} \times \frac{n}{2} \rightarrow \frac{n^2}{4} \rightarrow O(n^2)$$

Cosmos

While applying insertion sort, to insert a particular element to its correct place, for that we are using linear search, then what is the worst case time complexity of insertion sort if we replace by binary search?

- (A) $O(n^2)$ (C) $O(\log n)$
 (B) $O(n \log n)$ (D) $O(n)$

My answer :- (B)

Sir's Answer :-

Worst Case

LS comparisons	swap	comp.	BS	swap
*	*	0	0	0
0	0	1	1	1
1	1	log 1	2	2
2	2	1 log 2	3	3
3	3	1 log 3	4	4
$n-1$	$n-1$	$\log(n-1)$	$n-1$	$n-1$
n^2	n^2	$n \log n$	n^2	
$2n^2$	$2n^2$	$n \log n + n^2$	$2n^2$	$O(n^2)$
$O(n^2)$				ans.

→ Swap operations do not decrease in binary search

How to decrease no. of swaps.

If I/P is present in Linked List.

- In linked list we can only perform Linear Search.
- Which will take $O(n)$ n^2 comparisons & 0 swaps.
- \therefore Complexity :- $O(n^2)$

0 1 2 3 4 5 6 7 8 min min min min

Selection Sort

25	5	58	45	32	64	3	11
1	2	3	4	5	6	7	8

S1 :-

- min \neq 7 [compare (i) Select position 1 to be the 1st minimum.
 (ii) compare the minimum with positions 2, 3, ...
 If any element $<$ minimum,
 then minimum = that element.
 & minimum's position = that element's position.

Straight Selection Sort :-

Cosmos

(iii) swap($a[i]$, $a[min]$)

pass 1: $a[i] \rightarrow 3 \ 5 \ 58 \ 45 \ 32 \ 64 \ 25 \ 11$
1 2 3 4 5 6 7 8

pass 2:- now, $i = 2$
 $min = 2$

pass 3:- $i = 3$
 $min = 3, 4, 5, 7, 8$

$a[i] \rightarrow 3 \ 5 \ 11 \ 45 \ 32 \ 64 \ 25 \ 58$
1 2 3 4 5 6 7 8

pass 4:- $i = 4$
 $min = 4, 5, 7$

$a[i] \rightarrow 3 \ 5 \ 11 \ 25 \ 32 \ 64 \ 45 \ 58$

pass 5:- $i = 5$
 $min = 5$

pass 6:- $i = 6$
 $min = 6$

$a[i] \rightarrow 3 \ 5 \ 11 \ 25 \ 45 \ 64 \ 58$

pass 7:- $i = 7$
 $min = 7, 8$

$a[i] \rightarrow 3 \ 5 \ 11 \ 25 \ 45 \ 58 \ 64$

Complexity :-

1st pass :- $n-1$ comparisons

2nd pass :- $n-2$ comparisons

3rd pass :- $n-3$ "

4th pass :- $n-4$ "

$\therefore (n-1) + (n-2) + (n-3) + \dots + 1 \leq n + n + n + \dots n \text{ times} = n^2$

Best Case :- $\Theta(n^2)$ [$\Omega(n^2)$]

Worst Case :- $\Theta(n^2)$

Bubble Sort :- $\Theta(n^2)$

I/P:- 75 58 10 84 5
 1 2 3 4 5

pass 1:- 75 58 10 84 5
 58 75 10 84 5
 58 10 75 84 5
 58 10 35 84 5
 58 10 35 58 24

pass 2:- 58 10 75 5 84
 10 58 75 5 84
 10 58 75 5 84
 10 58 5 75 84
 10 5 58 75 84
 10 5 58 75 84

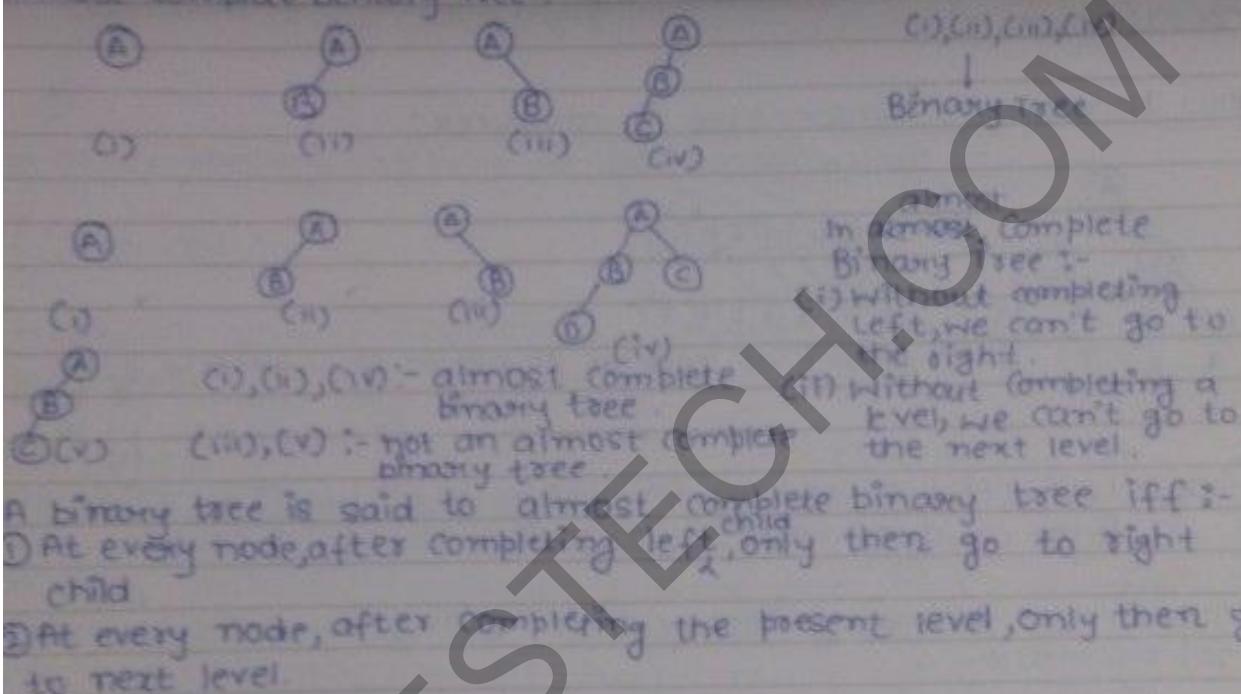
pass 3:- 10 58 5 6 75 84
 10 58 5 6 75 84
 10 58 5 6 75 84
 10 5 58 75 84
 10 5 58 75 84

pass 4:- 10 5 58 75 84
 10 5 58 75 84
 10 5 58 75 84

Cosmos

Heapsort

Almost Complete Binary Tree



In the given almost complete binary tree, if last level is also filled completely, then it is called complete binary tree.

Another name for complete binary tree :-
maximal binary tree.

Note:- A complete binary tree with k-levels, the no. of nodes = $2^k - 1$

A binary tree with k-levels, the max. no. of nodes = $2^k - 1$

Note:- The no. of nodes in a complete binary tree at level i = 2^{i-1}

Q. If there are n nodes in a binary tree :-
max. no. of levels = $\lceil \log_2 n \rceil$

min. no. of levels (for complete binary tree) = $\lfloor \log_2 n \rfloor + 1$

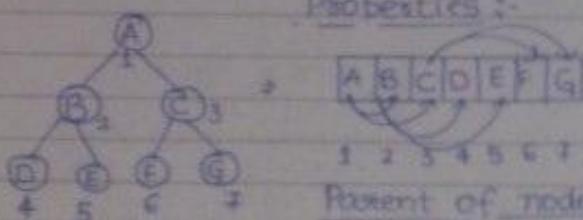
$$\begin{aligned} & 1+2+4+\dots+2^n \\ & \frac{1(2^{n+1}-1)}{2-1} \\ & = 2^{n+1}-1 \\ & \text{No. of levels: } n+1 \end{aligned}$$

Cosmos

* If there are binary tree & complete binary tree, then ~~the~~ complete binary tree will take less time for any arbitrary operation.

How to represent binary tree in computer:-

Properties :-



Parent of node at i^{th} place - If i is even = $\frac{i}{2}^{th}$ pos

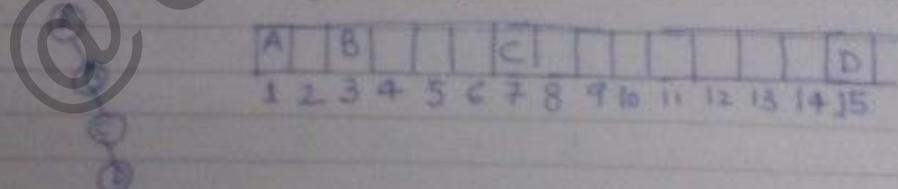
if i is odd = $\left\lfloor \frac{i+1}{2} \right\rfloor^{th}$ pos

Left Child of node at i^{th} position = $2i^{th}$ position (floor v)
Right Child of node at i^{th} position = $(2i+1)^{th}$ position

Q. Store the following binary tree using array representation -

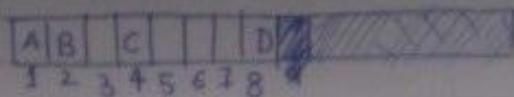
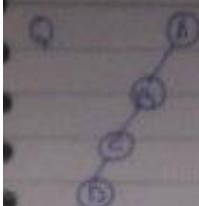


Q. Store the following Binary Tree in form of array -



* Array Representation of Binary tree is favourable when tree content is almost complete binary tree.
Linked List Representation is favoured when tree is not almost complete (like the above question).

Cosmos



- ★ After reaching last node, we stop.

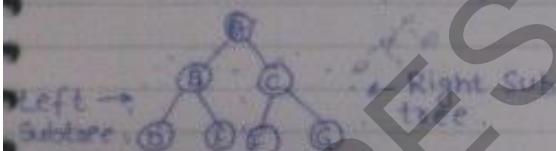
Heapsort :-

- Heapsort require Heaps trees.
- Heaps trees / Min heap Tree
Max Heap Tree

★ Heaps Trees are almost complete binary trees.

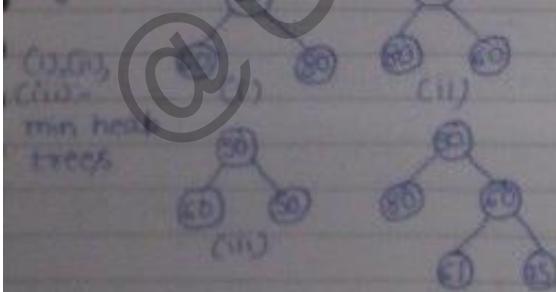
Min Heap Tree

- An almost comp.
- In a given almost complete binary tree, at every node root is minimum in comparison to its children, then the tree is called min heap tree.

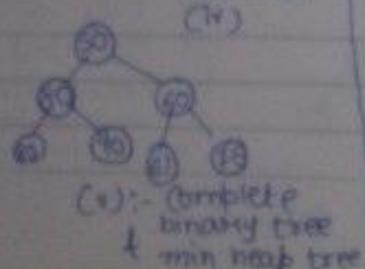


We don't have to compare sub trees, but only children.

Eg.

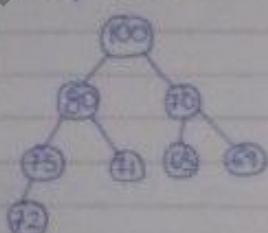


(*) - not min heap tree because it is not almost complete binary tree)



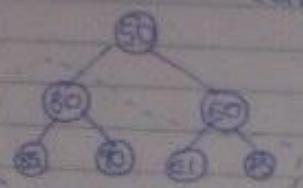
Max Heap Tree

- In a given almost complete binary tree, at every node root is maximum in comparison to its children, then it is max heap tree.



* If there are n no. of leaf nodes, then no. of internal nodes are $n-1$
So total no. of nodes = $2n-1$ [Only for Complete binary trees.]

- * The root of min heap tree is the minimum element.
- * The 2nd min. is from 2nd level.
- * The 3rd min. can be:-

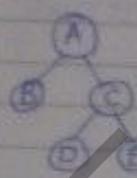


The 3rd min. can be in dotted places.

Cosmos

Strict Binary Tree:

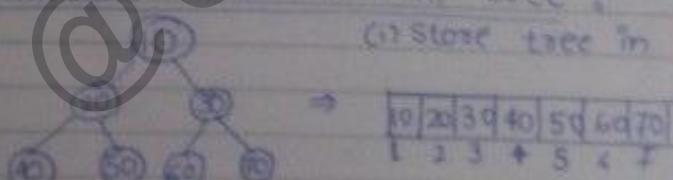
- * Every node must have either 0 children or 2 children.



* The max. element in the min heap tree is at the last level.

Insertion in Min heap tree :-

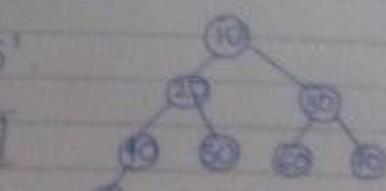
(i) Store tree in form of array :-



(ii) Now, insert '5'

10	20	30	40	50	60	70
1	2	3	4	5	6	7

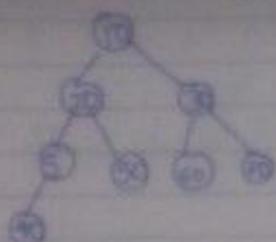
5 is the child of 40.



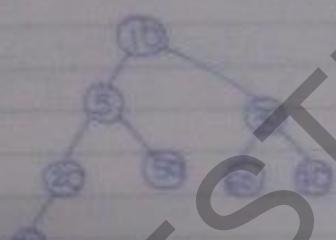
We can only insert at inserted position because we have to make it almost complete binary tree.

Cosmos

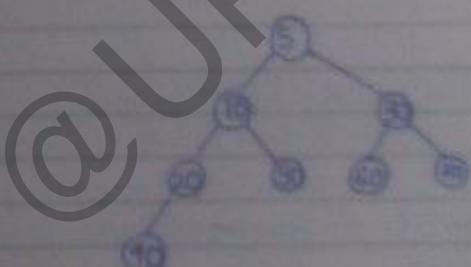
(iii) Now 5 will be compared with 40,
where 5 is min, so it will be swapped.



(iv) Now 5 will be compared with its parent (20),
& hence swapped.



(v) Now 5 will be compared with its parent (10),
& hence swapped.

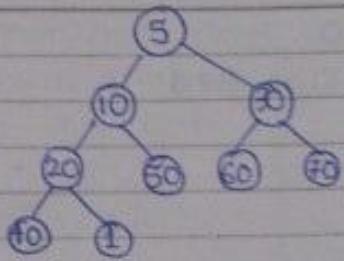


Now, in analogy:

10 per hour

Now, insert 'P'

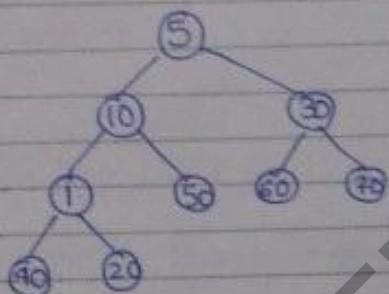
Cosmos



5	10	30	20	50	60	70	40	1
1	2	3	4	5	6	7	8	9

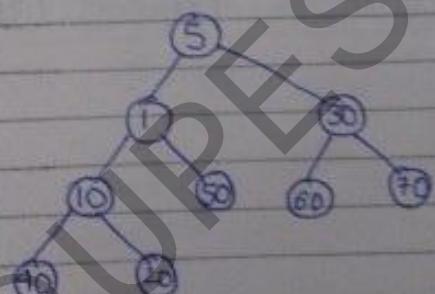
1 is right child of 20 which
is at 4, $\therefore 1$ is at $4 \times 1 + 1 = 9$.

Now, compare '1' with its parent & swap it:-



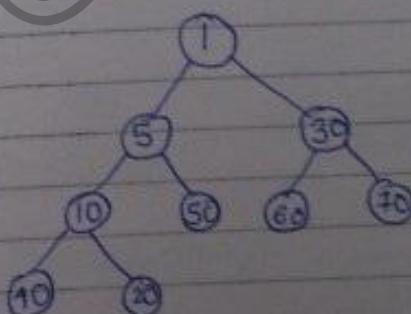
5	10	30	20	50	60	70	40	20
1	2	3	4	5	6	7	8	9

Now, compare '1' with its parent & swap it:-



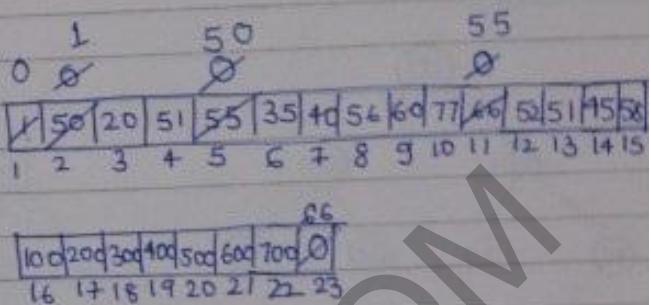
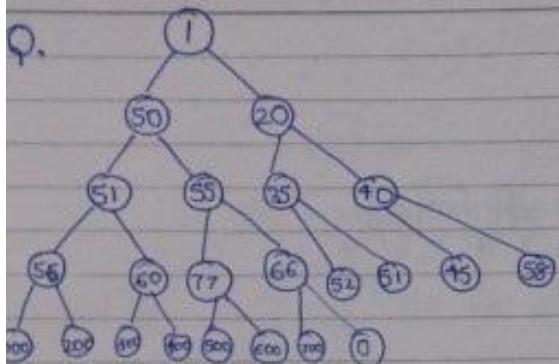
5	1	30	10	50	60	70	40	20
1	2	3	4	5	6	7	8	9

Now, compare '1' with its parent & swap it:-



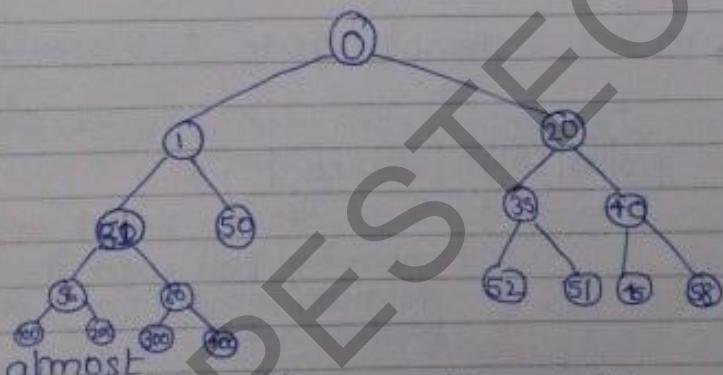
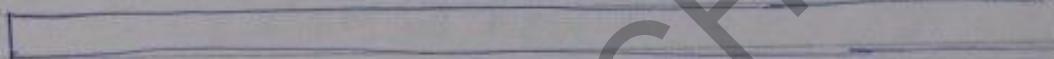
1	5	30	10	50	60	70	40	20
1	2	3	4	5	6	7	8	9

Cosmos



Now, insert '0'.

- Compare 0 with element at 11th position



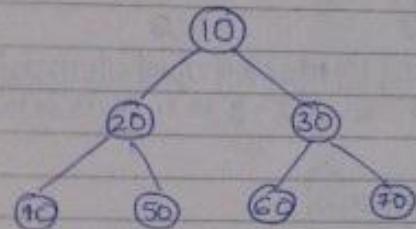
- In complete binary tree with min heap tree properties, there are $\lceil \log_2 n \rceil$ levels, so ~~the~~ at max. there will be $\lceil \log_2 n \rceil$ comparisons & $\log_2 n$ swaps $\therefore \log_2 n + \log_2 n = 2\log_2 n$
- Worst Case: - $\Theta(\log_2 n)$
- Best Case: - $\Theta(1)$
- Average Case: - $\Theta(\log_2 n)$

- In order to insert an element into min heap or max heap which already contains n elements requires $\Theta(\log_2 n)$ (Worst Case & Average Case).
- $\Theta(1)$ (Best Case).

Cosmos

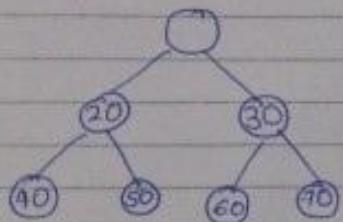
* We always delete the root.

Deletion



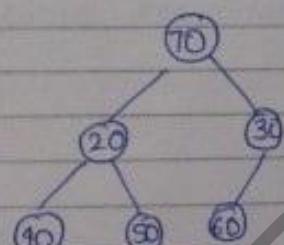
10	20	30	40	50	60	70
1	2	3	4	5	6	7

Now, delete '10'.



	20	30	40	50	60	70
1	2	3	4	5	6	7

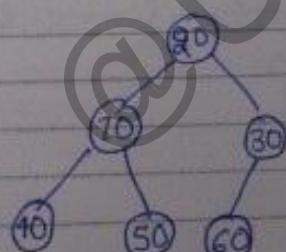
Now, go to last level, replace rightmost node & place it at root.



70	20	30	40	50	60	
1	2	3	4	5	6	7

Comparing root with its children, i.e. position 1 with position 2 & 3.

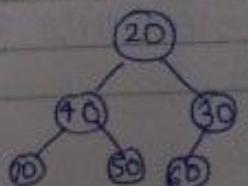
Now, compare 70 with 20 & 30, 20 is min., ~~replace 70 & 20~~ Swap 70 & 20



20	70	30	40	50	60	
1	2	3	4	5	6	7

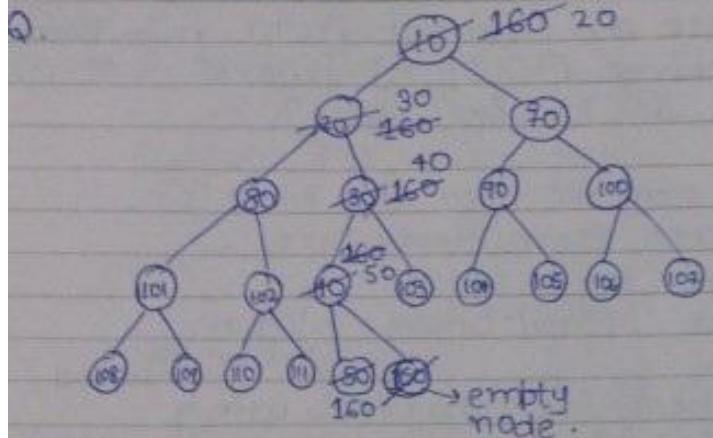
Comparing position 2 with its children (4 & 5)

Now compare 70 with 40 & 50, 40 is min., ~~swap 70 & 40~~ Swap 70 & 40.



20	40	30	70	50	60	
1	2	3	4	5	6	7

Cosmos



Amsort

20	30	70	80	40	70	100	101	102	50	103	104	105	106	107	108	109	110	111	160
1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20

20	30	40	50	160
10	20	30	80	90
1	2	3	4	5

160	160	160	160	160	160	160
10	20	30	80	90	100	101
1	2	3	4	5	6	7

1. Swap 1 & 2

1. Delete 1.
2. Place 21 at 1.
3. Compare 1 with 2 & 3, swap 1 & 2.
4. Compare 2 with 4 & 5, swap 2 & 5.
5. Compare 5 with 10 & 11, swap 5 & 10.
6. Compare 10 with 20, swap 10 & 20.

In deletion :- (at level)

At every step, there are 2 comparisons & 1 swap,
so no. of levels = $\log_2 n$.

Time complexity = $3 \log_2 n = \Theta(\log_2 n)$ → Worst Case

Average Case :- $\Theta(\log_2 n)$

Best Case :- $\Omega(1)$

Cosmos

Note:- In order to delete an element from min heap or max heap requires $O(\log_2 n)$ [worst case + average case] + $\Omega(1)$ [Best Case.]

* If we have to insert n elements into the heap (i.e. constructing min heap tree from empty tree) :-

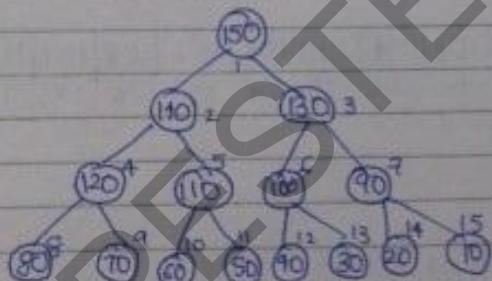
each insertion will take $\log_2 n$ time,
as there are n nodes, \therefore total time = $n \log_2 n$

(Brute Force Method)

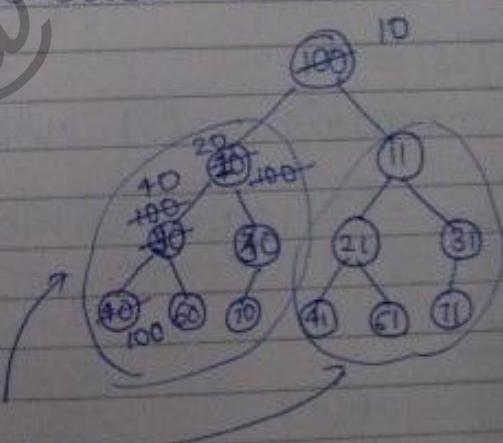
* But (constructing min heap or) max heap using Build heap will take $O(n)$ time.

e/p:- 150, 140, 130, 120, 110, 100, 90, 80, 70, 60, 50, 40, 30, 20, 10
create min-heap tree.

Step 1:- Construct almost complete binary tree.



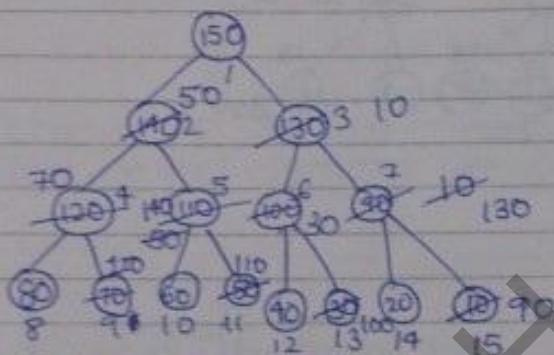
* We can use min heapify method only when left & right subtrees of root are themselves minheap tree.



min-heap
tree.

Cosmos

Now
Step 2:- Now, apply Minheapify method
we can only apply at 7, since its left & right
Subtree are min-heap.

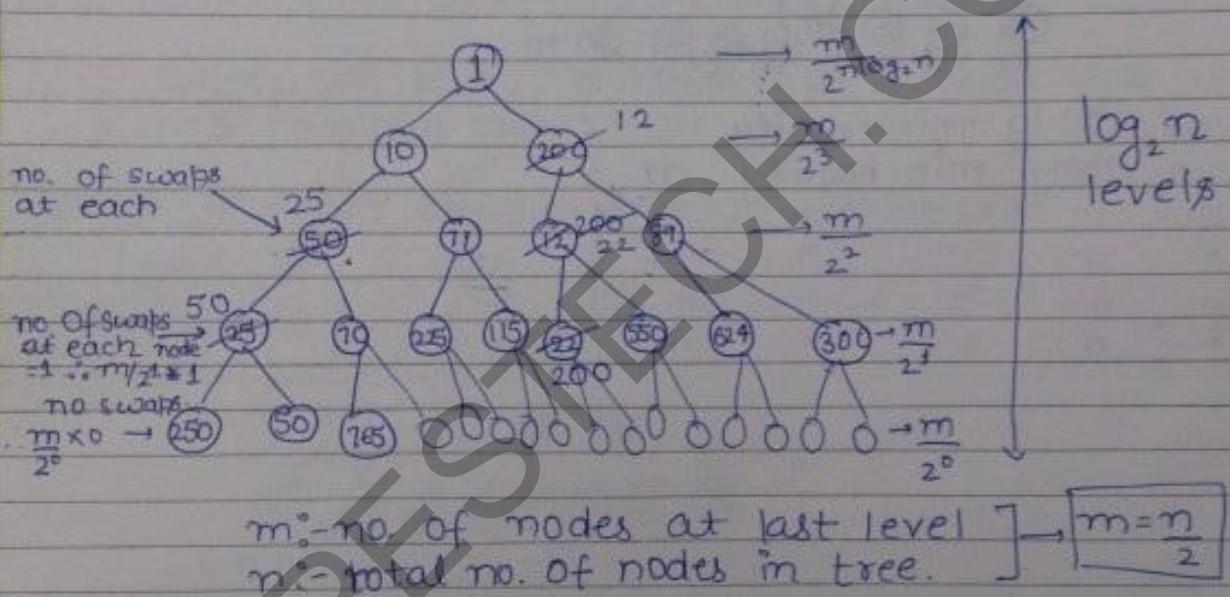
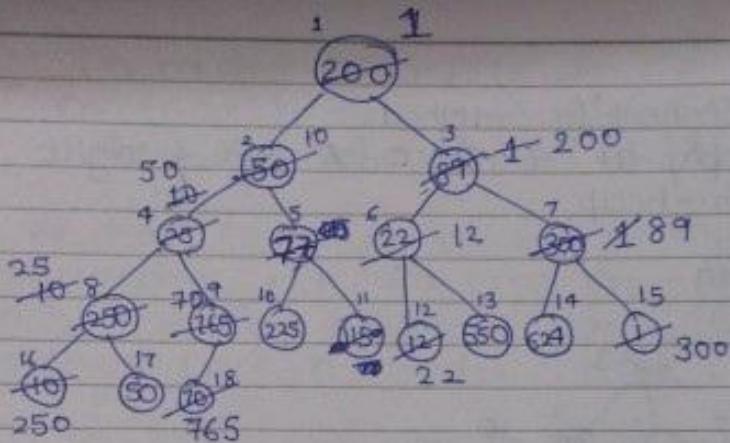


- Now, apply min-heapify at 6.
- Now, apply min-heapify at 5.
- Now, " " " " " " 4
- " " " " " " 3
- " " " " " " 2
- " " " " " " 1

- 1) Construct min heap tree for following methods -
200, 88, 89, 25, 77, 42, 300, 250, 765, 225, 115, 12, 550, 624, 1, 10, 70.

P.T.O.

Cosmos



Time complexity of build heap method =

$$= m \times 0 + \frac{m}{2^0} \times 1 + \frac{m}{2^1} \times 2 + \dots + \frac{m}{2^{\log_2 n - 1}} \times ((\log_2 n) - 1)$$

$$= m \left[\frac{1}{2^0} + \frac{2}{2^1} + \frac{3}{2^2} + \dots + \frac{[(\log_2 n) - 1]}{2^{\log_2 n - 1}} \right]$$

$O(1)$

$$= m * O(1)$$

$$= \frac{n}{2} * O(1)$$

$$= O(n)$$

Cosmos

- * Deleting 1st min. element $\rightarrow \log_2 n$
- * Deleting 2nd min. element $\rightarrow 2\log_2 n$
- * Deleting 3rd min. element $\rightarrow 3\log_2 n$ V Imp
- * Deleting n^{th} min. element $\rightarrow O(n)$ because n^{th} min. element = max. element.
because max. element is in last level,
so to find max. element at last level, it will take $O(n)$ time.

Heapsort

- 1) $O(n)$ time to make the min. heap.
- 2) Deleting the i^{th} min. element from min. heap : - $O(\log_2 n)$, this is element is

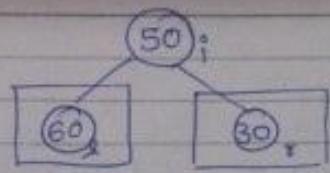
answering :-

- 1) Create min. heap Using Build heap : - $O(n)$
- 2) Delete the elements one by one & store from right hand side of original array
each deletion takes $O(\log_2 n)$ & storing at right hand side takes $O(n)$ time,
So to delete n^{th} elements & storing them at right hand side : $O(n\log_2 n)$

$$\text{Complexity} : - O(n) + O(n\log_2 n) \\ = [O(n\log_2 n)]$$

Min. heap will give descending order \rightarrow In-place sorting.
Max. heap " " " ascending " "

Cosmos

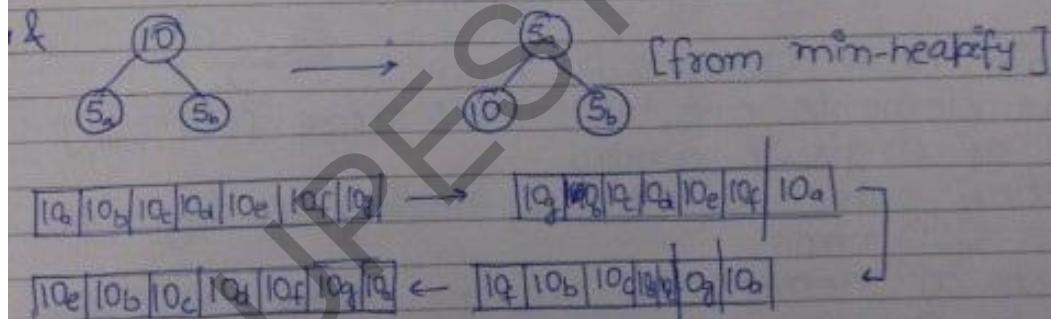
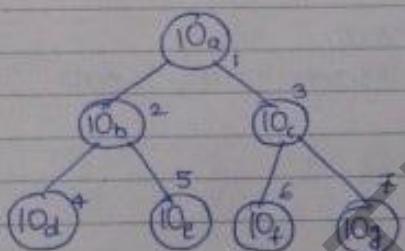


Min-heapify(i)

```
{
    min = i;
    l = 2 * i;
    r = (2 * i) + 1;
    if (a[min] > a[l])
        min = l;
    if (a[min] > a[r])
        min = r;
    swap(a[i], a[min]);
}
```

$10_a \ 10_b \ 10_c \ 10_d \ 10_e \ 10_f \ 10_g$
construct min-heap:-

using min-heapify:-
there will be no swaps.



Heapsort is not stable sorting technique as the ordering of similar elements changes.

Heapsort & Quicksort are not stable, rest others are stable.

All sorting techniques are in-place except Merge-Sort.

Cosmos

(Conclusion :-

- ① Min heapify :- $O(\log_2 n)$, $\Omega(1)$
- ② Build-heap :- $\Theta(n)$
- ③ Finding min :- $O(1)$
- ④ Deleting min :- $O(\log_2 n)$
- ⑤ Deleting 5th min. :- $5 \log_2 n$:- $O(\log_2 n)$
- ⑥ Finding 5th min. :- Deleting upto 4th min. :- $4 \log_2 n$:- $O(\log_2 n)$
- ⑦ Deleting nth min. :- Deleting max. element :- $O(n)$
max. element is in last level, & hence taking only last level & finding max. element from it & deleting it will take $\frac{n}{2}$ which is $O(n)$.

Greedy Technique (V.V.Imp.)

i/p :- Most of the problems in Greedy contain n-i/b's & our goal is finding subset which will optimize our objective.

Basics :-

- ① Solution Space :- all possible solutions [for given n-i/b all possible soln. (may or may not be correct) is called soln space]
- ② Feasible Solution
- ③ Optimal Solution

- Feasible :- It is one of the soln from soln. space which will satisfy our condition.
- Optimal :- It is one of the feasible soln. which optimizes our goal.

* e.g. if we have a class of 200 students & we want to find out top 10 students.

Solution Space :- ${}^{200}C_{10}$:- all combinations of 10 students.

Feasible Solution :- all that combinations of 10 students which satisfy the objective, i.e. whose avg. is greater than a specified value.

Optimal soln. :- that combination of 10 students from feasible soln. whose marks are greater than rest other combinations.

* To find top 10 students from 200 students, then create min-heap with 200 elements & delete first 10 elements which will take $O(n)$ time + $O(n \log_2 n)$ time. $\therefore O(n) + O(n \log_2 n) = [O(n)]$

Control abstraction of Greedy

Greedy Technique(a, n) \rightarrow array of n -elements
if solution = \emptyset // no soln. in the beginning
for ($i=1$; $i \leq n$; $i++$)
 $x = \text{select}(n)$ // finding the feasible solutions
 if ($\text{Feasible}(x)$) // checking for feasible soln.
 add(x , solution);
 \vdots

Time complexity depends upon :-

- Select(n)
- Feasible(x)
- add(x , solution)

Best Case:- $\Omega(n)$ [When all three fn. take $O(1)$ time]

e.g. example :- Select(n) $\rightarrow n$
 feasible(x) $\rightarrow n^2$
 add(x , solution) $\rightarrow n^4$

∴ complexity :- $[O(n^5)]$ (because of for loop.)

Cosmos

★★ Q. The time complexity of Greedy Technique. -

- (a) $O(n)$ (b) $O(n^2)$ (c) $O(n^3)$ (d) $O(n^4)$

→ though we can't say anything about the complexity of the functions, so it may even be $O(n^{100})$ but from the available option (d) is the most appropriate option.

Applications Of Greedy :-

- ① Job Sequencing with Deadline
- ② Knapsack problem
- ③ Huffman coding
- ④ Optimal Merge pattern
- ⑤ Minimum Cost Spanning Tree
 - (i) Prim's
 - (ii) Kruskal's

Cosmos

⑥ Single Source Shortest Path

(i) Dijkstra's

(ii) Bellman-Ford

Job Sequencing with Deadline

① Single-CPU :- at a time only single job is executing

② Interleaving is not allowed (Round-Robin is not possible).

③ Arrival times of all jobs are same (FCFS is not possible)

④ 1-unit of running time for every job. (SJF is not possible).

	J ₁	J ₂	J ₃	J ₄	
Deadline	2	1	2	1	$\{J_2, J_4\} \rightarrow 125$
Profit	50	75	45	80	$\{J_2, J_3\} \rightarrow 120$ $\{J_4, J_3\} \rightarrow 130$ $\{J_4, J_2\} \rightarrow 125$

$(J_4 \rightarrow J_2) \rightarrow \text{Optimal}$
Solv.

Solv Space:-

$J_1, J_2, J_2, J_1, J_3, J_1, J_4, J_1$
 $J_1, J_3, J_2, J_3, J_3, J_2, J_4, J_3$
 $J_1, J_4, J_2, J_4, J_3, J_4, J_3, J_2$
 $J_1, J_2, J_3, 3 \text{ jobs} \rightarrow P_3 = 3! = 6!$
 $J_1, J_2, J_4, 4 \text{ jobs} \rightarrow P_4 = 4! = 24$

$\{J_1, J_3\} \rightarrow 95$
 $\{J_3, J_1\} \rightarrow 95$
 $\{J_2\} \rightarrow 50$
 $\{J_2\} \rightarrow 75$
 $\{J_3\} \rightarrow 45$
 $\{J_4\} \rightarrow 80$
 $\{ \} \rightarrow 0$

$$\begin{aligned}\text{Solv. Space} &:= 17 + 2 \times 4! \\ &= 17 + 48 \\ &= 65\end{aligned}$$

Optimal Soln. :-

J_2, J_1
 J_2, J_3
 J_4, J_1
 J_4, J_3
 J_1, J_3
 J_3, J_1

Objective:-

Complete as many
jobs as possible in
the deadline.

Cosmos

To calculate Optimal Soln. directly :-

1	2
J ₄	J ₁

Step (i) :-

jobs that can be done
in 2nd month

(J₁ & J₂), we take J₁ for max. profit

Step (ii) :-

jobs that can be done
in 1st month

All jobs can be done in
1st month, but J₁ is done in slot 2.

So, only J₂, J₃, J₄ are in competition,

J₄ is giving max. profit

Jobs	J ₁	J ₂	J ₃	J ₄	J ₅	J ₆	n = 6
Profits	24	18	22	10	12	30	
Deadlines	5	3	3	2	4	2	

J ₆	J ₅	J ₃	J ₅	J ₁
1	2	3	4	5

Start from
this side.

n=5

Jobs	J ₁	J ₂	J ₃	J ₄	J ₅
Profits:	10	20	30	15	5
Deadlines:	3	3	3	4	4

J ₁	J ₂	J ₃	J ₅
1	2	3	4

Profit = 125

Start from
this side

(i) :- Sort all the jobs in decreasing order of profit.

J ₅	J ₁	J ₃	J ₁	J ₄
80	20	15	10	5
3	3	3	3	4

J ₁	J ₃	J ₂	J ₅
1	2	3	4

Cosmos

Q. $n=9$

Jobs	J_1	J_2	J_3	J_4	J_5	J_6	J_7	J_8	J_9
Profits	15	20	30	18	18	10	20	16	25
Deadlines	7	2	5	3	4	5	2	7	3

Sort acc. to profits

Jobs	J_3	J_9	J_7	J_2	J_4	J_5	J_8	J_1	J_6
Profits	30	25	23	20	18	18	16	15	10
Deadlines	5	3	2	2	3	4	7	7	5

$\overset{w}{\underset{2}{\boxed{J_2 \ J_7 \ J_9 \ J_5 \ J_3 \ J_1 \ J_8}}}$ $\downarrow \quad 2 \quad 3 \quad 4 \quad 5 \quad 6 \quad 7$	Profit: 147 $J_4 \ \& \ J_6$ are left out
--	--

Algorithm

- Sort all jobs in decreasing order of profits $\rightarrow O(n \log n)$
- Find maximum deadline in the array of n -deadline & take array of that size, & Start from RHS $\rightarrow O(n)$
- For every slot no. 'i', apply linear search to find job which contain deadline $\geq i$ $\rightarrow O(n^2)$

Knapsack Problem :-

problem :- $\sum_{i=1}^n w_i = 7 \text{ M}$

M :- weight that knapsack can hold

w_i :- weight of i th object.

Feasible Soln. :- $\sum_{i=1}^n x_i w_i \leq M$

* (Fractions are allowed in Greedy.)

Optimal Soln. :- $\sum_{i=1}^n x_i p_i$ is maximum.

* When fractions are not allowed, it is solved by Dynamic programming.

now,

$n=3 \quad M=20$

Objects	Ob_1	Ob_2	Ob_3
Profits	25	24	15
Weights	18	15	10

Optimal Soln. :- $\frac{18 \times 25 + 2 \times 15}{18} = 25 + 3 \cdot 2 = 28 \cdot 2$

My answer

★ All 3 are feasible solutions.

D) Greedy About Profit:-

$$(\frac{1}{1} \times 25 + \frac{2}{15} \times 24 + 0 \times 10)$$

$$= 25 + 3.2 = 28.2$$

D) Greedy About Weight :-

Take less weight Object 1st :-

$$(0, \frac{10}{15}, 1) \quad \boxed{\frac{10}{15}}^{10}$$

• Take 3rd object 1st

• Now, out of 1st & 2nd object, 2nd object has less weight.

$$\text{Profit :- } 0 \times 25 + \frac{2}{15} \times 24 + 1 \times 10$$

$$= 16 + 15 = 31$$

Greedy About Both Profit & weight :- (Sir's answer)

Obj 1 :- 18 weight \rightarrow 25 profit

$$1 \quad " \quad \rightarrow \frac{25}{18} = 1.3$$

Obj 2 :- 15 weight \rightarrow 24 profit take obj 2 first,
1 " $\rightarrow \frac{24}{15} = 1.6$ then obj 3 & then
Obj 1.

Obj 3 :- 10 weight \rightarrow 15 profit
1 " $\rightarrow 1.5$ "

$$(1, \frac{1}{1}, \frac{5}{10})$$

$$\text{Profit} = 0 \times 25 + 24 \times 1 + 15 \times \frac{1}{2} = 24 + 7.5 = 31.5$$

Greedy Knapsack will give Optimal soln. always by giving priority to both profit & weight

Cosmos

Q. n=5

Objects Ob1 Ob2 Ob3 Ob4 Ob5 ✓

Profits 5 2 2 4 5

Weights 5 4 6 2 1

M = 12

Ob1 :- 5 weight → 5 profit

1 " → 1 "

Ob2 :- 4 weight → 4 "

1 " → 0.5 "

Ob5 → 5

~~11~~

Ob4 → 4

~~9~~

Ob3 → 5

~~4~~

Ob2 → 2

~~0~~

16

Ob4 :- 4 " → 4 "

1 " → ~~0.5~~ "

Ob5 :- 1 " → 5 "

Objects → (1, 1, 0, 1, 1)

Profit = 16

Q. n=7

M = 15

Objects Ob1 Ob2 Ob3 Ob4 Ob5 Ob6 Ob7

Profits 10 5 15 7 6 18 3

Weights 2 3 5 7 1 4 1

Profit:Weights 5 1.6 3 1 6 4.5 3

✓ ✓ ✓ ✓ ✓ ✓ ✓

~~15~~

Objects → (1, $\frac{2}{3}$, $\frac{1}{5}$, $\frac{0}{7}$, $\frac{1}{6}$, $\frac{1}{4}$, $\frac{1}{3}$)

~~44~~

12

~~8~~

Profit = $10 + \frac{2}{3} \times 5 + 15 + 6 + 18 + 3$

~~7~~

= $52 + 3.2$

~~2~~

= 55.2

~~10~~

~~3.~~

Algorithm

for ($i=1$ to n)
 job[i] = p_i/w_i ; → $O(n)$ p: profits
 Sort job array in decreasing order of p_i/w_i . → $O(n \log n)$

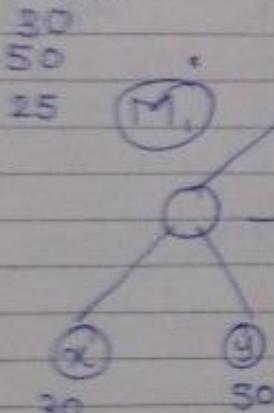
Cosmos

Take one by one object until capacity of knapsack becomes zero. $\rightarrow O(n)$

$$\therefore \text{Time complexity} = O(n) + O(n \log_2 n) + O(n) \\ = O(n \log_2 n)$$

Optimal Merge Pattern

Ex 128

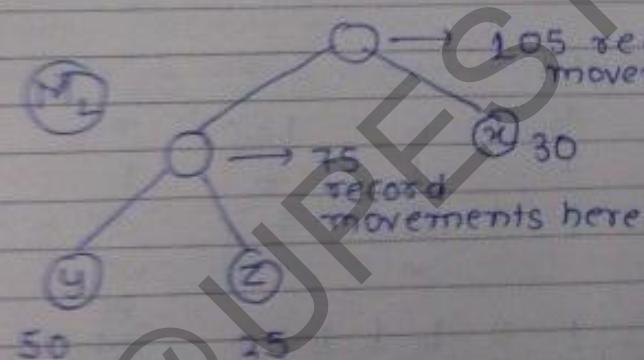


→ 105 record movements here

→ 80 record movements here

total record movements =

$$80 + 105 = 185 \text{ record movements}$$



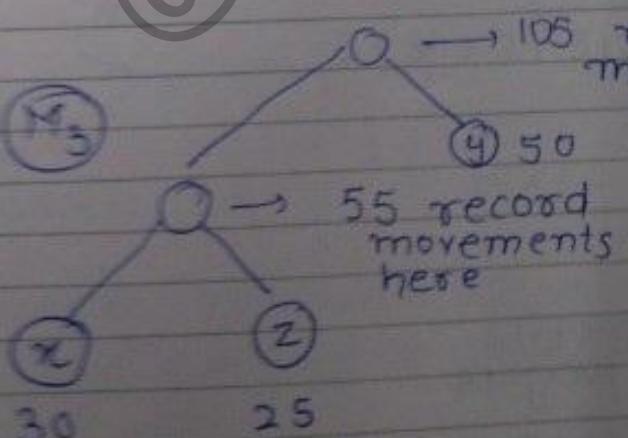
→ 105 record movements here

→ 75 record movements here

∴ total record movements = 75 + 105

$$= 180$$

record movements



→ 105 record movements here

→ 55 record movements here

∴ total record movements = 55 + 105

$$= 160$$

record movements

Cosmos

For the given problem, there are 3 merge patterns, M_1, M_2, M_3 , in all of them M_3 is optimal merge pattern because it is taking least record movements.

the Min. no. of record movements required to merge 5 files

$$A \rightarrow 10$$

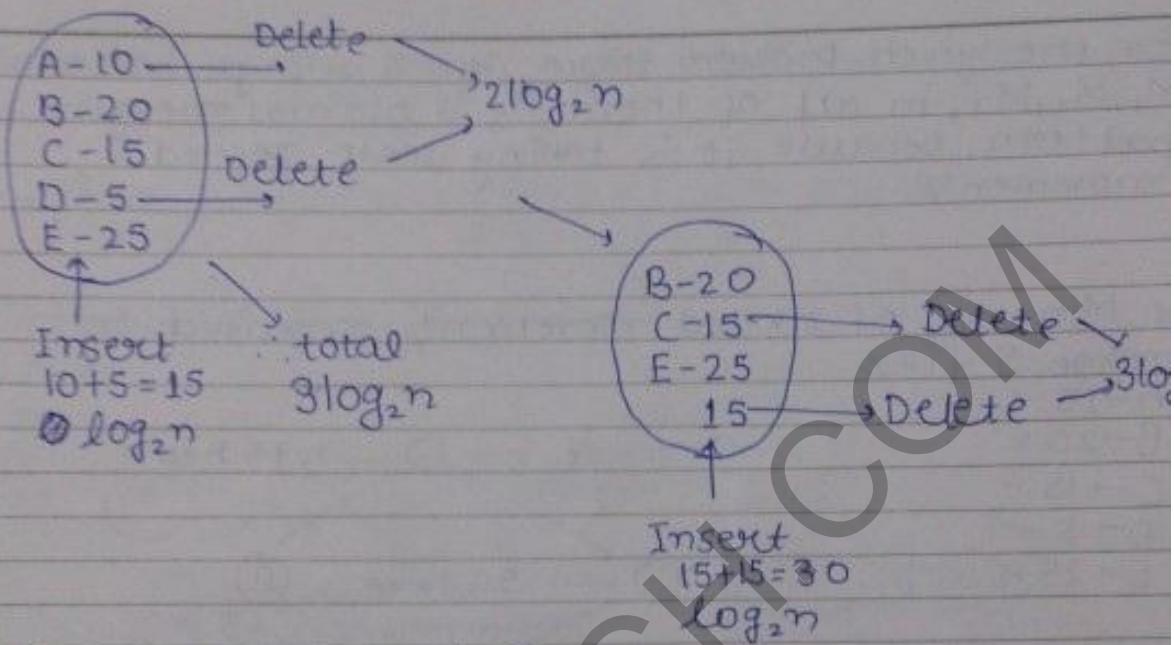
$$B \rightarrow 20$$

$$C \rightarrow 15$$

$$D \rightarrow 5$$

$$E \rightarrow 25$$

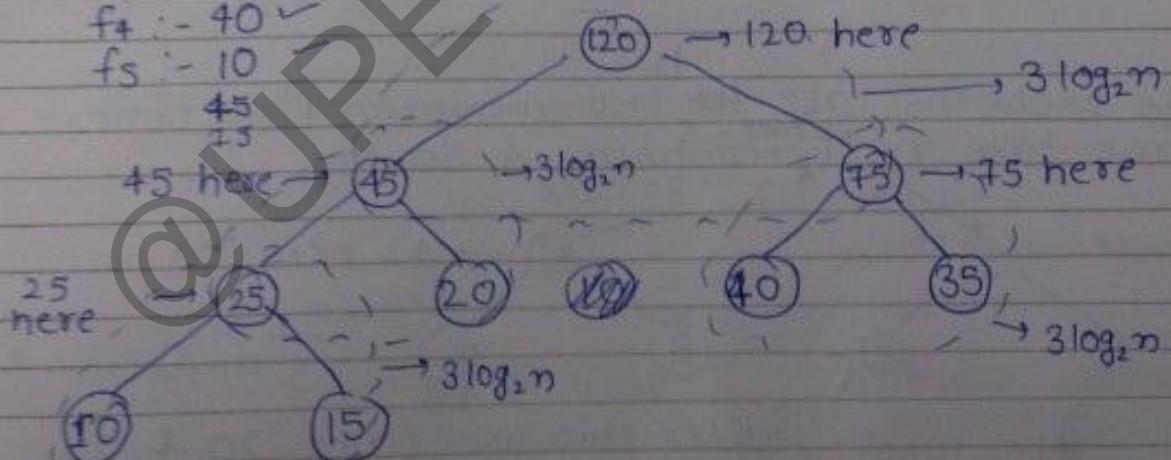
Cosmos



This will repeat $(n-1)$ times.

$$\text{Complexity} : \cancel{3(n-1) \log_2 n} = O(n \log_2 n)$$

- Q. $f_1 :- 35$ ✓
 $f_2 :- 15$ ✓
 $f_3 :- 20$ ✓
 $f_4 :- 40$ ✓
 $f_5 :- 10$ ✓
 45
 25



$$\text{total record movements} = 265$$

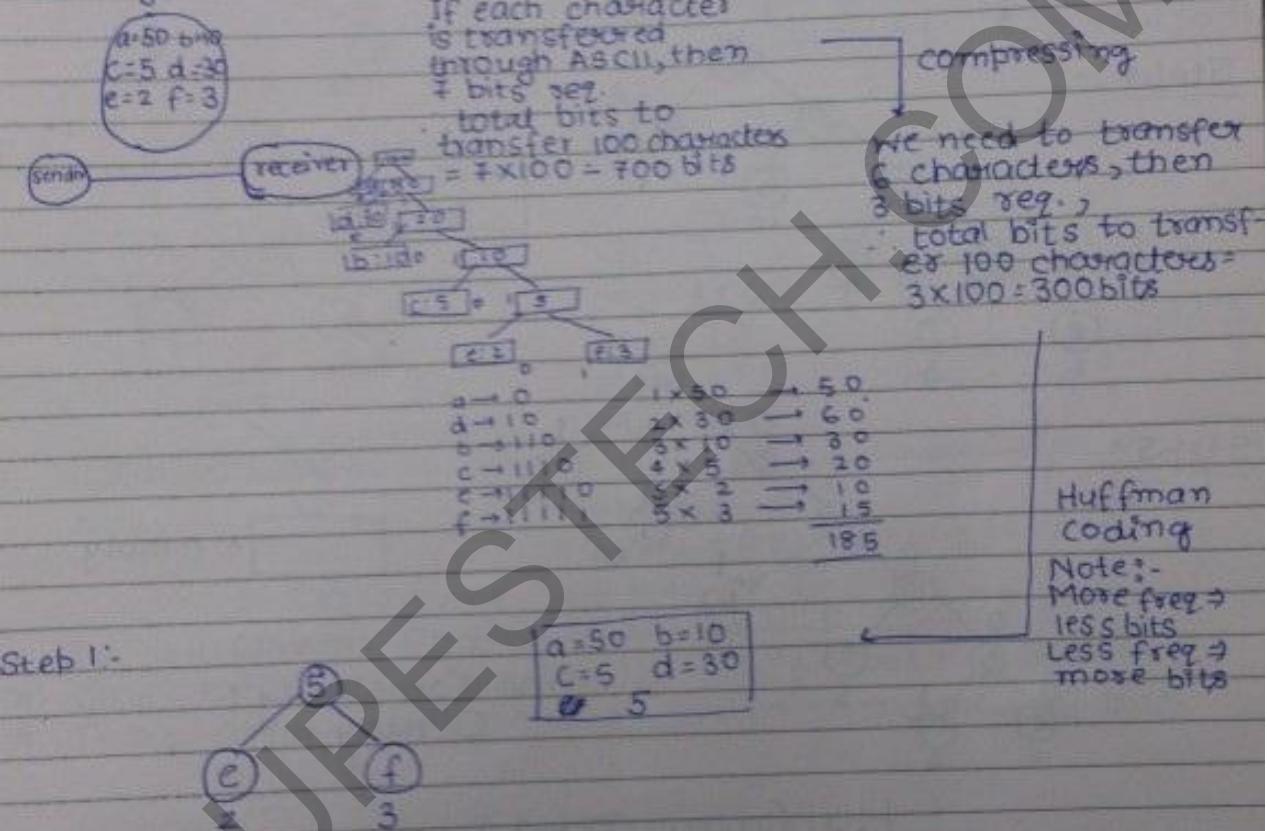
Cosmos

Huffman Coding. (Huffman coding is best technique because it is application of greedy & hence it gives best optimal solution).

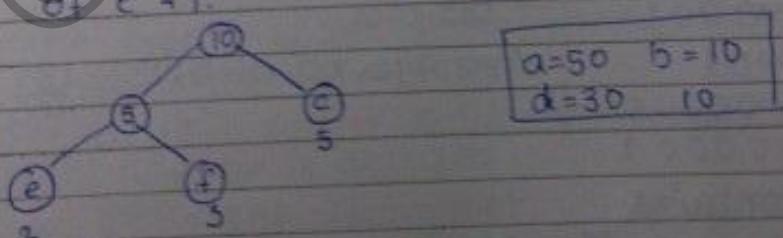
① Data Encoding

② Data Compression

Message contains 100 characters

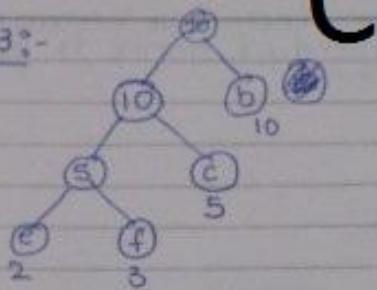


Step 2 - Now 2 minimums are c=5 & 5 from summation of e & f.



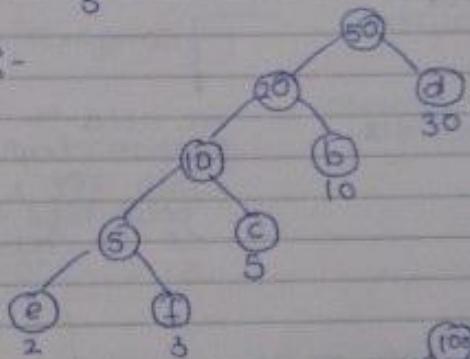
Cosmos

Step 3 :-



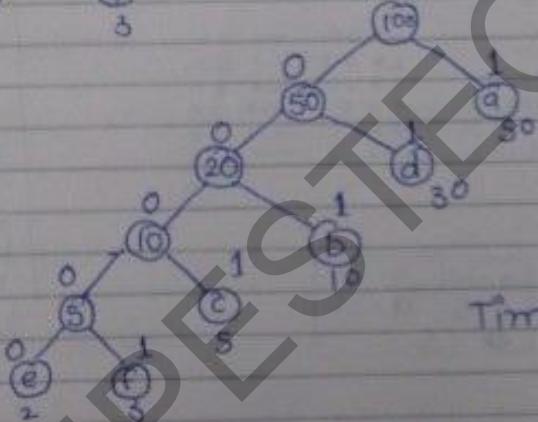
a = 50
d = 30
20

Step 4 :-



a = 50
50

Step 5 :-



empty

Time Complexity :-
 $O(n \log n)$

Huffman coded Tree

a → 1	{ b → 001 c → 0001 d → 01 e → 00000 f → 00001	} → 185 bits Average no. of bits = $\frac{185}{100} = 1.85$
-------	--	--

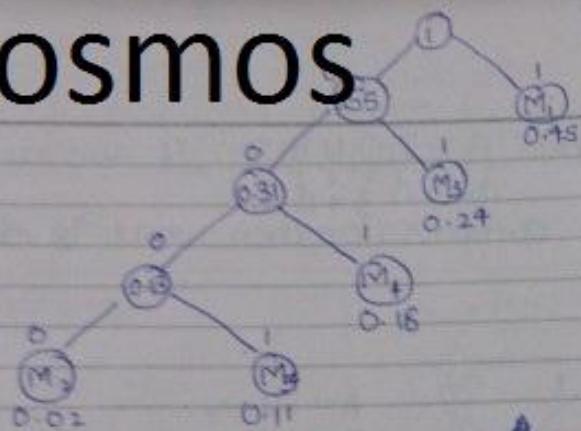
Q. Message M contains
 $M = (M_1, M_2, M_3, M_4, M_5)$

$$M = (M_1, M_2, M_3, M_4, M_5)$$

$$\begin{matrix} \downarrow & \downarrow & \downarrow & \downarrow & \downarrow \\ 0.45 & 0.02 & 0.24 & 0.98 & 0.11 \end{matrix}$$

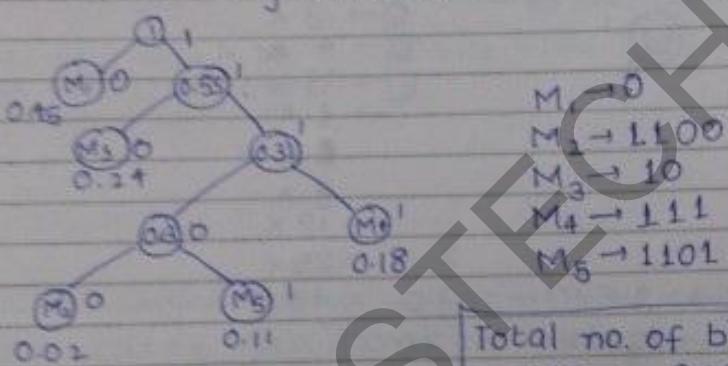
Cosmos

V



$$\begin{aligned}
 M_1 &\rightarrow 1 & \rightarrow 1 \times 0.45 = 0.45 \\
 M_2 &\rightarrow 0000 & \rightarrow 4 \times 0.02 = 0.08 \\
 M_3 &\rightarrow 01 & \rightarrow 2 \times 0.24 = 0.48 \\
 M_4 &\rightarrow 001 & \rightarrow 3 \times 0.18 = 0.54 \\
 M_5 &\rightarrow 0001 & \rightarrow 4 \times 0.11 = 0.44
 \end{aligned}$$

↑ My answer



★ Put smaller no. on left hand side & bigger no. on right hand side.

Total no. of bits =

$$0.45 \times 1 + 0.02 \times 4 + 2 \times 0.24 + 3 \times 0.18 +$$

$$0.11 \times 4 = 1.99 \text{ bits}$$

$$\text{Avg. no. of bits} = 1.99 \text{ bits}$$

In Huffman Coding

- ★ One message will contain 1 bit (but not always)
- ★ There are two messages with same no. of bits.

Q Decode the msg encoded message:-

101100110111100110010111101

Step 1: See the tree & start from root.

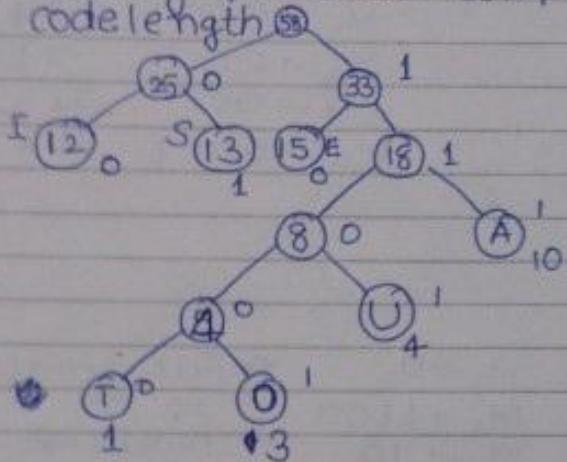
1 → go right from root

10 → go left from 0.55 & we reach leaf,
M₃ msg is detected.

1 → go right from root

Cosmos

A file contains characters A, E, I, O, U, S, T, if we use Huffman coding for data compression, then what is the avg. code length?



A → 10	×
E → 15	×
I → 12	×
O → 3	×
U → 4	xx
S → 13	×
T → 1	×
	54
	8
	18
	2
	25

$$A \rightarrow 111 \rightarrow 3 \times 10 = 30 \quad 33 \times$$

~~$$B \rightarrow E \rightarrow 10 \rightarrow 2 \times 15 = 30$$~~

$$I \rightarrow 00 \rightarrow 2 \times 12 = 24$$

$$O \rightarrow 11001 \rightarrow 3 \times 5 = 15$$

$$U \rightarrow 1101 \rightarrow 4 \times 4 = 16$$

$$S \rightarrow 01 \rightarrow 2 \times 13 = 26$$

$$T \rightarrow 11000 \rightarrow 5 \times 1 = 5$$

146 → total bits

$$\text{Avg. codelength} = \frac{146}{58}$$

Q. If $f(n) = O(g(n))$

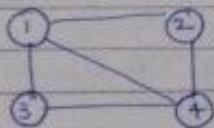
T/F?

- $\log(f(n)) = O(\log(g(n))) \checkmark$
- $2^{f(n)} = O(2^{g(n)}) \times \rightarrow \text{take } f(n) = 2^{g(n)}$
- $f(n) = O(f(g(n))) \times \rightarrow \text{take } f(n) = 2^n$
- $f(n) = O(f(g(n)))^2 \times \rightarrow \text{take } f(n) = \frac{1}{n}$

Minimum Cost Spanning Tree

$G(V, E)$

Simple Graph



① No self loop.

② No parallel edges

$f(n) = O(g(n))$

$$n^2 < n^3$$

$$n^2 = O(n^3)$$

$2\log n = \Theta(3\log n)$
(apply log on both sides)

$$n! = O(n^n)$$

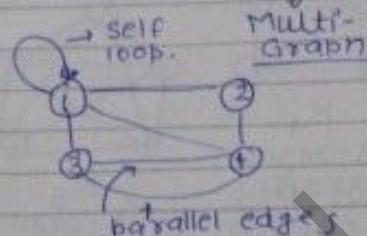
$$\log n! = O(n \log n)$$

$$k \cdot n^3 = \Omega(n^2)$$

$$3\log n = \Theta(2\log n)$$

* Sometimes they becomes equal on application of log on both sides.

Multi-Graph



① Self loops or parallel edges

② Parallel edges

Cosmos

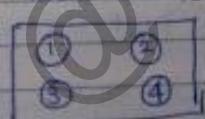
* In a simple graph with 'n' vertices, then at max each vertex can have $(n-1)$ degree.

* In multigraph with 'n' vertices, then at max each vertex can have infinite degree.

Types Of Simple Graphs :-

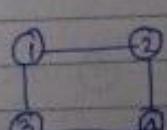
* All null graphs are regular graphs but all regular graphs are not null graphs.

1. Null Graphs



if the degree of every vertex is zero, then it is null graph.

2. Regular Graph \rightarrow no. of edges = $\frac{n \times m}{2} \rightarrow$ degree of each vertex



if the degree of every vertex is same, then it is regular graph.

$$\begin{aligned} n &= 4 \\ m &= 2 \end{aligned} \therefore \text{no. of edges} = \frac{4 \times 2}{2} = 4$$

$$\begin{aligned} n &= 4 \\ m &= 3 \end{aligned} \therefore \text{no. of edges} = \frac{4 \times 3}{2} = 6$$

Cosmos

All complete graphs are regular but all regular graphs are not complete

Complete Graph:

If each vertex is connected to all other vertices, then it is called complete graph.



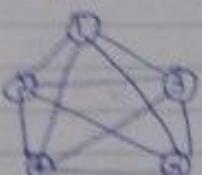
K_3
(2-regular
graph)

$$\frac{3 \times 2}{2} = 3$$



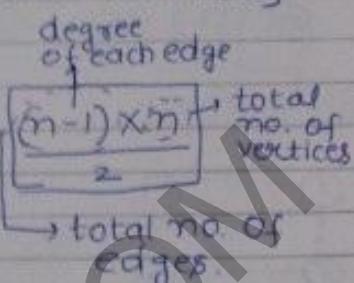
K_4
(3-regular
graph)

$$\frac{4 \times 3}{2} = 6$$



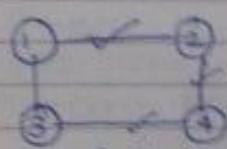
K_5
(4-regular
graph)

$$\frac{5 \times 4}{2} = 10$$



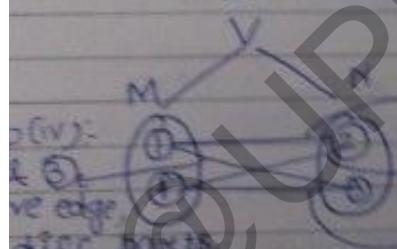
Maximal Graph

Bipartite Graph



$$V = \{1, 2, 3, 4\}$$

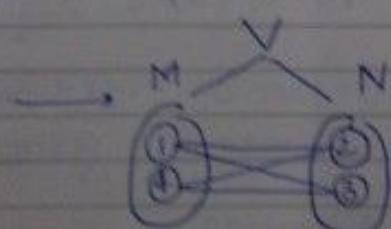
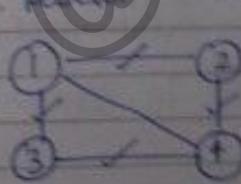
divide the vertices into $M \& N$ & all the edges must be b/w $M \& N$ only & not within M only or N only.



Step(i): (1) & (2) have edge x . put them in $M \& N$ set/s

Step(ii): (3) & (1) edge, \therefore different parts

Step(iii): (3) & (4) edge, \therefore "

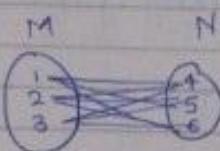


But (1) - (4) not possible, it is not bipartite graph.

* **Connected Graph :-**

In a graph each vert there is a path b/w every pair of vertices. Min. no. of edges = $V-1$ [V: no. of vertices.]

Complete Bipartite



each element in
every element in M is adjacent to N,
so it is complete bipartite graph

$G(V, E)$

Cosmos

$$|E| \leq \frac{V(V-1)}{2}$$

[in simple graph]

but possible for multigraphs too

$$\star \text{PR } |E| = O(V^2)$$

apply log on both sides:

$$\log E = O(2 \log V)$$

$$\log E = O(C \log V)$$

$E \log E \rightarrow E \log V$ (from this)

No. of graphs

$n=2$ ① ② ③ ④

no. of graphs = 2

$n=3$ ①

② ③

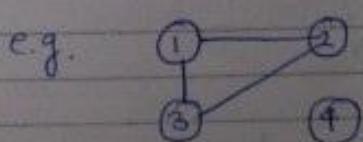
no. of graphs = $2^{n(n-1)/2}$

Star no. of graphs with
'n' vertices = $2^{\frac{n(n-1)}{2}}$

Spanning Tree :-

A connected subgraph H of a given Graph $G(V, E)$ is said to be spanning tree iff

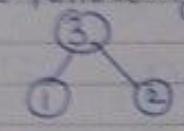
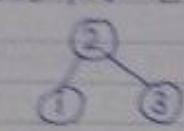
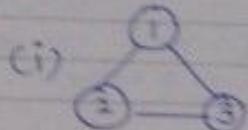
- # ① It should contain all vertices of G.
- ② Edge H should contain $(V-1)$ edges if G contains V vertices.



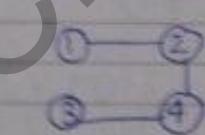
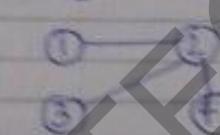
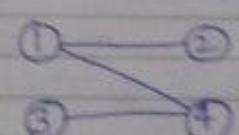
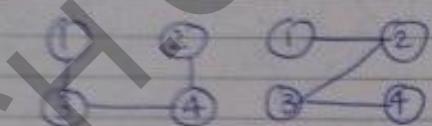
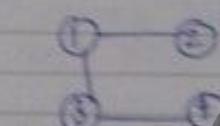
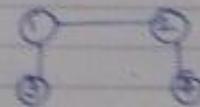
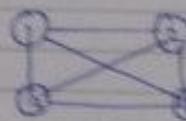
e.g. it contains all vertices & contains $(V-1)$ edges, so it should be spanning tree, but it is not connected subgraph.

Cosmos

Q. Find no. of spanning trees for the following graph:-



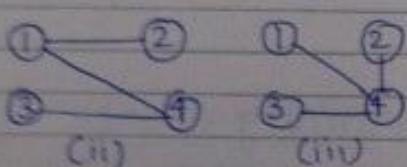
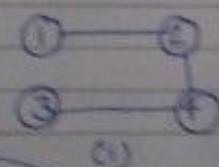
(ii)



→ total = 16

* The no. of spanning trees in a 'n'-vertex complete graph = m^{n-2} .

Q. Find no. of spanning trees:- [when graph is not complete]



Kirchhoff Theorem

① Make Adjacency Matrix

$$M = \begin{bmatrix} 1 & 2 & 3 & 4 \\ 1 & 0 & 1 & 0 & 1 \\ 2 & 0 & 0 & 1 & 1 \\ 3 & 0 & 0 & 0 & 1 \\ 4 & 1 & 1 & 1 & 0 \end{bmatrix}$$

Graph.

$\boxed{O(n^2)}$

② (i) replace all non-diagonal ones by -1.

(ii) replace all diagonal zeros by its equal degree.

Cosmos

$$M = \begin{bmatrix} 1 & 2 & 3 & 4 \\ 2 & -1 & 0 & -1 \\ 3 & -1 & 2 & 0 & -1 \\ 4 & 0 & 0 & 1 & -1 \\ 5 & -1 & -1 & -1 & 1 \end{bmatrix}$$

③ Co-factors of any element will give no. of spanning trees.

$$C_{11} = \begin{vmatrix} 2 & 0 & -1 \\ 0 & 1 & -1 \\ -1 & -1 & 3 \end{vmatrix} = 2(3-1) - 1(1) \\ = 2 \times 2 - 1 = 3$$

Q Find no. of spanning trees for following graph:-



Step (i) :- Adjacency Matrix

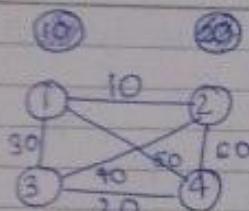
$$M = \begin{bmatrix} 0 & 1 & 1 & 1 \\ 1 & 0 & 1 & 1 \\ 1 & 1 & 0 & 1 \\ 1 & 1 & 1 & 0 \end{bmatrix}$$

Step (ii) :-

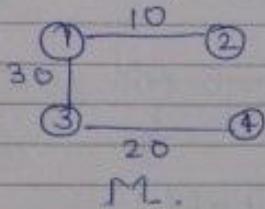
$$M = \begin{bmatrix} 3 & -1 & -1 & -1 \\ -1 & 3 & -1 & -1 \\ -1 & -1 & 3 & -1 \\ -1 & -1 & -1 & 3 \end{bmatrix}$$

$$C_{11} = \begin{vmatrix} 3 & -1 & -1 \\ -1 & 3 & -1 \\ -1 & -1 & 3 \end{vmatrix} = 3(9-1) + 1(-3-1) - 1(1+3) \\ = 24 - 4 - 4 \\ = 16$$

Minimum Cost Spanning Tree
① Covering all vertices of the graph with min. cost of the tree edges.



for the graph 16 spanning trees are possible,
in all of them M is the min. cost spanning tree.



Cosmos

To find out Min. Cost Spanning tree, we have 2 algorithms:-

- 1) Krushkal
- 2) Prim's

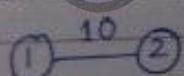
Krushkal :-

Step(i) :- Take 1st min.

edge weight	starting pt.	ending pt.
10	1	2
20	3	4
30	1	3
40	3	2
50	1	4
60	2	4
70	3	5
80	4	5

Now, make a min heap for all the edges,
so no. of edges = E, \therefore time complexity = $O(E)$.

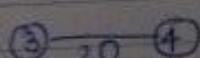
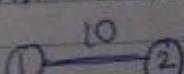
Now take 1st min. (Delete it from heap).



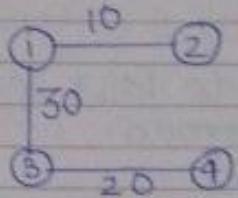
Deletion from heap :- $O(\log_2 n)$

but $n = E \therefore O(\log_2 E)$

Step(ii) :- Take 2nd next min.

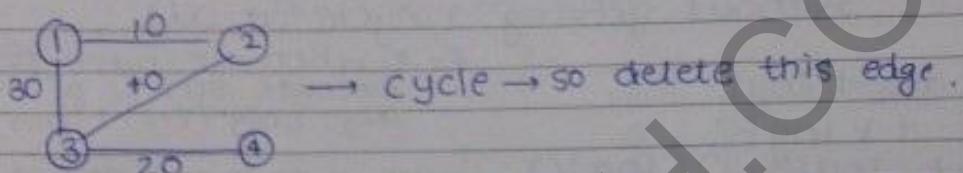


- In best case we will get min. cost spanning tree when 1st $(V-1)$ edges do not make any cycle.
 $\therefore (V-1) \text{ times } \log_2 E + O(CE) = (V-1) \log_2 E + O(CE)$
 $= O(V \log_2 E + O(CE))$
- take next min. :- (this also takes $\log_2 E$)

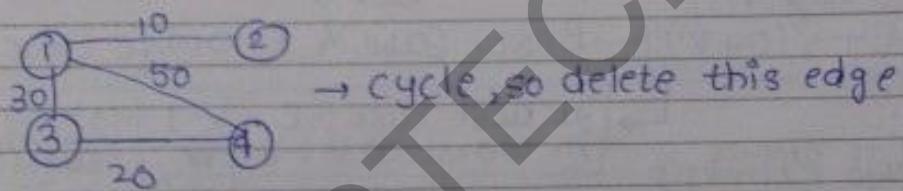


Cosmos

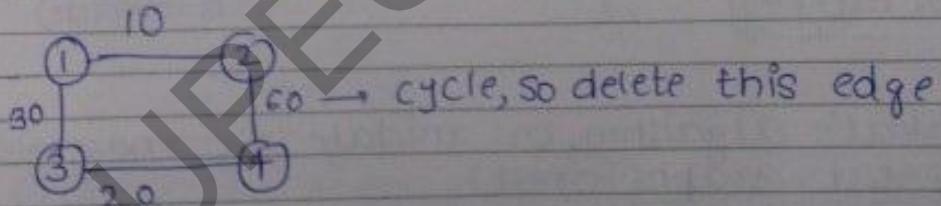
- take next min. :- (this also takes $\log_2 E$)



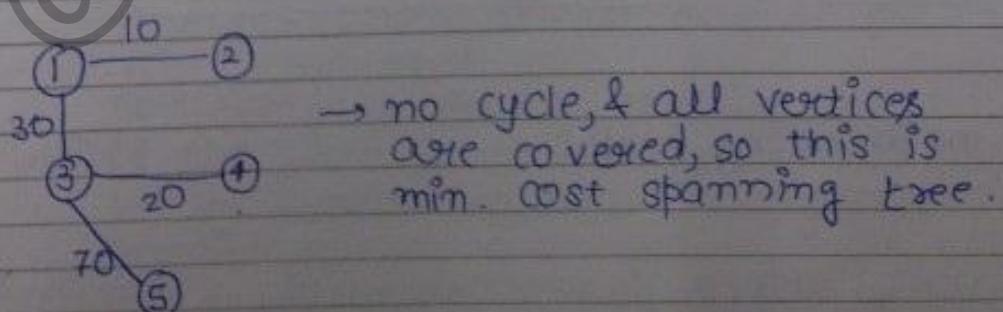
- take next min. :- (this also takes $\log_2 E$ from min. heap)



- take next min. :-



- take next min. :-



Cosmos

Algorithm:-

- ① Create Min. heap. $\rightarrow O(E) \xrightarrow{\log E}$
- ② Delete one by one min. & add to MST if no cycle formed
until $(V-1)$ edges are added to MST

Best Case:- When we get MST first $(V-1)$ times without getting a cycle at all.

$$\begin{aligned} & E + (V-1)\log E \\ & = E + V \log E \\ & \text{but } \log E = O(\log V) \\ & = E + V \log V \\ & = O(E + V \log V) \rightarrow \text{Best Case \& Average Case} \end{aligned}$$

(i.e. when we have to execute step ② of algo only $(V-1)$ times)

when graph is not dense:-
 $O(V \log V)$
when graph is dense:-
 $O(V^2)$

Worst Case:-

when we have to execute step ② of algo E times)

$$\begin{aligned} & E + E \log E \\ & = E + E \log V \\ & = O(E \log V) \end{aligned}$$

In best case :- $E = V-1$, when graph contains $(V-1)$ edges only

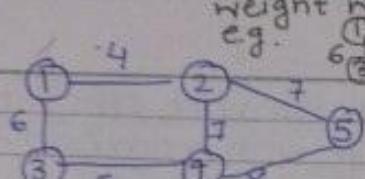
In worst case :- $E = V(V-1) = O(V^2)$

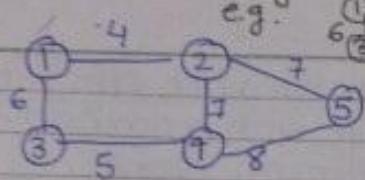
(when graph is complete)

* In Kruskal's Algorithm, in middle we may get disconnected graph(Forest), but in case of Prim's algo, we always get connected graph.

Prim's

Consider the following graph:-

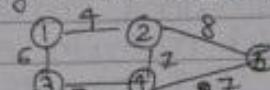
* if there are more than one MST for a given connected graph, then all the graph contain atleast one edge weight which is the edge weight of more than one edges.
 e.g.  has 2 MST's, so it must contain atleast 2 edges with same weight.

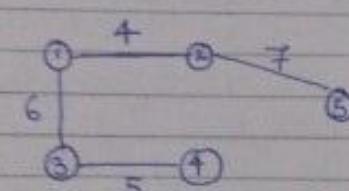


How many diff. min. cost spanning trees are possible?

* but converse is not true, i.e. if graph contains edges with same weight, then it might not have more than one MST,

Ans. Using Kruskal :-

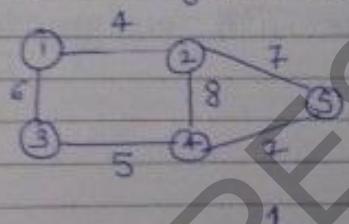
e.g.  has only one MST.



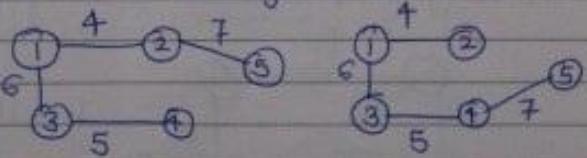
Only 1
at this stage:-

next min. is 7
which is b/w ② & ① and
② & ⑤
but ② & ④ makes a cycle, so we can't use it,
we can only use edge b/w ② & ⑤, & we stop because we have 4 edges now.

but if the graph is :-



min spanning trees are:-



If there are

★ ★ 18

Note:- For the given graph more than 1 MST may be possible.

implies that:- ② For the given graph, if there are more than one MST, then atleast one of the edge weight will be repeated.

(but converse is not true)

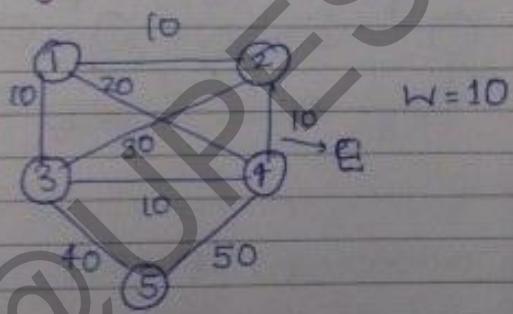
③ If the given graph is connected & no edge weight is repeated, then exactly one MST is possible.

④ There will be no MST if graph is disconnected.

Cosmos

★★ If edge weight is not given, then we assume it to be 1.

- Q. Let G be an undirected connected graph with distinct edge weights. Let e_{\max} be the edge with maximum weight & e_{\min} be the edge with minimum weight, then check following statements are T/F?
- T (a) Every MST should contain e_{\min} .
 T (b) If e_{\max} is in MST, then its removal must disconnect G .
 T (c) No MST contains e_{\max} .
 T (d) G has unique MST.
- Q. Let G be an undirected connected graph with N vertices. If ' w ' is the min. edge weight among all edge weights in G & E be a specific edge with weight ' w '. Then
- (a) E may be there in MST
 (b) If E is not in MST, then all edges ~~having~~ weight ' w ' ~~are~~ in that cycle.
 (c) Every MST should contain an edge with weight ' w '.
 (d) Every MST should contain E .



edge weight is not given, assume it to be 1.

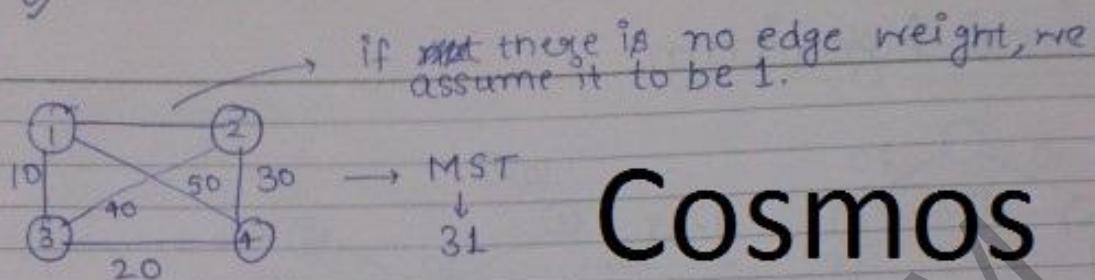
An undirected graph G has n nodes, the adjacency matrix is given by $n \times n$ square matrix. whose

- (i) Diagonal elements are zero's. \rightarrow connected
 (ii) Non-Diagonal elements are one's \rightarrow graph.
 then check :-

- a) G has no MST.
 b) G has multiple MST's with diff. costs. : multiple MST's with same cost may be possible.
 c) G has unique MST of cost $n-1$.
 d) G has multiple MST's each of cost $n-1$.

Cosmos

✓



Cosmos

Q Let T & T' be 2-spanning trees of a connected graph G . Suppose that an edge e is in T but not in T' & edge e' is in T' but not in T , then which is ~~ST~~ after performing following opⁿ on T & T' .

- (i) ~~($T - \{e\}$) U $\{e'\}$~~
(ii) $(T' - \{e'\}) U \{e\}$

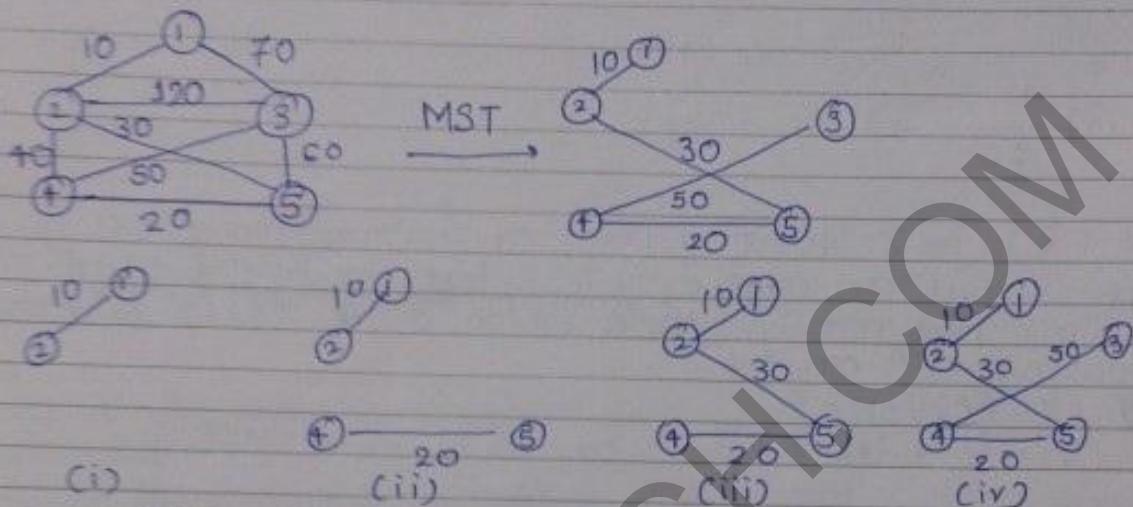
- (a) Both T & T' are ST.
(b) $T \rightarrow$ ST but not T' .
(c) $T' \rightarrow$ ST but not T .
(d) both are not ST.

My answer:- removing e from T & adding e' makes it T' & removing e' from T' & adding e makes it T .

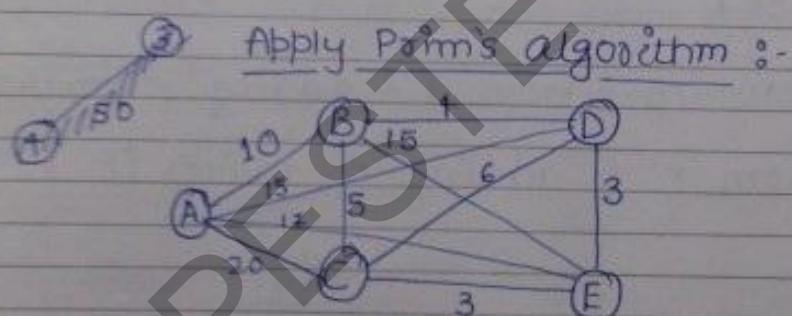
★ if the remaining edges are not same:-

Cosmos

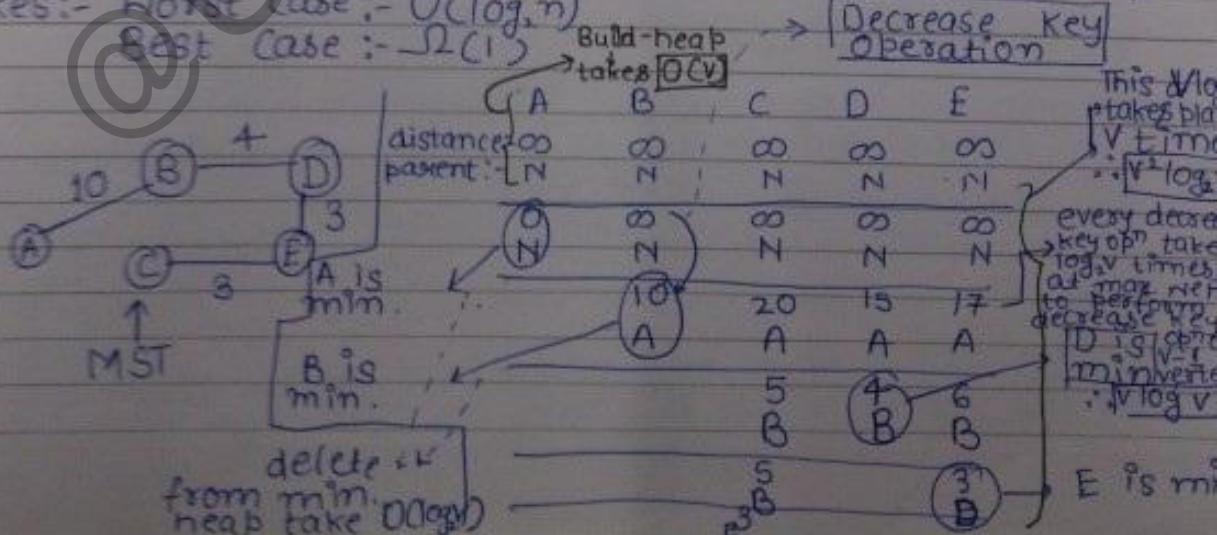
Prim's Algorithm



Using Krushkal algo



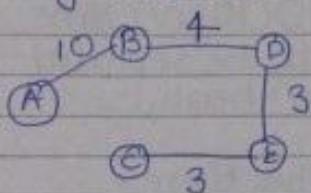
★ Decrease key & Increase key opn in min. heap & max. heap
akes:- Worst Case :- $O(Clog n)$
Best Case :- $\Omega(1)$



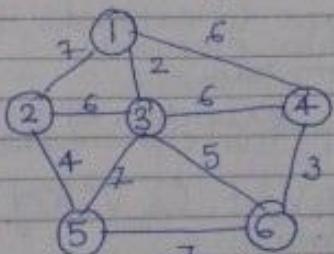
Note,

Cosmos

using Kruskal's

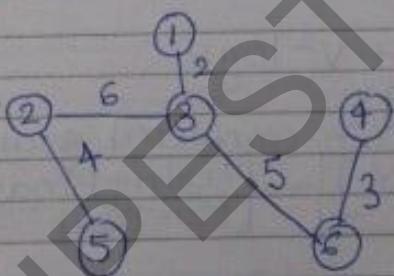


Apply Prim's algo on the following graph:-



	0	1	2	3	4	5
0	X					
1		X				
2			X			
3				X		
4					X	
5						X

parent:- N
distance:- 0



Using Prim's.

Note:-

Step (i) Build - heap of all the vertices :- takes $O(V)$ time.

(ii) Take min. out of the min-heap :- takes $O(1)$ time, rearranging heap will takes $- O(\log_2 V)$.

(iii) Now, change the distance value using decrease key opn:- one decrease key opn on one vertex takes $\log_2 V$ time.

(iv) Now, at max. in one stage all the vertices will have to undergo decrease key opn, So time taken :- $O(V \log_2 V)$.

Cosmos

(v) Now, we take out next min. from heap & have to rearrange the heap, it takes :- $O(\log V)$ time.

(vi) Now, the decrease key opⁿ have to be repeated till only one vertex is left in min-heap, ∴ the total no. of stages = V .

∴ decrease total decrease key opⁿ takes time :-

$$V \times \frac{V \log V}{2}$$

↓
 V times decrease key opⁿ decrease time complexity of decrease key opⁿ in one stage.
 My answer :- We have to extract V^2 min. elements from heap
 Extraction of next min. element from heap

$$\begin{aligned} \text{Time Complexity} &= O(V \log V) + O(V^2 \log V) + O(V) \\ &= [O(V^2 \log V)] \end{aligned}$$

Sir's answer :-

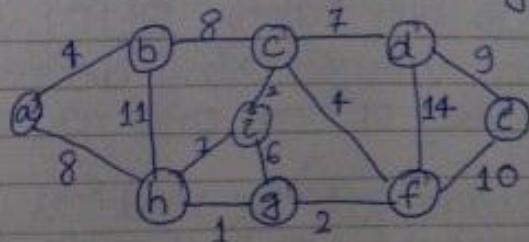
$$\begin{aligned} \text{Time Complexity} &= V + V \log V + V^2 \log V \\ &= (V + V^2) \log V \end{aligned}$$

But $V = E$ (in completed graph)

$[O((V+E) \log V)] \rightarrow$ [using Binary Min. heap.]

- Time Complexity :- $O(E + V \log V)$ [using Fibonacci min. heap.]
 $\therefore O(V+E)$ [using Binomial min. heap.]

Consider the following graph



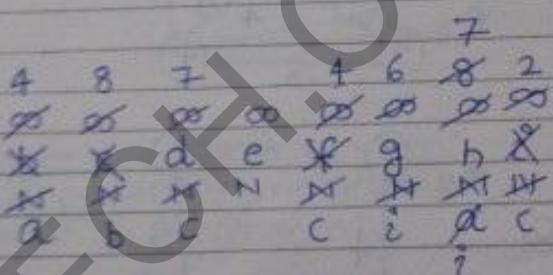
Cosmos

which one of the following sequence of edges of MST is not true using Prim's algo when the algo started from vertex a.

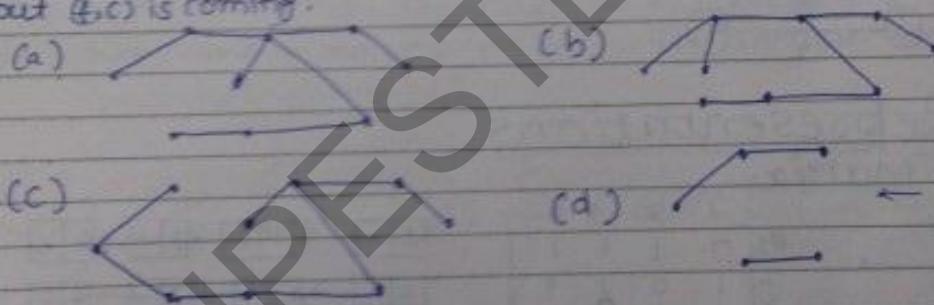
- (a) (a,b) (b,c) (c,i) (c,f) (f,g) (g,h) (c,d) (d,e)
- (b) (a,b) (b,c) (f,c) (c,i) (f,g) (g,h) (c,d) (d,e)
- (c) (a,b) (a,h) (h,g) (g,f) (f,c) (c,i) (c,d) (d,e)
- (d) (a,b) (b,c) (h,g) (f,g) (c,i) (c,f) (c,d) (d,e)

(d) is wrong

because it created unconnected graph.



(b) is wrong because using Prim's after (a,b)
edge (b,c) → (c,i) should come
but (d,c) is coming.



← This is wrong
because it created undirected graph.

(a) & (c) are correct using Prim's.

Q Consider a complete undirected graph with vertex set $V = \{0, 1, 2, 3, 4\}$

Entry w_{ij} in matrix w below is the weight of edge s_i, s_j .

$$w = \begin{bmatrix} 0 & 1 & 2 & 3 & 4 \\ 1 & 0 & 12 & 4 & 9 \\ 2 & 12 & 0 & 7 & 3 \\ 3 & 4 & 7 & 0 & 2 \\ 4 & 9 & 3 & 2 & 0 \end{bmatrix}$$

What is the cost of the MST for the above graph such that vertex 0 is a leaf node in that Spanning tree?

Cosmos

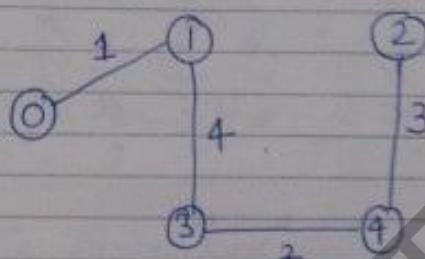
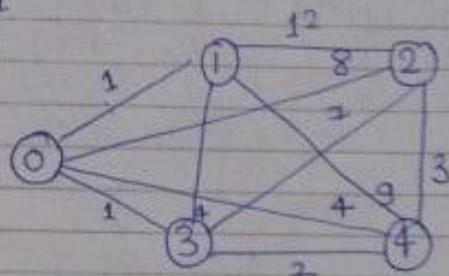
(a) 8

(b) 9

~~(c)~~ 10

(d) 11

:- My answer

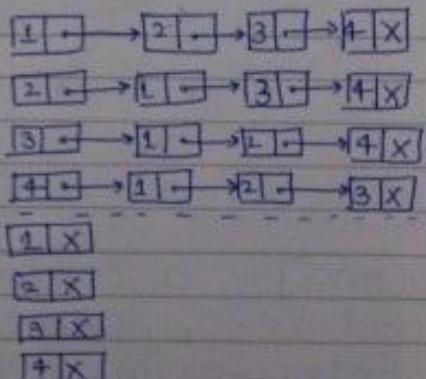


(using Kruskal's)

Graph Representations

① Adjacency Matrix

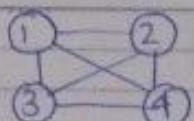
$$\begin{array}{c} \text{Graph: } \begin{array}{c} 1 \\ | \\ 2 \\ | \\ 3 \\ | \\ 4 \end{array} \xrightarrow{\text{Adjacency Matrix}} \begin{bmatrix} 0 & 1 & 1 & 1 \\ 1 & 0 & 1 & 1 \\ 1 & 1 & 0 & 1 \\ 1 & 1 & 1 & 0 \end{bmatrix} \\ \text{Vertices: } \begin{array}{c} 1 \\ | \\ 2 \\ | \\ 3 \\ | \\ 4 \end{array} \xrightarrow{\text{Adjacency Matrix}} \begin{bmatrix} 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \end{bmatrix} \end{array}$$



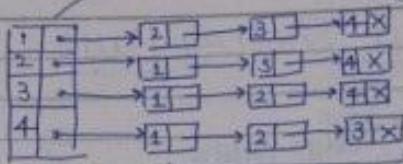
- represent graph Adjacency matrix will take $O(V^2)$ ~~always~~
- find out the degree of a vertex, it will take $O(V)$.
- find out that the graph is connected, it will take $\Theta(V^2)$.

Cosmos

Adjacency Lists :-



→

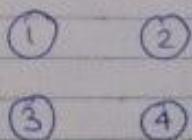


Space Complexity :-
 $V + 2E = O(V+E)$

or

$O(V+E)$

which ever is
less big, it will
be the answer.



→

1	x
2	x
3	x
4	x

Star In this case :-

★ To find out the degree of each vertex :-

$\Omega(1) \rightarrow$ When no adjacent neighbours

$O(V) \rightarrow$ When graph is connected.
(Sparse graph)

★ When less no. of edges :- Adjacency List

★ When more no. of edges :- Adjacency Matrix
(Dense graph)

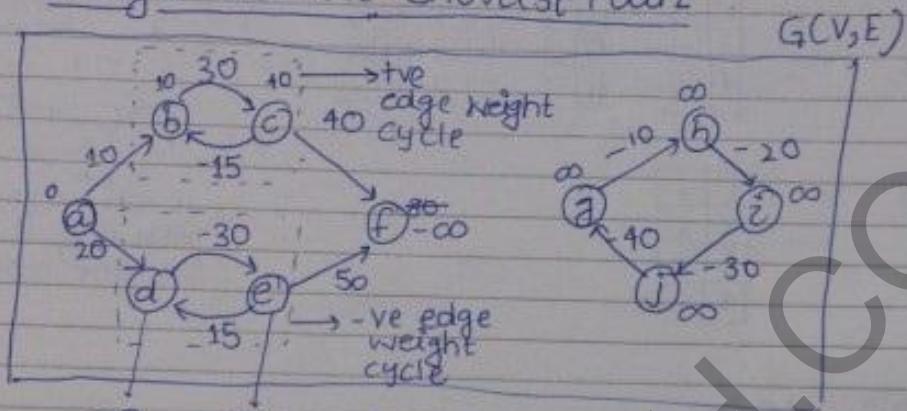
Single Source Shortest Path

Date

21.07.12

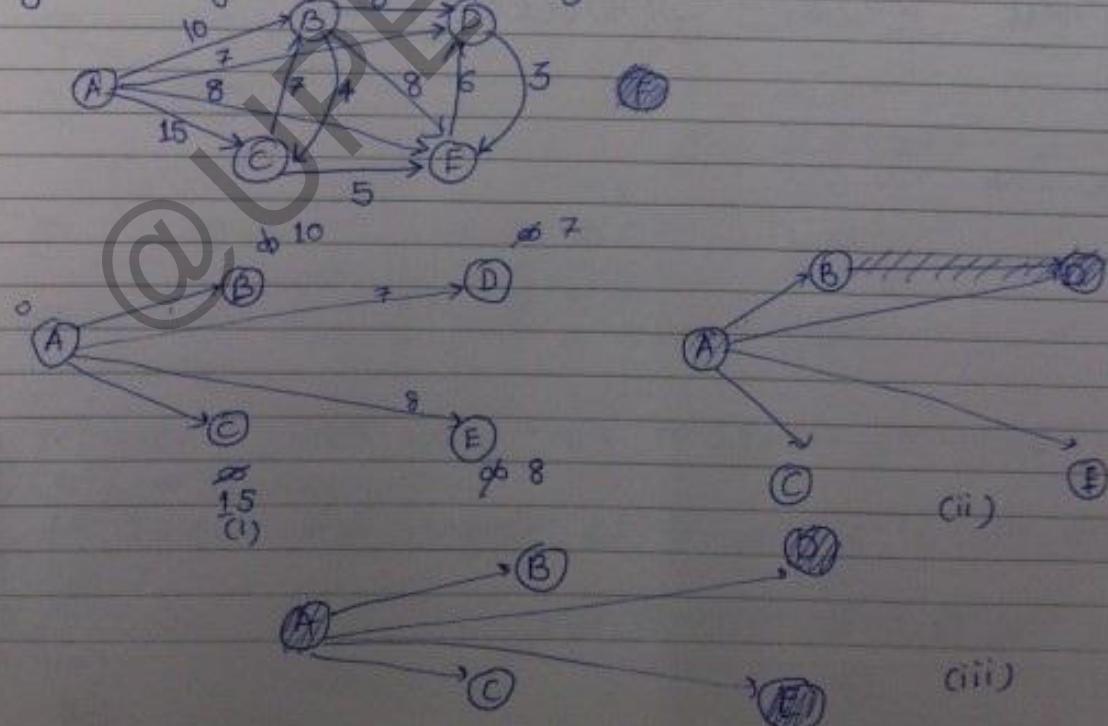
Cosmos

Single Source Shortest Path

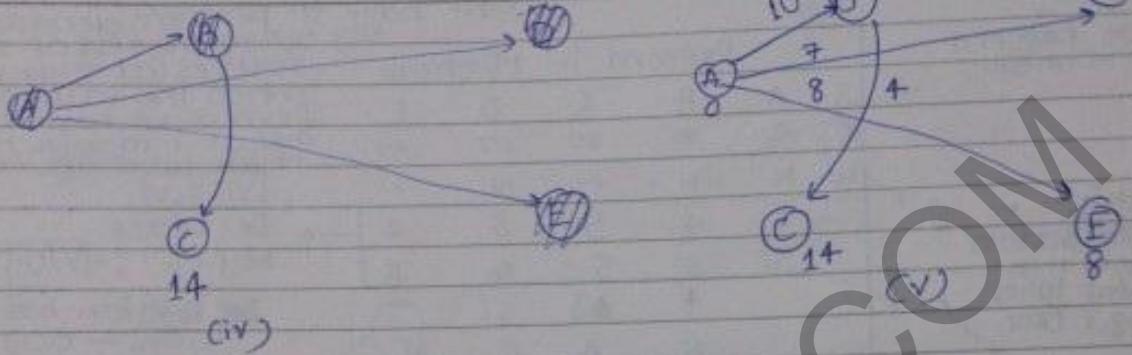


- $MCA(B) = \infty$, if there is no path b/w A & B
- $MCA(B) = -\infty$, B is participant of negative edge weight cycle or dependent on -ve edge weight cycle
- d, e \rightarrow participants
- f \rightarrow dependent

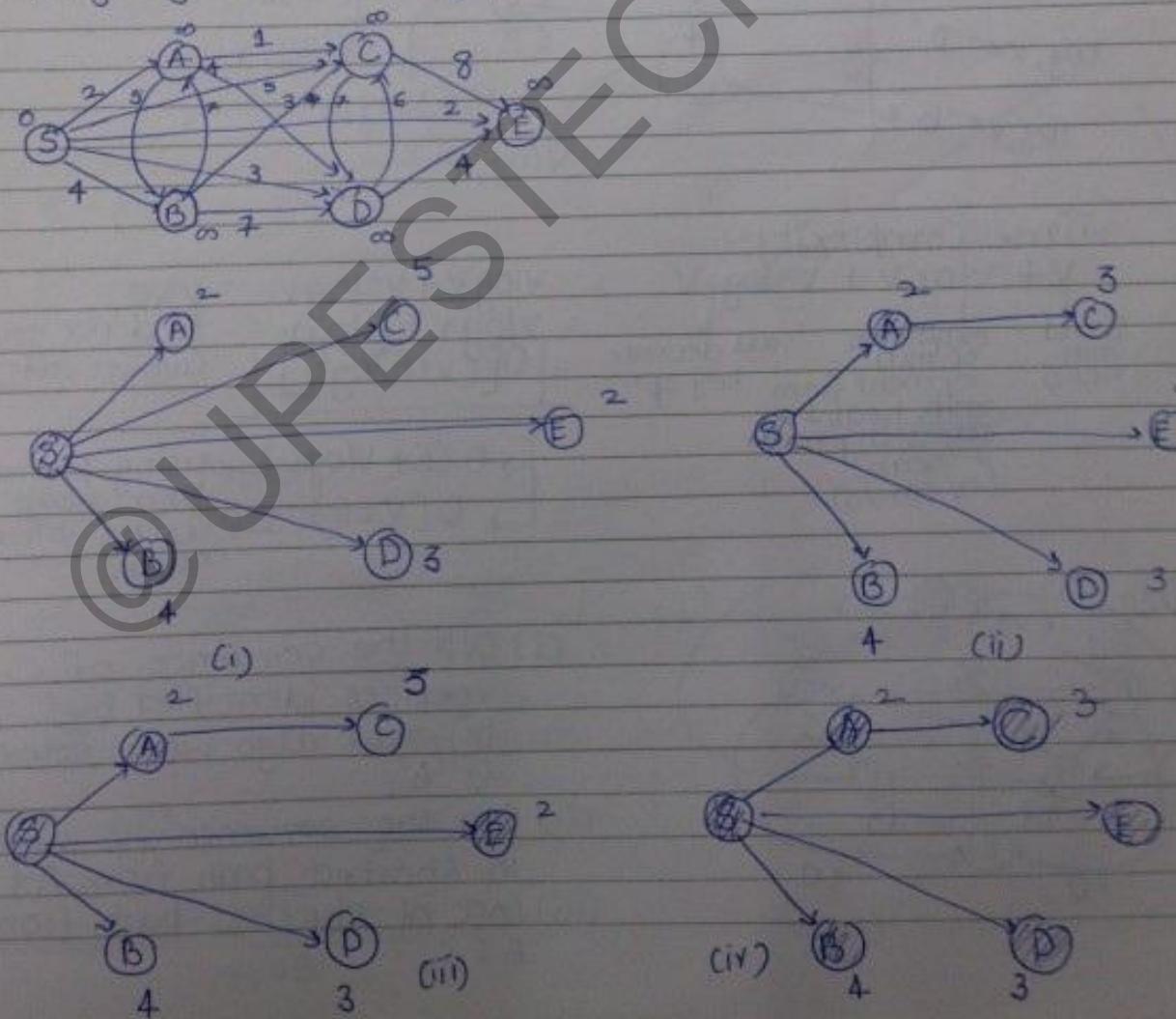
i. Find shortest path from vertex 'a' for the following graph using dijkstra's algo?



Cosmos



Q Apply Dijkstra starting from vertex S



Cosmos

Table

Not present
in Minheap

Present in Minheap					
	A	B	C	D	E
N	N	N	N	N	N
S	6	8	10	12	14
S	3	4	5	3	2
S	4	5	3	3	2
S	5	4	3	3	2
S	A	S	S	S	S
S	3	3	3	3	2
S	3	3	3	3	2
S	4	4	4	4	2
S	4	4	4	4	2

Decrease Key opn. :-

- Delete the min. from min. heap $\rightarrow O(1)$.
- Adjust the root : - $\log_2 V$
- We have to perform decrease key opn to the rest of the vertices (at max) when the value changes from v , we have to adjust it in min. heap, which takes $V \log_2 V$ time.

Decrease key opn : - $V \log_2 V$

But deletion on min. $\rightarrow O(1)$ at max we have to perform decrease opn $(V-1)$ times. $(V) \log_2 V$.

$\log_2 V < E$

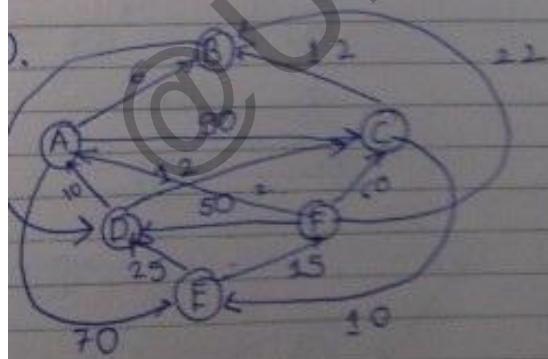
$\log_2 V < C$

$\log_2 V < D$

$\log_2 V < B$

Time Complexity:-

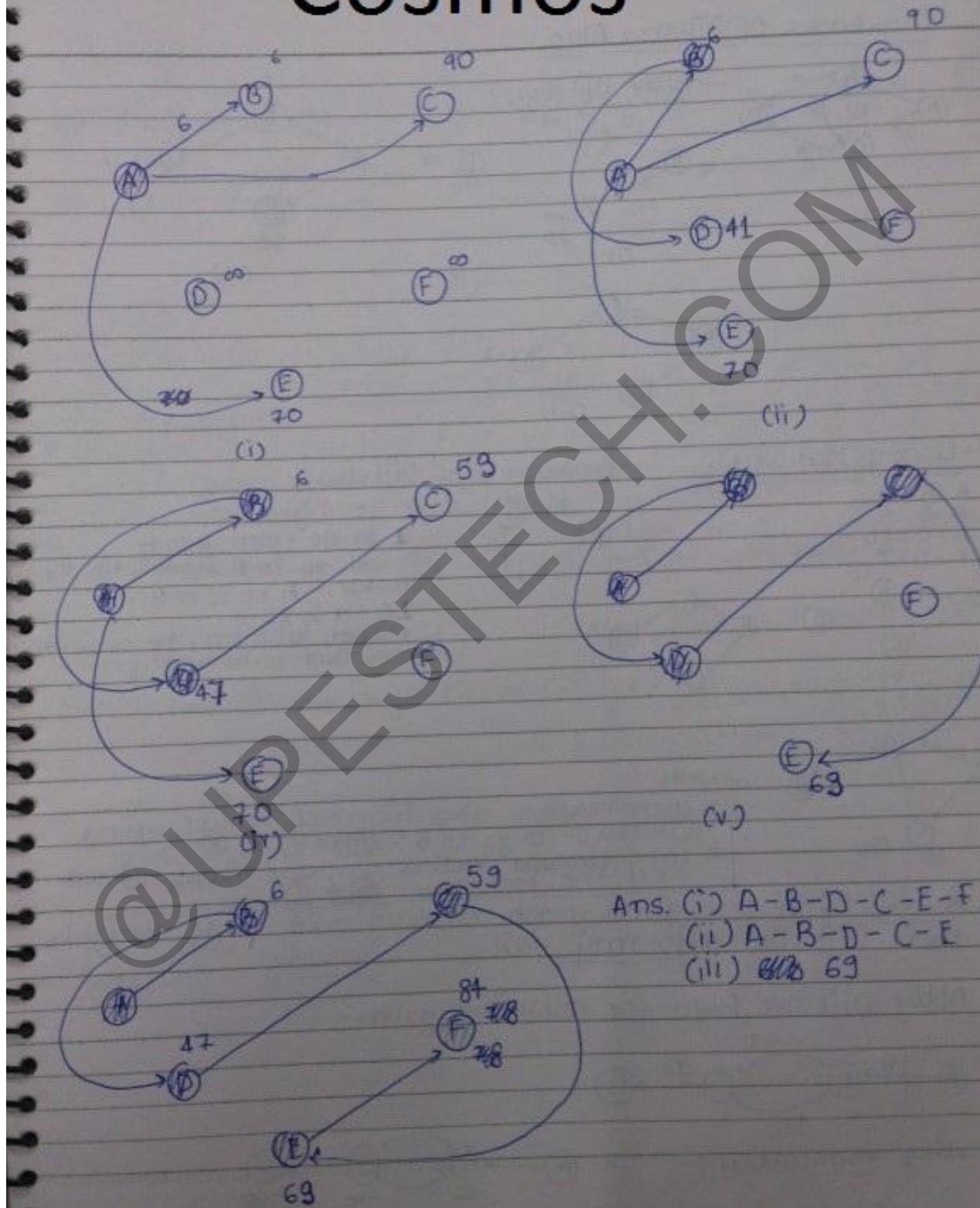
$$\begin{aligned}
 & V + V \log_2 V + V^2 \log_2 V \\
 & \downarrow \text{build min. heap} \\
 & \downarrow \text{extraction of min. element from key op.} \\
 & \text{all decrease min. heap} \\
 & \downarrow \text{adjusting min. heap} \\
 & (\sqrt{V} \text{ times}) \\
 & = V \log_2 V + V^2 \log_2 V \quad V^2 = E \\
 & = V \log_2 V + E \log_2 V \quad \text{in dense graphs} \\
 & = O[(V+E) \log_2 V] \quad (\text{worst case}) \\
 & \boxed{O(E + V \log_2 V) \rightarrow \text{using min. heap}} \\
 & \boxed{O(V+E) \rightarrow \text{using binary heap.}}
 \end{aligned}$$



i) O/p the sequence of vertices identified by Dijkstra algo when source is 'A'.

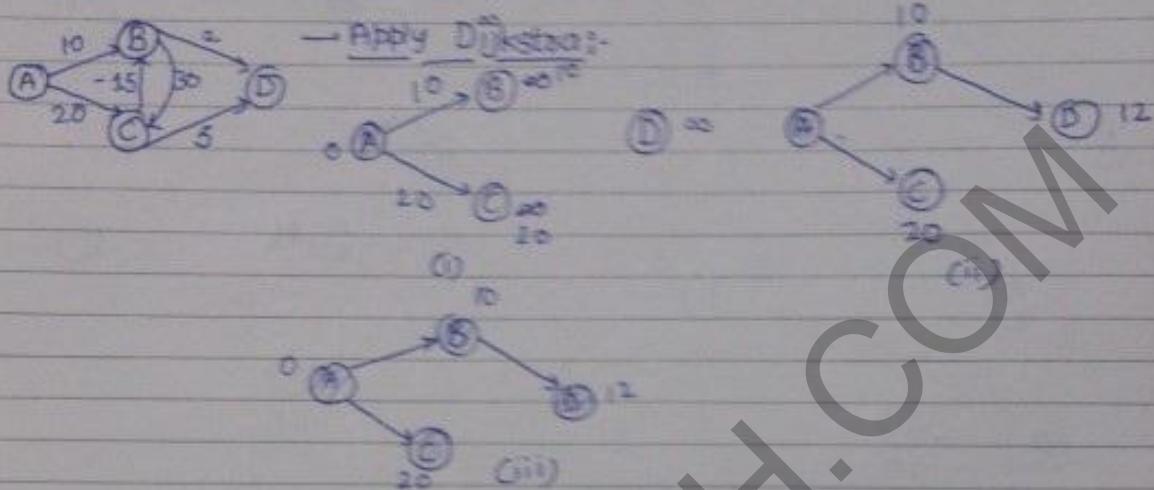
- ii) O/p the sequence of vertices in shortest path from A-E.
 iii) Cost of shortest path from A-E?

Cosmos



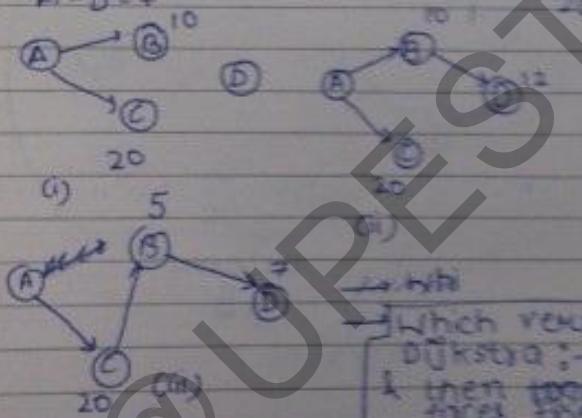
Cosmos

Drawbacks of Dijkstra Algo



→ Using Manually

$$\begin{aligned} A-A &= 0 \\ A-B &= 5 \\ A-C &= 20 \\ A-D &= 7 \end{aligned}$$



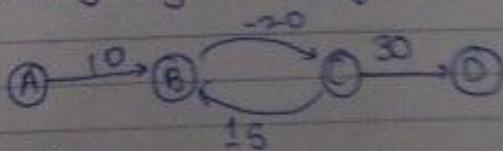
Drawback of Dijkstra:-

→ to Dijkstra:-
to go from A to B
it will go to B from A directly
because:- A to C to B.
 $10 + a > 20$
but when a is -ve, the answer comes out to be wrong.

→ Which vertices gives incorrect result using Dijkstra:- to go to B:- A to C to B = 5
& then vertex C which from B also faces the problem.

Q. **Note:-** If the given graph contain -ve edge weights then Dijkstra algo may fail.

Q. Apply Dijkstra Algo for following graph-

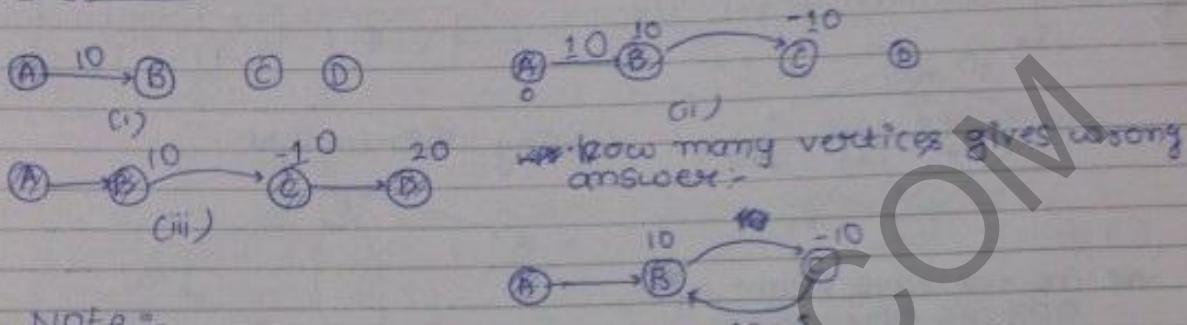


using manually :-



Cosmos

Dijkstra :-

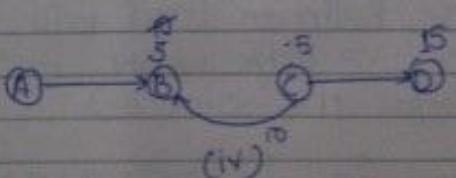
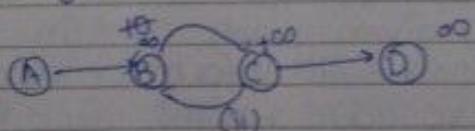
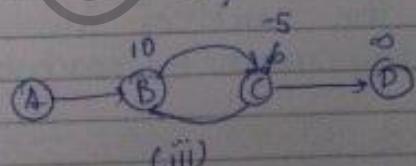
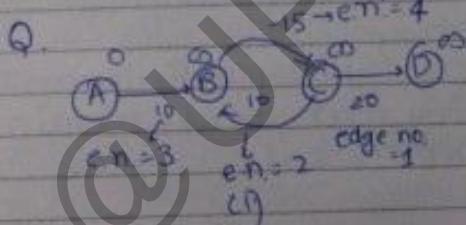


Note :-

- ★ Dijkstra will definitely fail when there is a -ve edge weight cycle in the graph.
- ★ Dijkstra will work fine for -ve edge weight when we eliminate a vertex after using the vertex $V-1$ times.
- ★ Dijkstra will work fine for -ve edge weight cycle when we eliminate a vertex after using it $(V-1)$ times.

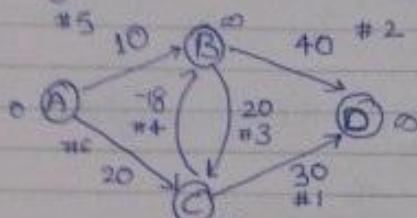
Bellman-Ford Algo :-

Note :- ① Bellman Algo takes $O(VE)$ time. → each time all the edges using bellman-ford are calculated.



Cosmos

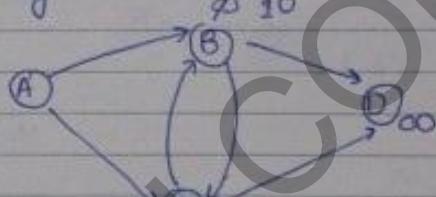
1. Apply Bellman-Ford algo:-



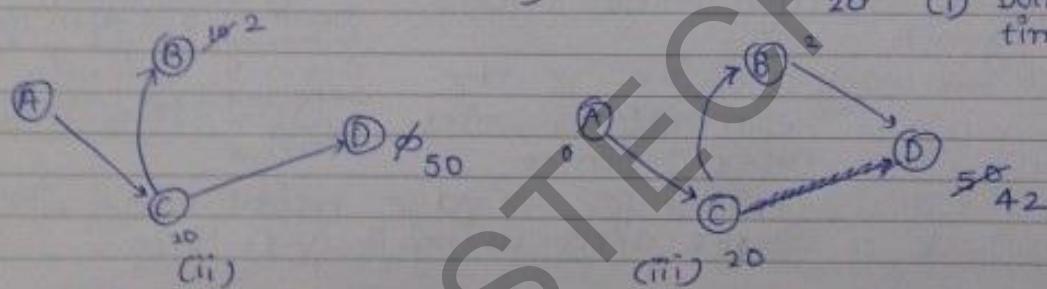
$$V=4$$

We have to do $(V-1) = 3$ times.

→ Using Bellman Ford:-



(i) Doing 1st time



doing 2nd time

doing 3rd time

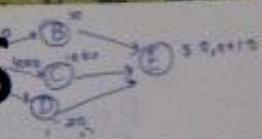
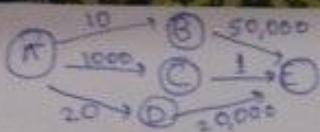
[* after performing $V-1$ times, do it one more time to check if the values change. If then there is -ve edge weight cycle otherwise not.]

* When there is

- If given graph contain both +ve & -ve edge weight, Bellman-Ford will give correct result always.
- If given graph contain -ve edge weight cycle, Bellman-Ford will inform (or report) saying that graph contain -ve edge weight cycle & we can't compute shortest path.
- The Bellman-Ford will also give the vertices involved in -ve edge weight cycle (but they must be reachable from the source.)

Dynamic Programming

Cosmos



Greedy:
① Sometimes give wrong answer.
② Takes less time.
③ One decision at a time.

Dynamic: Always give correct answer.

① Take more time because it covers all possibilities.
③ Sequence of decisions.

- In greedy to choose shortest distance from A to E, greedy will choose path A to B (shortest path from A), & then choose B to E, which gives wrong answer.
- In dynamic programming, it will search every possibility & hence take more time.

★★ Greedy guess the answer which may or may not be correct.

Applications Of Dynamic Programming (Recursive)

- ① Fibonacci Series
- ② Longest Common Subsequence
- ③ Multistage Graph
- ④ Matrix Chain Multiplication
- ⑤ Travelling Sales Person
- ⑥ 0/1 Knapsack
- ⑦ All pair shortest path
- ⑧ Sum of subset problem

★ In divide & conquer \rightarrow height of tree :- $\log n$

★ In Dynamic Programming \rightarrow height of tree :- n

where we
will consider
all possible
combinations

Fibonacci - Series :-

n	0	1	2	3	4	5	6	7	8	9	10
$f(n)$	0	1	1	2	3	5	8	13	21	34	55

Cosmos

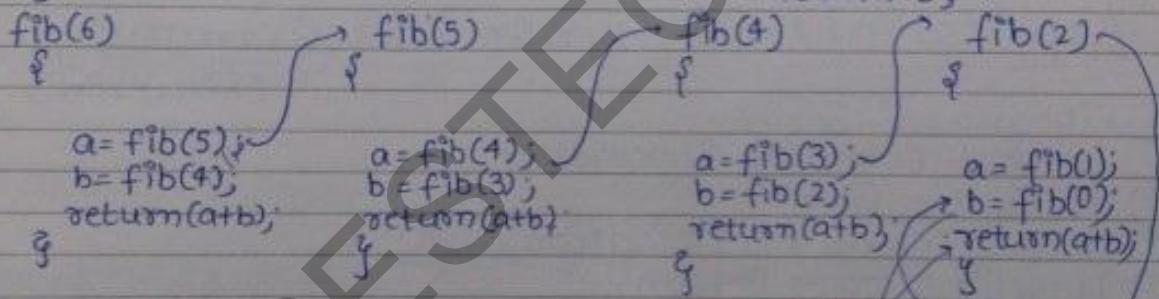
Recurrence Reln.

$$T(n) = \begin{cases} 0, & \text{if } n=0 \\ 1, & \text{if } n=1 \\ T(n-1) + T(n-2), & \text{otherwise } (n > 1) \end{cases}$$

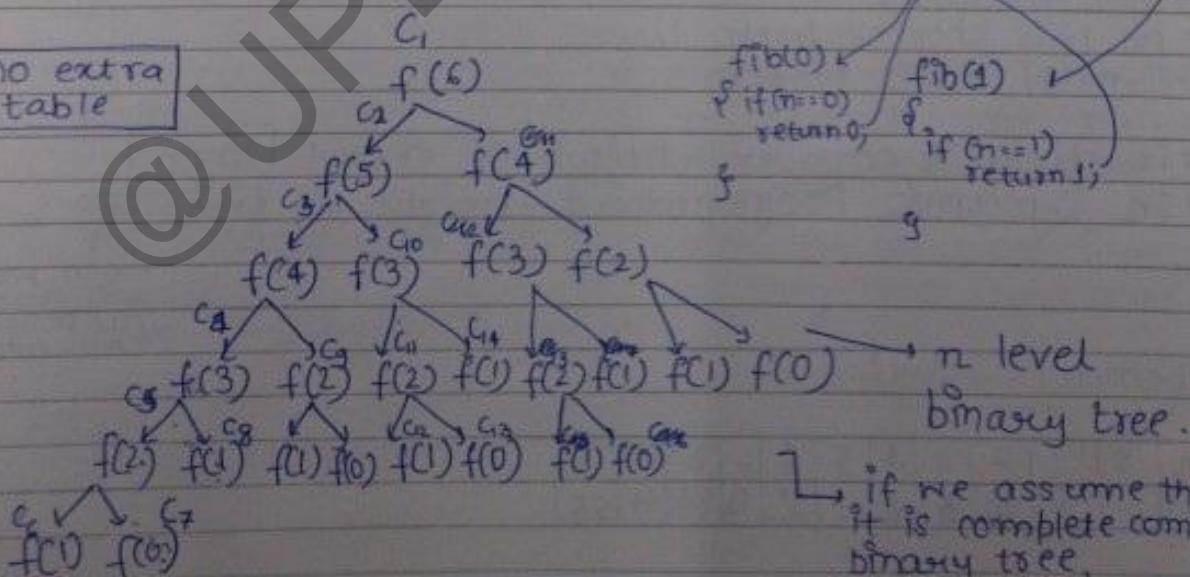
$\boxed{T(n); - Fib(n)}$

```
fib(n)
{ if (n == 0) or (n == 1)
    return 0;
  if (n == 1)
    return 1;
  else
```

```
    return (fib(n-1) + fib(n-2)); // or
    a = fib(n-1);
    b = fib(n-2);
    c = a + b;
    return c;
```



no extra
table

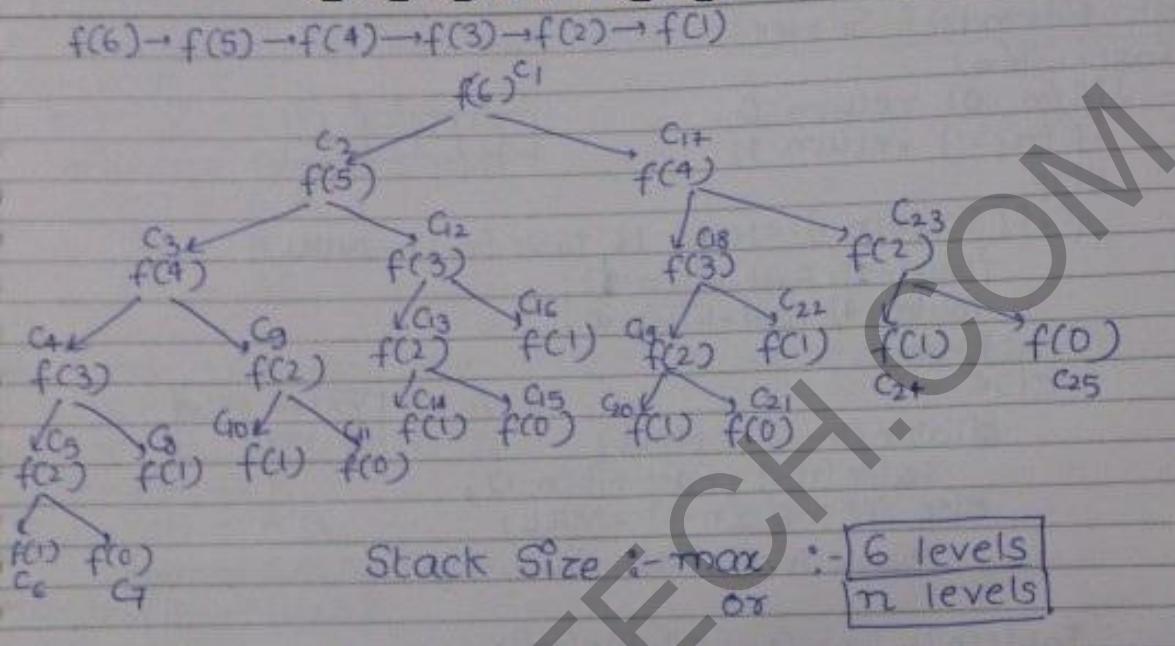


If we assume that it is complete complete binary tree,

∴ no. of nodes = $2^n - 1$
∴ each node there is a func.
call, ∴ no. of fn. calls = $2^n - 1$.

$\boxed{O(2^n)}$

Cosmos



& in fibonacci series fn. :- each fn. requires 6 Bytes.
 \therefore Space complexity = max. Stack size \times 6 Bytes + 2
 $= n \times 6$ Bytes + 2
 $= \Theta(n)$

Drawback of Recursive Soln.:-

Note:- In the above recursive tree many subproblems are repeating (Overlapping Subproblems).

In dynamic programming, we will solve ~~all~~ every subproblem only once.

Dynamic Programming time complexity for fibonacci series $[O(n)]$ because it will call only distinct fn calls. As soon as a particular fn. is completed, that value is stored in a table so that no need to complete the function again.

Fibonacci Series using Dynamic Programming :-

Time Complexity :- $O(n)$

Space Complexity :- $2 + 6n + p = O(n)$

(size of 'n' in $fib(n)$ which is of 2 Bytes) $\leftarrow \frac{2}{P}$ max. level stack for storage of $f(1), f(2), f(3), f(4), f(5), f(6)$

Cosmos

$$f(3) = f(1) + f(2)$$

Fast Fibonacci Series :-

Fast-Fib(n)

```
{ if (n == 0) return 0;  
  if (n == 1) return 1;  
  else
```

```
    if (Table[n-1] == NULL & Table[n-2] == NULL)
```

```
        Table[n-1] = Fast-Fib(n-1);
```

```
        Table[n-2] = Fast-Fib(n-2);
```

```
}
```

```
else
```

```
    if (Table[n-1] == NULL)
```

```
        Table[n-1] = Fast-Fib(n-1);
```

```
    else if (Table[n-2] == NULL)
```

```
        Table[n-2] = Fast-Fib(n-2);
```

```
}
```

```
Table[n] = Table[n-1] + Table[n-2];
```

```
return Table[n];
```

```
}
```

```
}
```

Max. level of the tree:- [n]

LCS :-

Subsequence of a given sequence is just the given sequence only in which 0 or (more) symbols are left out.

e.g. $S = (A, B, B, A, B, B) \rightarrow$ sequence

$S_1 = (\underset{1}{A}, \underset{4}{A}, \underset{5}{B}, \underset{6}{B}) \rightarrow$ subsequence

$S_2 = (A, A) \rightarrow$ subsequence

$S_3 = (\underset{1}{B}, \underset{2}{B}, \underset{3}{B}, \underset{4}{B}) \rightarrow$ "

$S_4 = (B, B, A, A) \rightarrow$ not the subsequence

$S_5 = (A, B, B, B, A) \rightarrow$ "

Cosmos

Common Subsequence:-

z is a common subsequence of x & y if z is subsequence of both x & y .

e.g. $x = A B B A B B$
 $y = B A A B A A$
 $CS_1 = A B A$
 $CS_2 = B A B$
 $CS_3 = AB$

Q. Find LCS for the following subsequences:-

$$\begin{array}{ll} x = A B C & B D A B \\ y = B D C & A B A \end{array}$$

- 1 length $\rightarrow A$
- 2 length $\rightarrow A B$
- 3 length $\rightarrow A B A$
- 4 length $\rightarrow BDAB$
- 5 length

Q. $x: \begin{smallmatrix} 1 & 2 & 3 & 4 & 5 & 6 \\ B & B & B & A & A & A \end{smallmatrix}$
 $y: \begin{smallmatrix} 1 & 2 & 3 & 4 & 5 & 6 \\ B & B & A & A & A & A \end{smallmatrix}$

(decrementing 2nd sequence when it doesn't matches.)

$$LCS(6,6) = 1 + LCS(5,5)$$

$$\begin{aligned} & \downarrow \\ & 1 + LCS(4,4) \\ & \downarrow \\ & 1 + LCS(3,3) \\ & \downarrow \\ & 0 + LCS(3,2) \\ & \downarrow \\ & 1 + LCS(2,1) \\ & \downarrow \\ & 0 + LCS(1,0) \end{aligned}$$

Q. $x: \begin{smallmatrix} 1 & 2 & 3 & 4 & 5 & 6 \\ B & B & A & A & B & A \end{smallmatrix}$
 $y: \begin{smallmatrix} 1 & 2 & 3 & 4 & 5 & 6 \\ B & B & B & A & B & A \end{smallmatrix}$

(decrementing 1st sequence when it doesn't matches.)

$$LCS(6,6) = 1 + LCS(5,5)$$

$$\begin{aligned} & \downarrow \\ & 1 + LCS(4,4) \\ & \downarrow \\ & 1 + LCS(3,3) \\ & \downarrow \\ & 0 + LCS(2,3) \\ & \downarrow \\ & 1 + LCS(1,2) \\ & \downarrow \\ & 0 + LCS(0,1) \end{aligned}$$

Cosmos

- * In such case, when we have the choice of decrementing either of the sequence,
- greedy says decrement either of them, but not both (this sometimes give correct result & sometimes incorrect).
 - dynamic says do both options, this always give correct result.

$CS(i, j)$ = Length of longest common subsequence possible with the 2 sequences $x \& y$, where sequence x contains ' i ' symbols & y contains ' j ' symbols

```
LCS(i,j)
{ if (i==0 || j==0)
    { printf("No common subsequence");
    }
else if (x[i]==y[j])
    {
        LCS(i-1,j-1);
        printf("Common subsequence");
    }
else
    {
        LCS(i-1,j);
        LCS(i,j-1);
    }
}
```

$$CS = \begin{cases} 0 & ; \text{if } i=0 \text{ or } j=0 \\ 1+CS(i-1, j-1) & \text{if } x[i] = y[j] \\ \max(LCS(i, j-1), LCS(i-1, j)) & , \text{otherwise} \end{cases}$$

```
LCS(i,j)
{ if (i==0 || j==0)
    { printf("0 common sequence");
    return 0;
}
else if (x[i]==y[j])
    {
        a=LCS(i-1, j-1);
        return (a+1);
    }
else
    {
        if (LCS(i, j-1) > LCS(i-1, j))
            return
        else
            return
    }
}
```

Cosmos

```

a = LCS(i-1, j);
b = LCS(i, j-1);
if (a > b)
    return a;
else
    return b;
    }
}

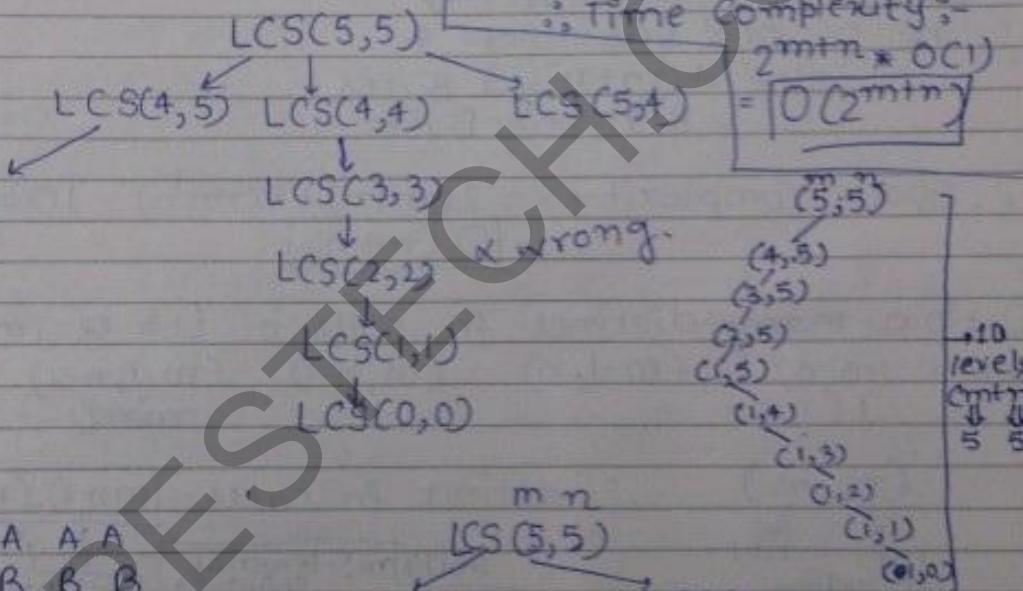
```

If we don't use dynamic programming, then many fn. calls are repeated, at max. there are $(m+n)$ levels, so for complete binary tree, the max. no. of nodes are 2^{m+n} & lets suppose each fn. call takes $O(1)$ time.

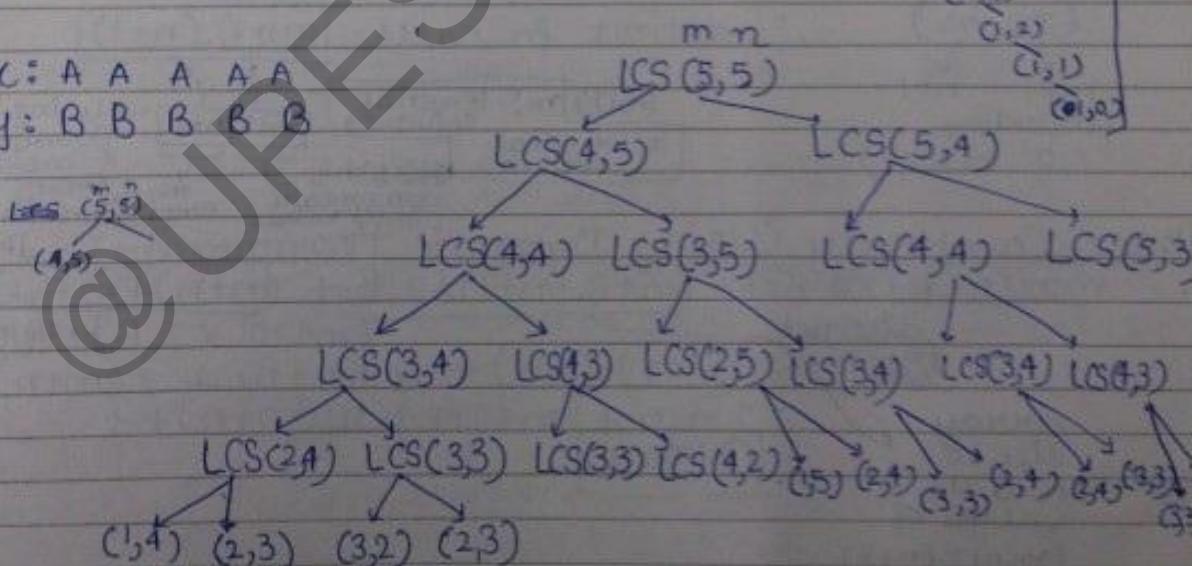
★ In the recursive tree
If we draw recursive tree for LCS of (m,n) , in the worst case we will get $(m+n)$ level complete binary tree. So total no. of nodes in $(m+n)$ level complete binary tree is $2^{m+n} - 1$.
 $\therefore 2^{m+n} - 1$ no. of function calls.

We assume each fn. call takes $O(1)$ time.
∴ Time Complexity :-

$$2^{m+n} * O(1) = \boxed{O(2^{m+n})}$$



x: A A A A A
y: B B B B B



★ The height of the tree (at max.) = $m+n$.

Cosmos

In above recursive tree many fn calls are repeated, so we have to go to dynamic programming, which will solve every subproblem only once.

Space complexity:-

- 2 i/p arrays are req. of size $m + n$.
- i/p size: $(m+n) \times 2$ Bytes (each integer/char of 2B).

$$\text{Stack size (max.)} = m + n$$

$$\text{no. of local variables} = 4$$

$$\therefore \text{Size} = 4(m+n) \times 2 \text{ Bytes}$$
$$= 8(m+n) \text{ Bytes}$$

$$\text{Space Complexity} = \frac{2(mn) + 8(m+n)}{10(m+n)} = O(m+n)$$

How many distinct fn. calls in LCS of (m, n) .

$$\begin{matrix} (m, n) & (m-1, n) & (m, n-1) & (m-1, n-1) \\ 1 & & & mn \end{matrix}$$

$$\begin{matrix} (m, n) \\ \downarrow \\ m+1 & n+1 \\ \text{(including } 0 \text{ as well)} \end{matrix}$$

$$\therefore \text{distinct fn. calls} = (m+1)(n+1)$$

$(m+1)$: length of sequence 1
 $n+1$: length of sequence 2
Using permutations & combinations theory
can contain $(m+1)^n$ values
this can contain $(n+1)^m$ values

Space Complexity (Using Dynamic Programming):-

$$\max(m, n) \times 4 \text{ B} \neq (m+1).(n+1) \times 2 \text{ B} + (m+n)4 \times 2 \text{ B} + \text{Ears}$$

distinct fn. calls

array size to hold the values of

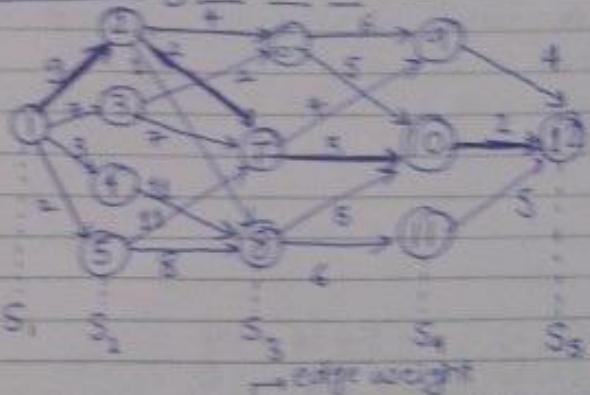
$(m+1).(n+1)$

size

$$\begin{aligned} &= 2(m+1).(n+1) + 8(m+n) + 2(m+n) \\ &= 2mn + 2m+2n + 10(m+n) + 2 \\ &= O(mn) \end{aligned}$$

Cosmos

Multistage Graph



$$MSG(y) = \begin{cases} C(1,4) + MSG(2,5) & \rightarrow 9 + 7 = 16 \\ C(1,3) + MSG(2,5) & \min \text{ of } 7 + 9 = 16 \\ C(1,4) + MSG(1,5) & \text{the } 4. \rightarrow 3 + 16 = 19 \\ C(1,5) + MSG(2,5) & \rightarrow 2 + 15 = 17 \end{cases}$$

$$MSG(2,4) = \begin{cases} C(2,6) + MSG(3,7) & \min \text{ of } 4 + 7 = 11 \\ C(2,7) + MSG(3,7) & \rightarrow 2 + 5 = 7 \checkmark \\ C(2,8) + MSG(3,7) & \rightarrow 1 + 7 = 8 \end{cases}$$

$$MSG(2,3) = \begin{cases} C(3,4) + MSG(3,6) & \rightarrow 2 + 7 = 9 \checkmark \\ C(3,7) + MSG(3,6) & \rightarrow 7 + 5 = 12 \end{cases}$$

$$MSG(2,5) = \begin{cases} C(5,6) + MSG(3,7) & \min \rightarrow 11 + 5 = 16 \\ C(5,8) + MSG(3,7) & \text{of } 2 \rightarrow 8 + 7 = 15 \checkmark \end{cases}$$

$$MSG(2,6) = \begin{cases} C(6,9) + MSG(4,9) & \min. 2 \rightarrow 6 + 4 = 10 \\ C(6,10) + MSG(4,10) & \rightarrow 5 + 2 = 7 \checkmark \end{cases}$$

$$MSG(3,4) = C(3,12) = 4$$

$$MSG(4,10) = C(10,12) = 2$$

$$MSG(3,5) = \begin{cases} C(5,7) + MSG(4,9) & \rightarrow 4 + 4 = 8 \\ C(5,10) + MSG(4,10) & \rightarrow 3 + 2 = 5 \checkmark \end{cases}$$

$$MSG(3,8) = \begin{cases} \min. (C(8,10) + MSG(4,10)) & \rightarrow 5 + 2 = 7 \checkmark \\ C(8,11) + MSG(4,11) & \rightarrow 6 + 5 = 11 \end{cases}$$

$$MSG(4,11) = C(11,12) = 5$$

using Greedy :-

① → ⑤ → ⑧ → ⑩ → ⑫ → 14

MSG(1,4)

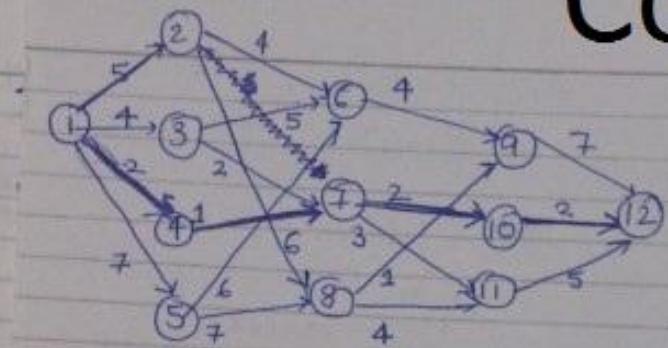
from 1st stage
from 1st vertex

MSG(3,8)

from 2nd stage
from 8th vertex

to final destn.
which is vertex 12

Cosmos



$$MSG(1,1) = \min \left(\begin{array}{l} C(1,2) + MSG(2,2) \\ C(1,3) + MSG(2,3) \\ C(1,4) + MSG(2,4) \\ C(1,5) + MSG(2,5) \end{array} \right) \rightarrow \begin{array}{l} 5+14=19 \\ 4+6=10 \\ 2+5=7 \\ 7+15=22 \end{array}$$

$$MSG(2,2) = \min \left(\begin{array}{l} C(2,6) + MSG(3,6) \\ C(2,8) + MSG(3,8) \end{array} \right) \rightarrow \begin{array}{l} 4+11=15 \\ 6+8=14 \end{array}$$

$$MSG(3,6) = \min \left(\begin{array}{l} C(6,9) + MSG(4,9) \end{array} \right) \rightarrow 4+7=11$$

$$MSG(4,9) = C(9,12) = 7$$

$$MSG(3,8) = \min \left(\begin{array}{l} C(8,9) + MSG(4,9) \\ C(8,11) + MSG(4,11) \end{array} \right) \rightarrow 1+7=8$$

$$MSG(4,11) = C(11,12) = 5$$

$$MSG(2,3) = \min \left(\begin{array}{l} C(3,6) + MSG(3,6) \\ C(3,7) + MSG(3,7) \end{array} \right) \rightarrow \begin{array}{l} 5+11=16 \\ 2+4=6 \end{array}$$

$$MSG(3,7) = \min \left(\begin{array}{l} C(7,10) + MSG(4,10) \\ C(7,11) + MSG(4,11) \end{array} \right) \rightarrow \begin{array}{l} 2+2=4 \\ 3+5=8 \end{array}$$

$$MSG(2,4) = C(4,7) + MSG(3,7) = 1+4=5$$

$$MSG(2,5) = \min \left(\begin{array}{l} C(5,6) + MSG(3,6) \\ C(5,8) + MSG(3,8) \end{array} \right) \rightarrow \begin{array}{l} 6+11=17 \\ 7+8=15 \end{array}$$

nd Method :- from $\textcircled{6}$:- 11 (6-9-12)

from $\textcircled{7}$:- 4 (7-10-12)
8 (7-11-12)

from $\textcircled{8}$:- 8 (8-9-12)

from $\textcircled{9}$:- 6 (9-6-min. distance from $\textcircled{6}$)
9 (8-11-12)

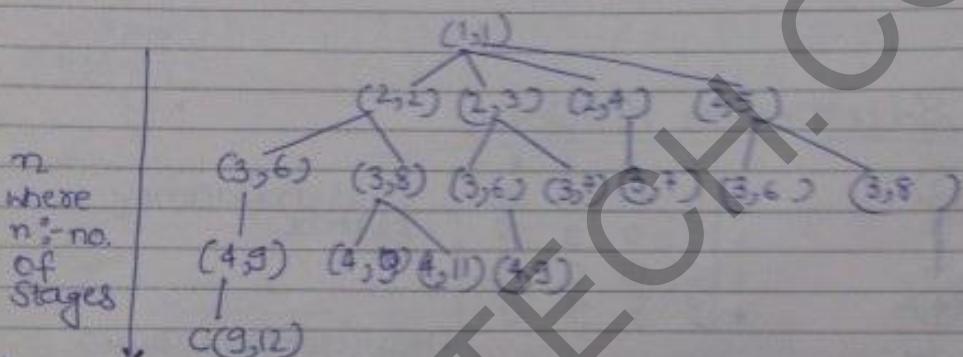
6+8=14 (2-8-min. distance from $\textcircled{8}$)

★ Dynamic programming & brute force becomes same when all problems are distinct.

from ③ :- $5+11=16$ (3 - 6-min dis from ⑥)
 $2+4=6$ (3 - 7-min " " ⑦) ✓

from ④ :- $6+4=10$ (4 - 7-min " " ⑧)

Cosmos



★ Multistage graph will generate in the worst case n^m level complete binary tree, n = no. of stages, so total time complexity is $O(2^n)$ - [no. of nodes in complete binary tree = 2^{m-1}]. But in multistage graph problem many subproblems are repeated, so we perform dynamic programming.

AMSG ($G(V, E)$, N) \rightarrow V distinct function call

All function calls combined take $O(CE)$ times.
 $O(V+E)$

Space Complexity :- $(V+E) + n + V$

↓
 If in form of adjacency list

↓
 Stack-size (no. of stages)

↓
 Table size (distinct fn. calls)

↓
 Max stack size

$$= V+E + V + V = 3V+E = O(V+E)$$

Cosmos

$MSG(S_i, v_j)$ = the min. cost req. from stage S_i & vertex v_j to destination.

$$MSG(S_i, v_j) = \begin{cases} (c(v_j, k) + MSG(S_{i+1}, k)) \rightarrow \min. \\ \forall k \in S_{i+1} \text{ & } (v_j, k) \in E \\ \downarrow \\ c(v_j, D) \text{ if } S_i = (F-1) \end{cases}$$

edge should
be there.

D → Destⁿ

F → Final stage

Date

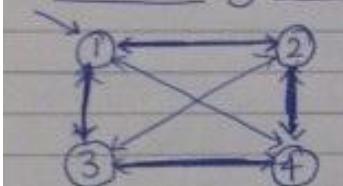
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$c(v_j, k)$

$\forall E$
 $c(v_i, k) \in E$

KEF

Travelling Salesperson Problem:-



Acc. to greedy :-

(1) → (2) → (3) → (4) → (1)
39

	1	2	3	4
1	0	10	15	20
2	5	0	9	10
3	6	13	0	12
4	8	8	9	0

Cost-Adjacency Matrix

• Hamiltonian Tour :- Visiting every vertex exactly once.

• Euler's Tour :- Visiting every edge exactly once.

Using Dynamic Programming:-

$$\text{TSP } \{1, 2, 3, 4\} = \min. \begin{cases} C(1,2) + \text{TSP}\{2, \{3,4\}\} \\ C(1,3) + \text{TSP}\{3, \{2,4\}\} \\ C(1,4) + \text{TSP}\{4, \{3\}\} \end{cases} \rightarrow 10 + 25 = 35 \checkmark$$

Starting from 1 can go to other 2 or 3 or 4

$$\text{TSP } \{2, \{3, 4\}\} = \min. \begin{cases} C(2,3) + \text{TSP}\{3, \{4\}\} \\ C(2,4) + \text{TSP}\{4, \{3\}\} \end{cases} \rightarrow 9 + 20 = 29$$

$$\text{TSP } \{3, \{4\}\} = C(3,4) + \underbrace{C(4,1)}_{\substack{\text{go back to} \\ 1 \text{ from } 4}} = 12 + 8 = 20$$

$$\text{TSP } \{4, \{3\}\} = C(4,3) + C(3,1) = 9 + 6 = 15$$

Cosmos

$$TSP\{3, \{2, 4\}\} = \min. \left\{ \begin{array}{l} C(3, 2) + TSP\{2, \{4\}\} \rightarrow 13 + 18 = 31 \\ C(3, 4) + TSP\{4, \{2\}\} \rightarrow 12 + 13 = 25 \end{array} \right.$$

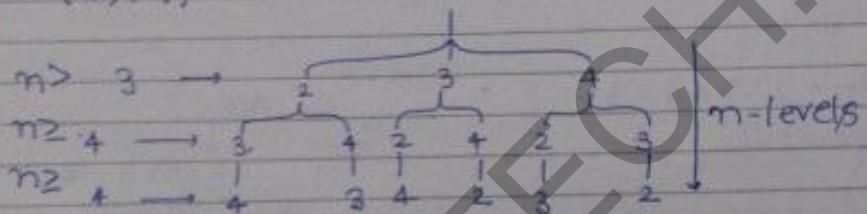
$$TSP\{2, \{4\}\} = C(2, 4) + C(4, 1) = 10 + 8 = 18$$

$$TSP\{4, \{2\}\} = C(4, 2) + C(2, 1) = 8 + 5 = 13$$

$$TSP\{4, \{2, 3\}\} = \min. \left\{ \begin{array}{l} C(4, 2) + TSP\{2, \{3\}\} \rightarrow 8 + 15 = 23 \\ C(4, 3) + TSP\{3, \{2\}\} \rightarrow 9 + 18 = 27 \end{array} \right.$$

$$TSP\{2, \{3\}\} = C(2, 3) + C(3, 1) = 9 + 6 = 15$$

$$TSP\{3, \{2\}\} = C(3, 2) + C(2, 1) = 13 + 5 = 18$$



Time complexity of Travelling Salesperson w/o dynamic programming :- $\Omega(2^n)$ [Brute force method]

Using Dynamic Programming :- $\Omega(2^n)$ [No overlapping subproblem.]

number of nodes in the above tree

$$n \times (n-1) \times (n-2) \times \dots \times 1 \leq n \times n \times \dots \times n \text{ (n times)}$$

$$\begin{aligned} & \overset{n=2}{=} n^n \\ & = O(n^n) \end{aligned}$$

* Travelling Salesperson is one of the NP complete problems because they can't be solved in polynomial time.

$$\begin{aligned} \text{Space Complexity} &= \underbrace{V^2 + V + E}_{\substack{\text{adjacency matrix} \\ \text{graph}}}, + \underbrace{V}_{\text{Stack size}}, + \underbrace{2^V}_{\substack{\text{distinct function calls}}} \\ &= \boxed{\Omega(2^V)} \quad \boxed{\Omega(2^V)} \end{aligned}$$

TSP(A, R): - min. cost required to go from vertex A to all other remaining vertices (R) exactly once & coming back to source S

Recurrence Reln.: -

$$TSP(A, R) = \begin{cases} c(A, S) + TSP(S, R') & \text{where } \forall k \in R \text{ & } R' = R - \{k\} \\ c(A, S) & \text{if } R = \emptyset. \end{cases}$$

Source is S.

Cosmos

Matrix Chain Multiplication

e.g. $A_{2 \times 10} \quad B_{10 \times 5}$
 $C = AB$: Total no. of multiplications
 $2 \times 5 \quad 2 \times 5 \times 10 = 100$

$c(k, S)$
 $c(A, k)$

$A_{2 \times 3} \quad B_{3 \times 5} \quad C_{5 \times 3}$
 $(AB)C \leftarrow (AB) \rightarrow 2 \times 5 \times 3 = 30$
 $(AB)_{2 \times 5} \quad C_{5 \times 3}$
 $2 \times 3 \times 5 = 30$
 $(AB)C \rightarrow 60$ multiplications

$\begin{aligned} &A(BC) \\ &\downarrow \\ &3 \times 5 \times 3 = 45 \\ &A_{2 \times 3} \quad (BC)_{3 \times 3} \\ &2 \times 3 \times 3 = 18 \\ &A(BC) \rightarrow 18 \text{ multiplications} \end{aligned}$

No. of multiplications of $m \times p$ & $p \times n$ matrices = $m \times n \times p$

$$\begin{aligned} &ABCDE \\ &(A)(BCDE) \rightarrow \text{this will have 5 because } BCDE \text{ can be multiplied in } 5 \text{ ways} \\ &(AB)(CDE) \rightarrow 2 \\ &(ABC)(DE) \rightarrow 2 \\ &(ABCD)(E) \rightarrow 5 \\ &\underline{14} \end{aligned}$$

$$\begin{aligned} &A_{1 \times 5} \quad B_{5 \times 2} \quad C_{2 \times 1} \\ &(AB)_{1 \times 2} \quad C_{2 \times 1} \rightarrow 1 \times 1 \times 2 = 2 \\ &1 \times 2 \times 5 = 10 \\ &10 + 2 = 12 \checkmark \end{aligned}$$

$$\begin{aligned} &A(BC)_{5 \times 1} \\ &\downarrow \\ &5 \times 2 \times 1 = 10 \\ &A_{1 \times 5} \quad (BC)_{5 \times 1} \\ &\downarrow \\ &1 \times 1 \times 5 = 5 \\ &10 + 5 = 15 \end{aligned}$$

Cosmos

Q. $A_{2 \times 5} B_{5 \times 4} C_{4 \times 2} D_{2 \times 3}$

$$(A)(BCD)$$

$$(A)(BC)(D)$$

$$5 \times 4 \times 2 = 40$$

$$A_{2 \times 5} B_{5 \times 4} C_{4 \times 2} D_{2 \times 3}$$

$$(A)(BC)D$$

$$2 \times 5 \times 2 = 20$$

$$(ABC)_{2 \times 2} D_{2 \times 3}$$

$$2 \times 2 \times 3 = 12$$

$$(A)(BC)D \rightarrow 72$$

$$(A)((BC)D)$$

$$4 \times 2 \times 3 = 24$$

$$5 \times 4 \times 3 = 60$$

$$2 \times 5 \times 3 = 30$$

$$(A)$$

$$(AB)(CD) \rightarrow 88$$

$$2 \times 5 \times 4$$

$$= 40$$

$$\downarrow$$

$$(AB)_{2 \times 4} (CD)_{4 \times 3}$$

$$2 \times 4 \times 3 = 24$$

$$(A)((BC)D)$$

$$5 \times 2 \times 3 = 30$$

$$(A)(BCD)_{5 \times 3}$$

$$2 \times 5 \times 3 = 30$$

$$(A)(BC)D \rightarrow 100$$

$$(ABC)D \rightarrow 40 + 16 + 12$$

$$= 68$$

$$(AB)_{2 \times 4} (CD)_{4 \times 2}$$

$$2 \times 4 \times 2 = 16$$

$$(ABC)_{2 \times 2} D_{2 \times 3}$$

$$2 \times 2 \times 3 = 12$$

n -levels [n : no. of matrices]

Q. $A_{1 \times 5} B_{5 \times 1} C_{1 \times 2} D_{2 \times 5}$

ABCD

$$(A)(BCD) \rightarrow 85$$

$$(A)((BC)D)$$

$$5 \times 1 \times 2 = 10$$

$$5 \times 2 \times 5 = 50$$

$$A_{1 \times 5} (BCD)_{5 \times 5} \rightarrow 85$$

$$(AB)(CD) \rightarrow 20$$

$$1 \times 5 \times 1$$

$$= 5$$

$$(AB)_{1 \times 1} (CD)_{1 \times 5}$$

$$1 \times 5 = 5$$

$$\downarrow$$

$$(ABC)_{1 \times 2} (D)_{2 \times 5}$$

$$1 \times 2 = 2$$

$$\downarrow$$

$$(ABC)_{1 \times 2} (D)_{2 \times 5}$$

$$1 \times 2 = 2$$

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$$1 \times 2 = 2$$

$$\downarrow$$

$$(ABC)_{1 \times 2} (D)_{2 \times 5}$$

$$1 \times 2 = 2$$

each comparison takes $O(1)$ time, as there are $(n-1)$ comparisons, $\therefore O(n)$ time

- MCM(1,4) - min. no. of multiplications req. to multiply 1 to 4 matrices.

$$\text{MCM}(1,4) = \min \left\{ \begin{array}{l} \text{MCM}(1,1) + \text{MCM}(2,4) + 25 \\ \text{MCM}(1,2) + \text{MCM}(3,4) + 5 \\ \text{MCM}(1,3) + \text{MCM}(4,4) + 10 \end{array} \right\}$$

cost of (1,1) & (2,4)
e.g. (A) & (BCD)

cost of (1,2) & (3,4) e.g. (AB) & (CD)

$\therefore O(n)$ min. comparisons

$$\text{MCM}(2,4) = \min \left\{ \begin{array}{l} \text{MCM}(2,2) + \text{MCM}(3,4) + 25 \\ \text{MCM}(2,3) + \text{MCM}(4,4) + 50 \end{array} \right\}$$

cost of (2,2) & (3,4) e.g.
(B) & (CD)

$\therefore O(n)$ min. comparisons

$$\text{MCM}(3,4) = \min \left\{ \text{MCM}(3,3) + \text{MCM}(4,4) + 0 \right\}$$

combined multiplication cost of (3,3) & (4,4)
e.g. (C) & (CD)

$$\text{MCM}(2,3) = \min \left\{ \text{MCM}(2,2) + \text{MCM}(3,3) + 10 \right\}$$

$$\text{MCM}(1,2) = \min \left\{ \text{MCM}(1,1) + \text{MCM}(2,2) + 5 \right\}$$

$$\text{MCM}(1,3) = \min \left\{ \begin{array}{l} \text{MCM}(1,1) + \text{MCM}(2,3) + 10 \\ \text{MCM}(1,2) + \text{MCM}(3,3) + 2 \end{array} \right\}$$

combined multiplication cost of (1,1) & (2,3)
e.g. (A) & (BC)

$\therefore O(n)$ min. comparisons

* Without Dynamic Programming n -level binary tree will generate 2^n

In the above tree, many subproblems are repeated, so we will perform Dynamic Programming.

Q. MCM(1,n) contains how many distinct subproblems?

Starting with 1

(1,1)

or
(1,2)

(1,3)

(1,4)

(1,5)

Starting with 2

(2,2)

(2,3)

(2,4)

MCM(1,4) contains 10 distinct fn. calls

for MCM(1,n) contains $\frac{n^2}{2}$ function calls

	1	2	3	4
1	✓	✓	✓	✓
2	✗	✓	✓	✓
3	✗	✗	✓	✓
4	✗	✗	✗	✓

distinct.

half of the n^2 matrix

is filled, $\therefore \frac{n^2}{2}$ distinct fn. calls.

Cosmos

Cosmos

Time Complexity :- $\frac{n^2}{2} \times \text{time complexity of each fn. call}$
 $= \frac{n^2}{2} \times O(n)$
 $= O(n^3)$

Space Complexity :- $\frac{4n}{2} + \frac{n^2}{2}$
to store no. of matrices
size of the matrix
(+8 bytes for each matrix)
Stack Size
= $O(n^2)$
table-size (no. of distinct fn. calls)

Recurrence Reln.:-

$MCM(i, j) = \min_{k=i}^{j-1}$ no. of multiplications seq. to multiply i to j matrices.

$MCM(i, j) = \begin{cases} \min(MCM(i, k) + MCM(k+1, j)) & \forall k \text{ from } i \text{ to } (j-1) \\ 0 & \text{if } i=j. \end{cases}$

my answer

Correct answer -
$$\begin{cases} \min [MCM(i, k) + MCM(k+1, j) + \text{no. of multiplications seq. to multiply the matrices } (i, k+1, j)] & i \leq k < j \\ 0, & \text{if } i=j \end{cases}$$

0/1 Knapsack Problem

objects	ob ₁	ob ₂	ob ₃	n=3
Profits	5	3	4	M=5
Weights	3	2	1	

Cosmos

Manually:-

Case 1:- ob₁, ob₃ ∴ profit = 9

Case 2:- ob₁, ob₂ ∴ profit = 8

Case 3:- ob₂, ob₃ ∴ profit = 7

Using Greedy:-

ob₁ → $\frac{5}{3} = 1.66$ take ob₃ first, capacity left = 4

ob₂ → $\frac{3}{2} = 1.5$ take ob₁, 2nd capacity left = 1.

but we can't take fraction ∴ we can't take fraction of ob₂.

ob₃ → $\frac{4}{1} = 4$

Q n=3 M=15

Objects	ob ₁	ob ₂	ob ₃	ob ₄	ob ₅
profits	50	29	33		
Weight	10	6	7		
Profit/Weight	5	4.83	4.7		

Using Greedy:-

take ob₁ 1st, capacity left = 5

we can't take any more.

∴ profit = 50

Manually:-

ob₂ & ob₃ → profit = 62
ob₁ → " = 50

* Note:- Greedy algo will not give optimal soln. for 0/1 Knapsack, so we use dynamic programming which will cover all possible combination.

n=5 M=10

Objects	ob ₁	ob ₂	ob ₃	ob ₄	ob ₅
Profits	7	2	1	6	12
Weights	3	1	2	4	6

e.g. 01KP(5,10) ^{s objects to choose from {1 to 5}}
^(capacity of knapsack)

01KP(4,10)
^{to choose 4 objects from {1 to 4}}
^(1 excluded)

01KP(n,m) = max profit we will get in 0/1 Knapsack problem
here n = no. of objects & m is the capacity of knapsack.

among which
we can select
objects to be put
into knapsack

current
capacity.

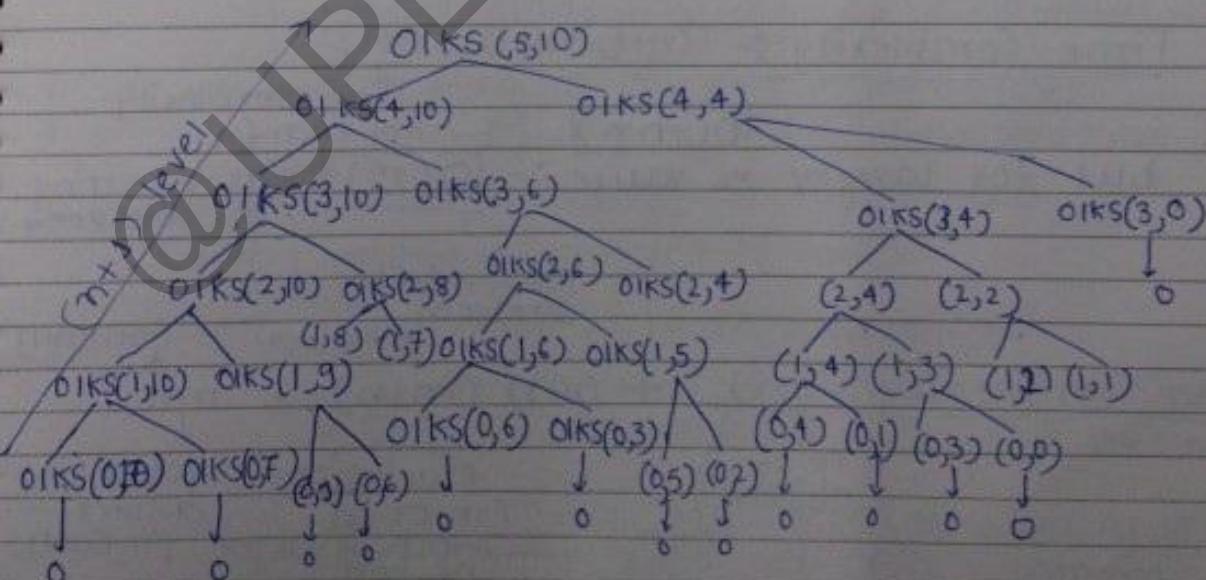
Cosmos

$$01KS(n, m) = \begin{cases} 0 & \text{if } (n) \text{ or } (m) = 0 \\ \max \left\{ \begin{array}{l} 01KP(n-i, m-w_i) + b_i \quad \forall i \\ 01KS(n-1, m) \end{array} \right. & \text{if } w_n > M \\ \max \left\{ \begin{array}{l} 01KS(n-1, m-w_n) + p_n \\ 01KS(n-1, m) \end{array} \right. & \text{if } w_n \leq M \end{cases}$$

```

01KS(n,m) {
    if (n == 0 or m == 0)
        {return 0;}
    else if (w_n > M)
        {01KS(n-1,m);}
    else
        {a = 01KP(n-1,m-w_n) + p_n ;
         b = 01KS(n-1,m);
         return (max(a,b));}
}

```



Cosmos

1

0/1 Knapsack of (n, m) will generate n -level (approx.) almost complete binary trees.

$\therefore 2^n$ function calls & every fn. call takes $O(n)$ time [as we have to make only 1 comparison in max. fn.]
W/o using Dynamic :- $[O(2^n)]$

* In above rec. tree some fn. calls are repeating, so we perform dynamic programming, which calls distinct fn. calls exactly once.

Q. Q1 Knapsack contains how many distinct fn. calls

01 KS (5, 10)

↓
it can decrease in 6 ways
 $(5, 4, 3, 2, 1, 0)$ the weight can decrease acc. to the weights of the object, but maximum it can have values from 10 to 0, i.e. 11

$6 \times 11 = 66$ distinct functions (max.)

$\therefore 01KS(n, m) \therefore$ distinct fn. calls = $(n+1)(m+1)$
 $(n+1)(m+1)$

Time Complexity :- $(n+1)(m+1) \times O(1)$

$\therefore [O(mn)]$

time complexity of each fn

but for larger n value :- $[O(2^n)]$ (as repeating fn. are very less.)

NP Complete problem

max. (m, n)

$(m+1)(n+1)$

Space Complexity :- $n \times k + (mn) (m+n) + mn$

no. of objects
size of each object

stack size
(m or n
which is larger of both)

table size
(distinct fn. calls)

Cosmos

Sum of Subsets Problem :-

$$S = \{70, 20, 90, 50, 25, 15, 40, 30\}$$

$M = 200$

Q. To find a subset whose sum is 200.

$$S_1 = (50, 90, 50, 40)$$

$$S_2 = (70, 90, 40)$$

$$S_3 = (70, 90, 25, 15)$$

$$S_4 = (10, 20, 25, 15, 40, 30)$$

SOS(8,200)

Set contains 8 elements

the subset sum is 200

200
(or we can
say that the
remaining value
to make it 200),

e.g. $SOS(80, 200)$

means set is over
but no new element
is chosen.

SOS(5,0)

means 5 elements are left but we get the subset whose sum is 200.

• SOS(4, 100)

means 4 elements are left & we need 100 more to make the subset sum to be 200.

$$SOS(n, m) = \begin{cases} SOS(n-1, m) & \text{if } m > h_n \\ \text{if } m < h_n \text{ but } m \neq 0 \\ \left(\begin{array}{l} SOS(n-1, m-h_n), S = S \cup h_n \\ SOS(n-1, m) \end{array} \right) & \cdot \text{initial value of } S = \emptyset \\ S \text{ (return subset)} & \text{if } m = 0. \end{cases}$$

- initial value of n :- no. of elements in the subset.
- ? " " " m :- M (e.g. M=200 in above example.)

$SOS(n, m)$ { -1 (error message) if $n=0$ || $m \neq 0$
 S (return subset) if $m=0$
 $SOS(n-1, m)$ if $m > w_n$ $w_n > m$
 $(SOS(n-1, m-w_n), S = SU w_n)$ - if $m \leq m-w_n$
 $SOS(n-1, m)$ - if $w_n \leq m$

SOS(n, m):- Sum of Subsets of (n, m) is finding a subset from given set of ' n ' elements whose sum is ' m '.

Cosmos

★ The rec. relm makes n -level binary tree which have 2^n nodes.

∴ Time Complexity :- $2^n \times O(1)$

$\xrightarrow{\text{time complexity of each fn.}}$

$= O(2^n)$.

★ Using Dynamic Programming:-

SOS (n, m)

this
fan decrease
in $(n+1)$ ways
e.g. $n=8$

∴ it can be $(8, 7, 6, \dots, 1, 0)$

this can decrease
into $(m+1)$ ways [maximum]
[e.g. in above example
 $m=200$, it can be

$(200, 199, 198, \dots, 2, 1, 0)$
but many of these values
are not possible, but m
can take max $(m+1)$ values.

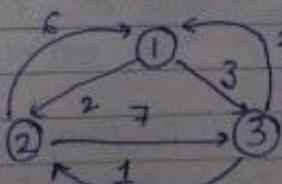
Time Complexity :- $[O(mn)]$

when n is large $\approx [O(2^n)]$

0/1 Knapsack problem can be polynomially reducible to Sum of Subsets problem, so both are NP Complete.

Space Complexity :- $\frac{1}{2} b$ size Stack size distinct fn.
 \downarrow \downarrow \downarrow
 $(n+1)$ + $\frac{n}{2}$ $(n+1)$ $(m+1)(n+1)$
 $= [O(mn)]$

III pairs Shortest Path



- ① positive edge weights
 $|V| * \text{Dijkstra algo} \Rightarrow V \cdot (V+E) \log V$
- ② negative edge weight & negative weight cycle :-
 $|V| * \text{Bellman Ford}$
 $= V(VE)$

Cosmos

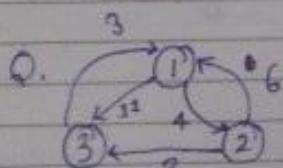
$A^k(i,j) = \min$ cost required to go from vertex i to vertex j with the intermediate vertices $K \in \{0, 1, 2, 3, \dots, k\}$

A^0	1 2 3	A^1	1 2 3	A^2	1 2 3	A^3	1 2 3
1	0 2 3	1	0 2 3	1	0 2 3	1	0 2 3
2	6 0 7	2	6 0 7	2	6 0 7	2	6 0 7
3	2 1 0	3	2 1 0	3	2 1 0	3	2 1 0

$$A^1(2,3) = \begin{cases} A^0(2,3) \\ A^0(2,1) + A^0(1,3) \end{cases} \text{ via 1}$$

this means path from 2 to 3 via 1

$A^2(2,3) \rightarrow$ this means path from 2 to 3 via 1 & 2.



A^0	1 2 3	A^1	1 2 3	A^2	1 2 3
1	0 4 11	1	0 4 11	1	0 4 6
2	6 0 2	2	6 0 2	2	6 0 2
3	3 0 0	3	3 7 0	3	3 7 0

A^3	1 2 3
1	0 4 6
2	5 0 2
3	3 7 0

$$\cdot A^2(2,3) = \min \{ A^1(2,3), A^1(2,2) + A^1(2,3) \}$$

via 0, 1, 2 from A^2 .

$$\cdot A^3(1,2) = \min \{ A^2(1,2), A^2(1,3) + A^2(3,2) \}$$

via 0, 1, 2, 3 from A^3 .

[via 0 means direct path]

, all these are distinct function calls.

$\therefore V^2 \times V$ no. of times

distinct fn calls (each fn call of O(1) time)

Cosmos

All pairs shortest path ($A^0; n$)

{ for $(k=1 \text{ to } n)$

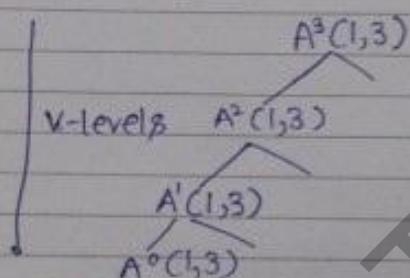
{ for $(i=1 \text{ to } n)$

{ for $(j=1 \text{ to } n)$

$$A^k(i,j) = \min \{ A^{k-1}(i,j), A^{k-1}(i,k) + A^{k-1}(k,j) \};$$

Time Complexity:-

$$\boxed{O(V^3)}$$



Space Complexity:-

$$V + V + V^2 = O(V^2)$$

$\tilde{\alpha}[\beta]$ matrix
 A^0

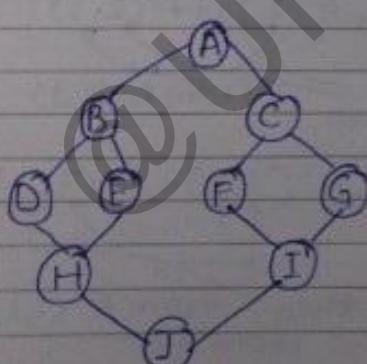
Stack size
(V-levels)

table size
(Create table
like $A^1 A^2$, $A^2 A^3$)

Graph Traversal

① Breadth First Traversal (BFT)

② Depth First Traversal (DFT)



BFT

A - B - D - H
A - B - C - D - E - F - G - H - I - J

DFT

A - B - D - F - G - C - E - I - J - H

BFT (v)

{ Visited(v) = 1;

add(v, Q);

while (Q is not empty)

→ while loop is executing
'v' times

Cosmos

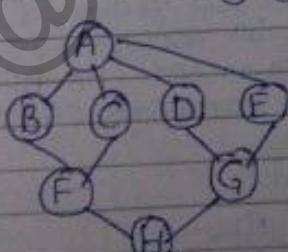
```
{ x = delete(Q); pointf(x);
  for all w adj. x → at max. each vertex is
    { if (w not visited) adjacent to each other
      visited(w) = 1;
      add(w, Q);
    }
  }
```

Note 1:- In order to implement BFT, we are using queue as the data structure.

Time Complexity :- $V(V+E)$ → each vertex is connected to each other vertex
V times while loop each vertex is connected to only one vertex
 $= V + V^2$
 $= V + E \rightarrow O(V+E)$ or $O(V+E)$
• Best Case : - $O(V)$
• Worst Case : - $O(E)$ ↑ whichever is greater.

* BFT is also known as Level Order Traversal.

Consider following graph : -
Give 4 diff. BFT's



① A-B-C-D-E-F-G-H
② A-B-C-D-G-F-H

③ A-C-B-D-E-F-G-H
④ A-D-E-B-C-G-F-H

Cosmos

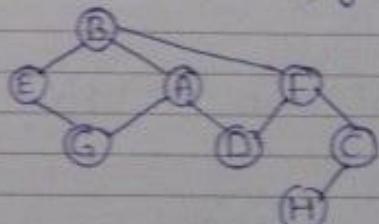
Starting from C:-

C - A - E - B - D - E - H - G

Starting from H:-

H - E - G - B - C - D - E - A

Q Consider the following Graph:-



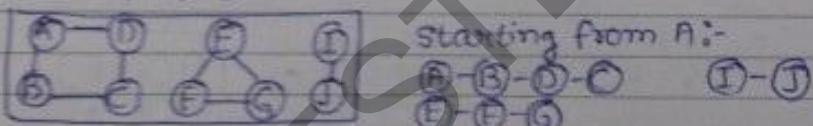
Give 4 diff. BFT's starting from H.

- 1 H - C - F - D - B - A - E - G
- 2 H - D - F - G - B - A - E - G
- 3 H - C - G - B - D - E - A - G
- 4 H - C - F - D - B - A - E - G

only 3.

Applications of BFT:-

$G(V, E)$



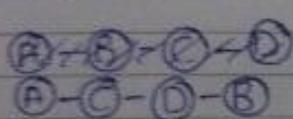
Starting from A:-

A - B - D - C I - J
E - F - G

D) Using BFT, we can check whether the graph is connected or not.

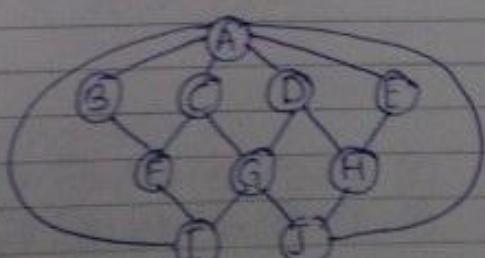
D) To obtain the no. of connected components, we use BFT.

[Connected Component :- maximal Subgraph which is connected] $\rightarrow O(V+E)$

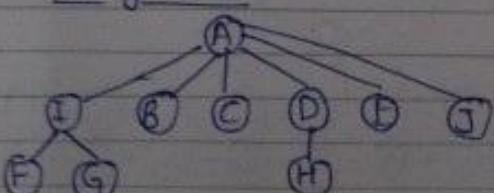


In a directed graph, if we come back to vertex where we have started the BFT, then graph contains cycle.

D)



Using BFT

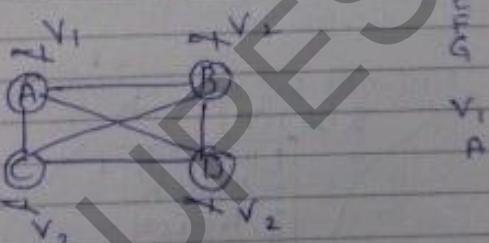
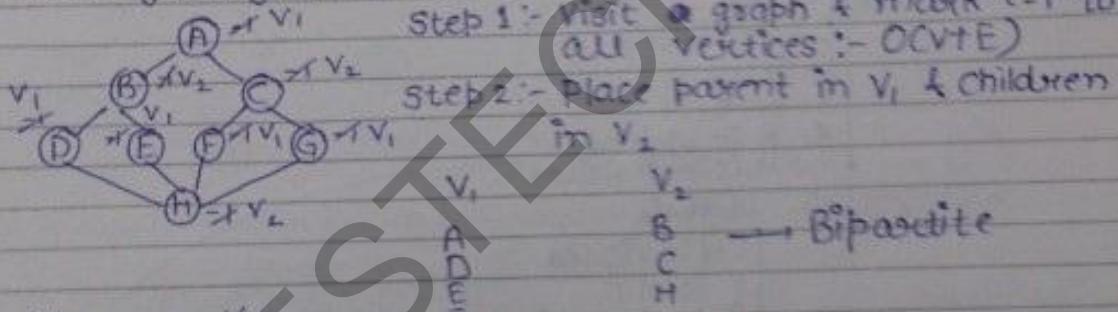


★ Any new problem is given in GATE about Graph, most of the times it is BFT & DFT.

In the given unweighted graph (all edge weights are same), to find out shortest path from the given source, we use BFT algorithm.

★ If given graph is unweighted then
Dijkstra $\rightarrow O[(V+E)\log V]$
Bellman-Ford $\rightarrow O(VE)$
BFT $\rightarrow O(V+E)$
BFT takes shortest time.

⑤ To check given graph is Bipartite or not we use BFT algorithm



V_1 : B, C
 V_2 : A, D, F

→ Not a bipartite.
D (as C & D are adjacent to B & are in V_1).

Depth First Traversal (DFT):-

```
DFT(v)
1 if visited(v)=1;
2 point(v);
3 for all w adj to v
    {if(w is not visited)
        5. DFT(w);}
```

★ DFT will take Stack as a data structure.

O/p:- A B D H E F C G

Cosmos

DFT(A)

1. A is visited
2. Print A
3. W = B, C

4. B is not visited C is now visited
5. DFT(B)

1. B is visited

2. Print B

3. W = A, D, E

4. A is visited E is visited now
D is not visited

5. DFT(D)

1. D is visited

2. Print D

3. W = B, H

4. B is visited

H is not visited

5. DFT(H)

1. H is visited

2. Print H

3. W = D, E, F, G

4. D is visited

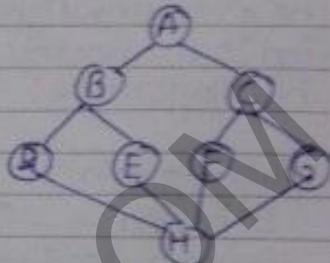
5. DFT(E)

1. E is visited

2. Print E

3. W = B, H

4. Both B & H visited



1. F is visited

2. Print F

3. W = G, H

4. H is visited

5. DFT(C)

1. C is visited

2. Print C

3. W = A, E, G

4. A & E is visited

5. DFT(G)

1. G is visited

2. Print G

3. W = C, H

4. Both visited

* No. of function calls = no. of vertices
in $= V$

* In worst case, each function call 'for loop' is repeated $(V-1)$ times in case of complete graph.

* In best case, in each fn. call 'for loop' is repeated only once.

Cosmos

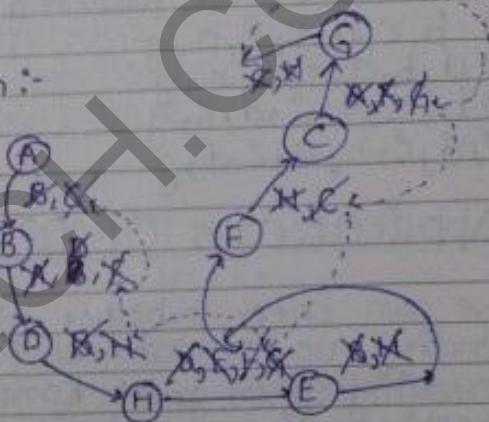
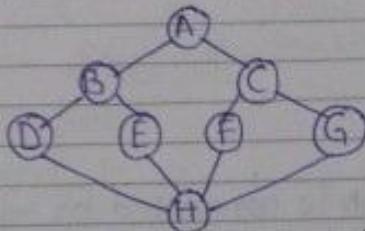
Note:- In order to implement DFT, we uses stack data structure.

*Time Complexity:-, Best case

$$\Theta(V) \quad \checkmark(1+(V-1)) = \boxed{\Theta(V+E)} \quad \text{as } V^2 \approx E$$

V fn. calls worst case

Q. Consider the following graph:-

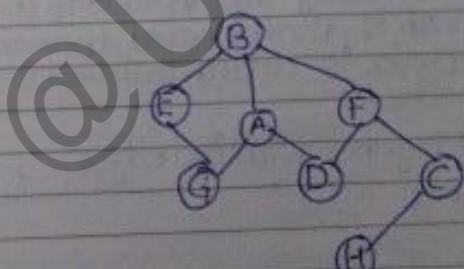


H-E-B-A-C-G-F-D

D-H-F-C-G-B-E

Q. Consider the following graph :-

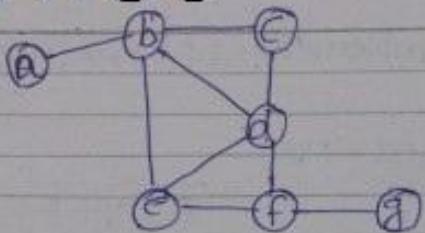
Give 4 diff. DFT's starting from H.



- 1 H-C-F-D-A-B-E
- 2 H-C-F-B-E-G-D
- 3 H-C-F-D-A-G-E
- 4 H-C-F-B-A-D-G
- 5 H-C-F-B-A-D-G-D

Q. Consider the following graph:-

Cosmos

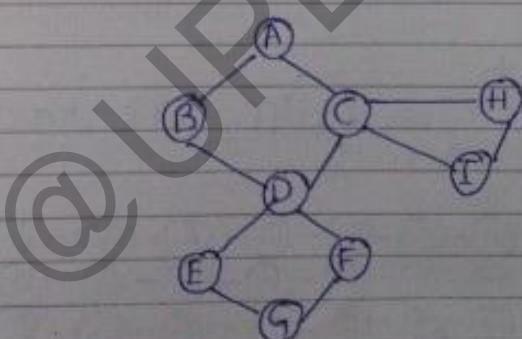


Which one of the following is correct DFT?

- ~~(a)~~ b, c, d, e, f, a, g
(b) d, b, a, e, f, c, g
(c) b, a, e, c, d, f, g
~~(d)~~ d, e, b, a, c, f, g

Applications Of DFT

- ① We can check whether given graph is connected or not.
- ② Finding no. of connected components.
- ③ Checking given graph contain cycle or not.
- ④ Checking given graph is strongly connected or not.
- ⑤ Mo. Finding no. of articulation points or not.
- ⑥ Finding no. of bridges.



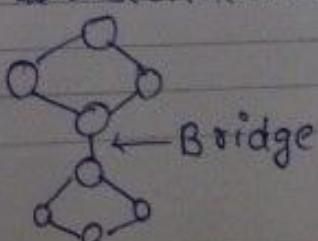
Articulation pts:-

In the given connected graph, by deleting any vertex if the graph is disconnected, then the vertex is called articulation point.

* together with its edges
e.g. C, D

Bridges:-

In the given connected graph, by deleting any edge, if the graph is disconnected, then edge is called bridge.



Date

★ In order to convert recursive procedure to iterative procedure (or non-recursive procedure) requires stack data structure.

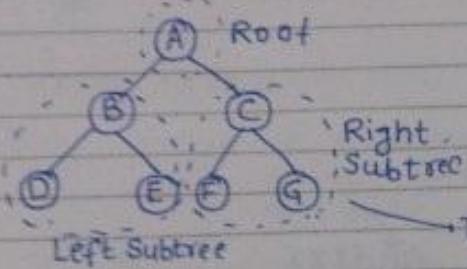
28.07.12 Tree Traversal

- ① Inorder (LST Root RST)
- ② Preorder (Root LST RST)
- ③ Postorder (LST RST Root)

Time taken for tree traversal: $O(V+E)$ no. of edges in tree are $(V-1)$

from graphs

$$\therefore O(V + V-1) \Rightarrow O(V)$$



preorder :- A B D E C F G

postorder :- D E B F G C A

inorder :- D B E A F C G

There are V function calls.

Preorder(t)

```
{ printf(t->data);  
Preorder(t->leftchild);  
if (t->leftchild != NULL)  
{ printf(t->leftchild->data);  
Preorder(t->leftchild->leftchild);  
Preorder(t->leftchild->rightchild);  
}
```

Postorder(t)

```
{ if (t == NULL)  
{ postorder(t->leftchild);  
postorder(t->rightchild);  
printf(t->data);  
}
```

inorder(t)

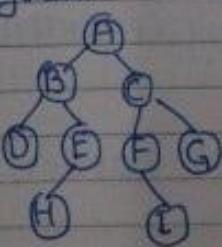
```
{ if (t != NULL)  
{ inorder(t->leftchild);  
printf(t->data);  
inorder(t->rightchild);  
}
```

★ Note:- If the binary tree contain V nodes, inorder, preorder & postorder traversal takes $O(V)$ time.

Cosmos

Q1. Consider the following C program.

```
Aorder(t)  
{ if (t != NULL)  
{ printf(t->data);  
Aorder(t->rightchild);  
printf(t->data);  
Aorder(t->leftchild);  
printf(t->data);  
}
```

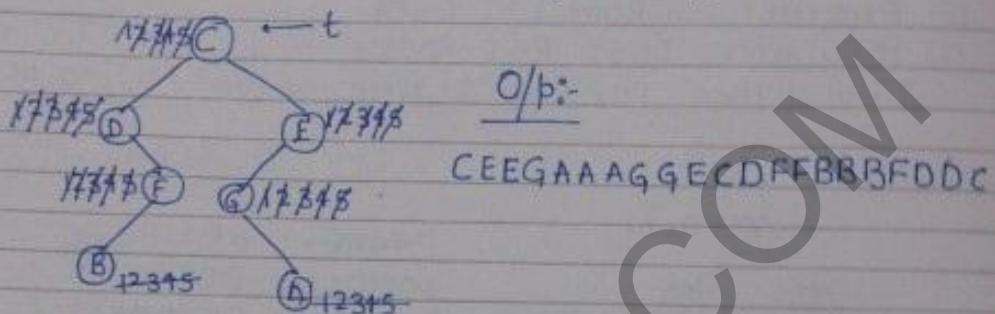


O/p:-

A E G G G C F I I I F F C
B E E H H H E B D D D

Cosmos

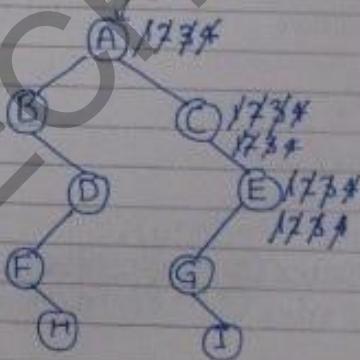
Q. Apply the above code on the following binary tree:-



Q. Consider following C program:-

B(orders)

```
1. if(t!=NULL)
2. Border(t->right);
3. printf(t->data);
4. Border(t->left);
5. printf(t->data);
```



O/p:-

EECEEECAEECECA

Q. Consider following C program:-

A(orders) Border(t)

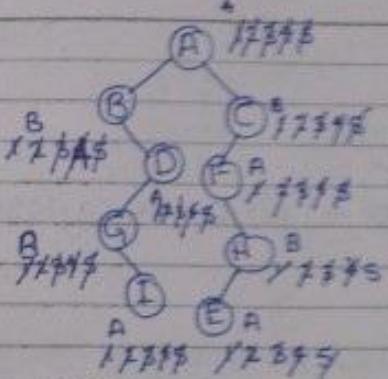
```
1. if(t!=NULL)
2. printf(t->data);
3. Border(t->right);
4. printf(t->data);
5. Border(t->left);
6. printf(t->data);
```

Border(t)

```
1. if(t!=NULL)
2. printf(t->data);
3. Aorder(t->left);
4. printf(t->data);
5. Aorder(t->right);
6. printf(t->data);
```

start from A(Aorder) Border(t)

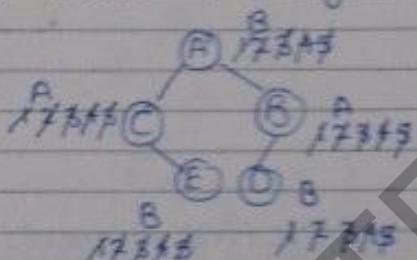
Cosmos



O/p:-

ABCF
ACFH EEEHHF ACCABB DDGGG BAA
BIIIGDBA

Q. Apply above C program starting from Border



O/p:-

BAAEEFH GBB
ACEEFCCA BBDDDB A

Q. Consider the following binary tree :

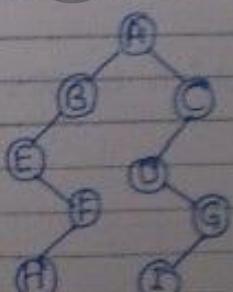


preorder :- ABDFHCEGI

inorder :- BFHDAEIGC

postorder :- HFDBIGECA

Q. Consider the following binary tree :



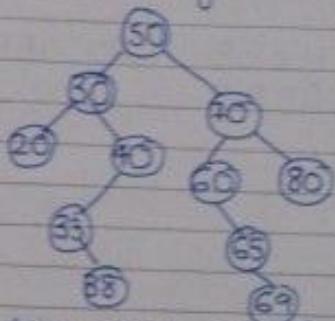
preorder :- ABEFHCDGI

inorder :- EHFBAIDIGC

postorder :- HFEBIGDCA

Cosmos

Q. Consider following BST :-



Inorder :- 20, 30, 33, 38, 40, 50, 60, 65, 69, 70, 80

20, 30, 33, 38, 40, 50, 60, 65, 69, 70, 80

* Inorder traversal of binary Search tree will always give ascending order.

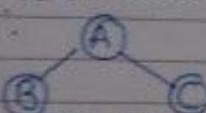
Q.

pre :- A, B, D, F, H, C, E, G, I
in :- B, F, H, D, A, E, I, G, C

Step 1 :- identify the root, it will be the first element of preorder.

Step 2 :- now, check A in inorder, left to A is LST of A & right to A is the RST of A.
∴ LST :- B, F, H, D
RST :- E, G, I

from preorder B comes first from B(F(H(D)))
I from preorder C comes first from E(G(I)) (RST).

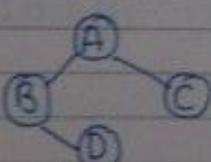


Step 3 :- Inorder to find LST & RST of B check inorder see left of B in inorder

LST :- NULL

RST :- F, H, D preorder

from preorder we check from F, H, D which comes 1st.
D comes 1st.



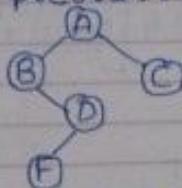
Cosmos

Step 4 :- Checking LST & RST of D (from inorder)

LST :- H, F

RST :- NULL

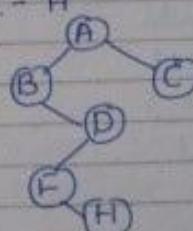
from preorder F comes 1st from H, F.



Step 5 :- Checking LST & RST of F (from inorder)

LST :- NULL

RST :- H

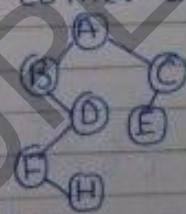


Step 6 :- Checking LST & RST of C (from inorder)

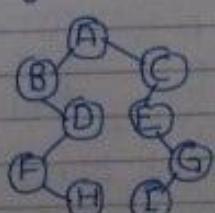
LST :- E, I, G

RST :- NULL

Now E comes 1st from E, I, G from preorder



Step 7 :- Similarly :-



Note :-

If postorder & inorder are given, then procedure is similar, the only diff is that we have to check the last element from postorder (i.e. the among the elements of a subtree).

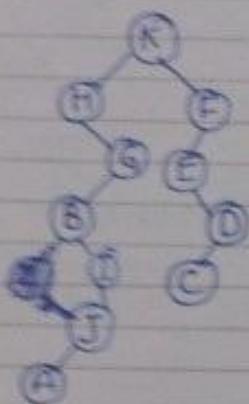
Cosmos

Time Complexity

$O(n^2)$ (for constructing the tree from pre/post & inorder)

pre :- K, H, G, B, I, J, D, F, E, D, C
in :- H, B, I, A, J, G, K, E, C, D, F

because for every element, we have to search all n elements & there are total n elements.



K:- LST:- H B I A G
RST:- E C D F

F:- LST:- ~~H B I A G~~ E C D
RST:- NULL

E:- LST:- NULL
RST:- C D

D:- LST:- C
RST:- NULL

H:- LST:- NULL
RST:- B I A J G

G:- LST:- ~~H B I A J~~ G
RST:- NULL

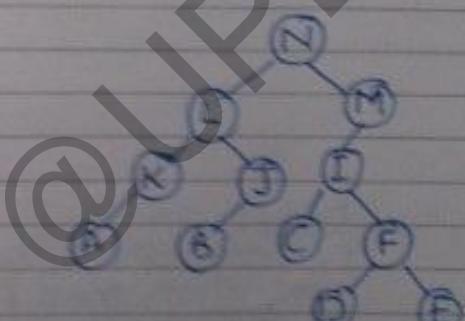
B:- LST:- ~~H B I A J~~ G
RST:- I, A, J

I:- LST:- NULL
RST:- A, J

T:- LST:- A
RST:- NULL

post :- L, A, M, K, G, D, B, J, I, F
in :- L, K, M, A, E, D, O, N, I, J, B
post :- A, K, B, I, L, D, E, F, I, M, N
in :- A, K, L, B, J, N, C, I, D, F, E, M

N:- LST:- A K L B J
RST:- C T D F F M



L:-
LST:- A K
RST:- B J

J:-
LST:- B
RST:- NULL

K:- LST:- A
RST:- NULL

M:- LST:- C I D F E
RST:- NULL

I:- LST:- C
RST:- D F E

F:- LST:- D
RST:- E

B/C:- LST:- NULL
RST:- NULL

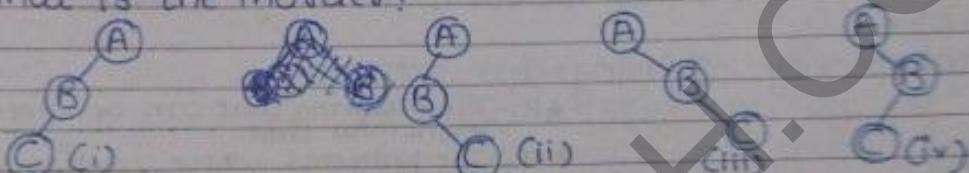
Cosmos

Note:- In order to construct unique Binary Tree from the given (preorder & inorder) or (inorder & postorder) requires $O(n^2)$ [worst case & average case].

Q. pre:- A, B, C

post:- C, B, A

What is the inorder?



Note:- For the given preorder & postorder, unique binary tree is not possible, i.e. ∵ inorder is not available, ∴ inorder is necessary to construct unique binary tree.

Time Complexity:- There is no algo to construct unique Binary Tree for the given preorder & postorder other than Brute Force, so it will take $O(2^n)$ times.

* If preorder & postorder is given & we are asked to find inorder & 4 options

Q. A BST is traversed in preorder & values are printed in the following order:-

preorder:- 50, 20, 30, 25, 40, 60, 58, 70, 65, 80

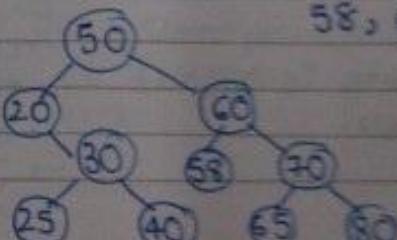
what is the postorder:-

50 → root

50 :- LST / 20, 30, 25, 40
RST / - 60, 58, 70, 65, 80

postorder:- 25, 40, 30, 20, 58, 65,
80, 70, 60, 50

inorder of BST in sorted way
inorder:- 20, 25, 30, 40,
58, 60, 65, 70



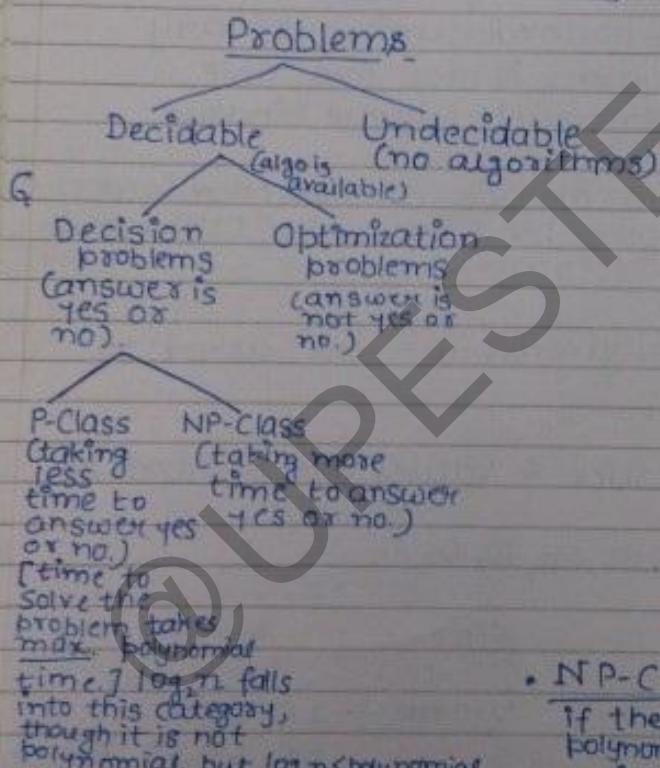
Cosmos

* NPC problems doesn't apply directly to Optimization problems, but rather applies to decision problems, in which the answer is simply 'yes' or 'no' (or '0' or '1').

(Note:- In order to construct unique B.T. from given (inorder & postorder) or (inorder & preorder) requires $O(n \log n)$ time, if inorder is already sorted.

- ① → To sort inorder :- $n \log n$
- ② → To search every element in inorder, we can perform Binary Search :- $\log n$
 - & every element (n) will perform binary search, $n \log n$
 - time complexity :- $O(n \log n)$

P, NP, NPH, NPC



* Every P problem is NP, but not vice-versa.

* P:- The problems that can be solved in polynomial time.
* NP:- The problems whose solution when given can be verified in polynomial time.

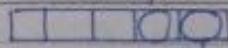
* A problem 'A' is in P-class if there exist a deterministic polynomial time algo to solve that problem.

* P-Class problems:-

1. Binary Search :- $O(\log n)$
2. Linear Search :- $O(n)$
3. Job Sequencing with deadline :- $O(n^2)$
4. Quick Sort :- $O(n^2)$
5. LCS (m, n) :- $O(mn)$
6. MST-prims :- $O(V+E)\log V$
7. Travelling Salesperson problem :- $O(2^n)$ - X → so it is not a P-class.
8. 0/1 Knapsack :- $O(2^n)$ - so it is not in p-class.
9. Sos (m, n) :- $O(2^n)$ - so it is not in p-class.
10. matrix multiplication (strassen) :- $O(n^{2.8})$

- * NP-Class:- A problem 'A' is in NP-class if there exist a non-deterministic polynomial time algo to solve that problem.
- Linear Search → $O(1)$ in case of NP,
 - so without
 - Binary Search → $O(1)$
 - Job sequencing with deadline → $O(n)$

in this slot, guess
the best slot



If we can solve a problem w/o guess in polynomial time, then we can solve it with guess in polynomial time.

.. n-job slots

in this slot,
guess the best
job

.. $O(n)$

① Quicksort :-

take 1st pivot & guess its position $\rightarrow O(1)$

similarly other $(n-1)$ elements $\therefore nO(1) = O(n)$

⑤ LCS(m, n) :- $O(mn)$

⑥ MST-prim's :- take one vertex & pick the smallest edge (guess) which will take $O(1)$ time, there are ' V ' vertices, $[O(V)]$

⑦ Traveling Salesperson Problem:- $[O(V)]$ =

⑧ 0/1 Knapsack problem:-

for every object we have two choices

(-----)
n objects (we can either take it or leave it.)

\therefore guessing to take it or leave it, $\therefore O(1)$ time.

n-objects :- $[O(n)]$

① SOS(n, m) : $O(n)$

⑥ Strassen Matrix Multiplication - $O(n^{\log_2 7})$

Non-determinism :- Takes \max polynomial time, but only guesses & no proofs.

★ Every P-class problem is NP class problem, because P-class (with proof) are taking polynomial time then when done without proof it will take less than or equal poly time (like that in NP class).

★ every P-problem is also a NP-problem, but every NP-problem \nsubseteq need not be a P-problem (e.g. Travelling Salesperson is NP but not P.)

P ~~C~~ N P

P C N P

acc. to the above
Statement.

Cosmos

* If we solve the Travelling Salesperson problem, then & other 2^n complex problems, then
 $P = NP$

So, by now

$P \subseteq NP$

We can't say $P = NP$ & $P \subseteq NP$ alone

$\therefore P \subseteq NP$

have to be proved, area of open research.

- $PCNP \rightarrow$ it is true when someone proves that Travelling Salesperson problem can't be solved in less than $2^{n-1} n!$ time.
- $P = NP \rightarrow$ it is true when someone proves that Travelling Salesperson problem can be solved in polynomial time.

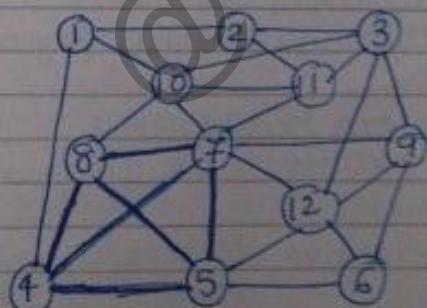
* Any pure P-Class :- Any problem is solved in polynomial time without any guess.

* NP-Class :- Any problem is solved in polynomial time with guess.

* An algo with guess gives time complexity of $O(2^n)$, then it is not P, but we can't say anything about whether it is NP or not.
that's why $P \subseteq NP$

Eg:- Graph $G(V, E)$, integer k

Ques. Does G contain k -clique or not?



Q. Does the given graph contain subgraph which is k -vertex complete graph

↑
this problem is not P.
because it takes $O(2^n)$ time complexity.

Cosmos

* with guess (NP-class) we choose a subgraph with k -vertices in $O(1)$ time & then verify each vertex will take $O(V)$ time [where V - no. of vertices in original graph.]

* NP means :- if we are given correct soln. to a prob. then we can verify the soln. in max. polynomial time (we don't solve the problem.)

* P means :- we can solve the problem in polynomial time.

e.g. Linear Search :- solution

$O(n)$

Verification

(whether the element search is what we wanted or not.
∴ verification will take $O(1)$ time.)

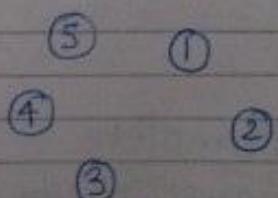
① P-Class :- any problem is solved (for all I/P's) we can say yes/no in polynomial time, then the problem is called as P-class.

② NP-Class :- any problem is verified (correct input only) in polynomial time is called NP-class.

P ⊂ NP
that can be solved verified in max. polynomial time.
that can be solved in max. polynomial time.

★ Any problem that can be easily solved (means problem can be solved in max. polynomial time) & it can also be verified easily (verification can be done in max. polynomial time). Every P problem is a NP problem but no vice-versa.

Polynomial Time reduction :-



- 3-SAT was the 1st NP problem discovered by Stephen Cook. It took 3 years.
- Next 3000 problems were discovered in next 10 years.

Cosmos

• A is an unknown problem & B is known problem, if A is polynomially reducible to B, then

if B is NP takes 2^n time,

then A will take $O(n^c) + O(2^n) = O(2^n)$ c :- constant.

* conversion must be done in polynomial time.

- if B is NP, then A is NP.

- if B is P, then A is P.

* If conversion takes more than polynomial time, then A & B don't have similar properties.

NP-Hard :-

A problem L is said to be NP-Hard if & only if L' is

- polynomially reducible to L for all $L' \in NP$.

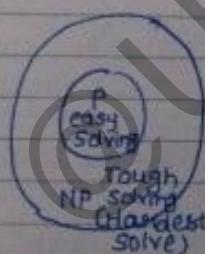
$$L' \leq_p L, \forall L' \in NP$$

$$P \subseteq NP$$

• If A \in NP, then it can only be in only NP or outside NP.

• If A \in P (can be solved & verified in max. polynomial time)

• If A \in NP (then it is dilemma whether that it can be in both P or only NP.)



To prove our problem is NP-Hard, then all problems in NP should be reducible to our problem in max. polynomial time.

* all hardest problem in NP is reducible to L, then L is also Hardest problem.

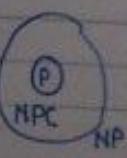
NP-Complete :-

A problem L is said to be NP-Complete

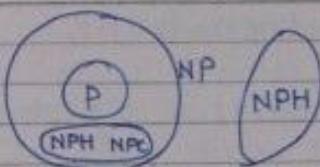
• L is NP-Hard. (or)
• L \in NP.

A is NPC
when
A \notin P
A \in NP

(Hardest problem
inside NP (but not
in P) is NPC)

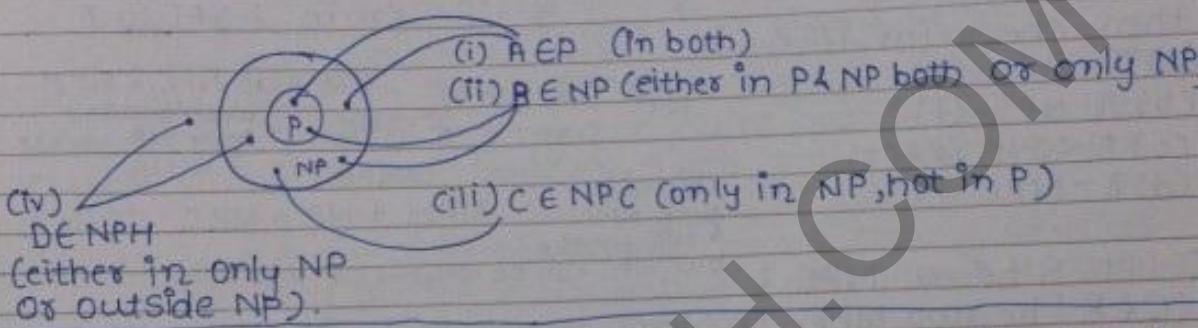


- $A \in NP$ → means A is in NP but may or may not be in P.
- $A \in NPC$ → means $A \in NP$ but not in P.
- $A \in NPH$ → $A \in NPC \wedge A \notin NP$



(a)

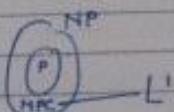
Cosmos



Note 1: If L is NPC & $L \leq_p L'$ then L' is NPH. (Hardest)

(L is polynomially
reducible to L')

NPC, NPH,
undecidable



★ Hardest language →

(L) is reducible
to L' , then L' is hardest language

Note 2: If L is NP & $L' \leq_p L$ then L' is NP. (Easier)

(right to left)
Unknown on left.

P, NP, decidable

★ If languages are
reducible to our
easy language, then
those languages are easy.

Q1. A, B & C are 3-decisions problems. Let A be a NPC, then which are true/false?

(a) $A \in NP \iff T$

(b) $A \in NP, L \leq_p A \iff T$

(c) If $C \in NP \wedge A \leq_p C$ then C is NPC (T)

(d) If $D \in NP$ and $D \leq_p A$ then D is NPC. (F)

polynomially

(c) $\rightarrow C$ is in NP & A is reducible to our problem C, then our problem is hardest, $\therefore C$ is NPC.

(d) $\rightarrow D$ is in NP & our problem D is polynomially reducible to NPC problem, but NPC doesn't work from right to left, but D is NP.

Cosmos

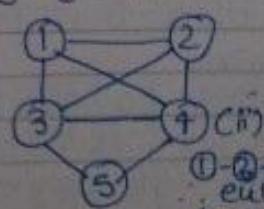
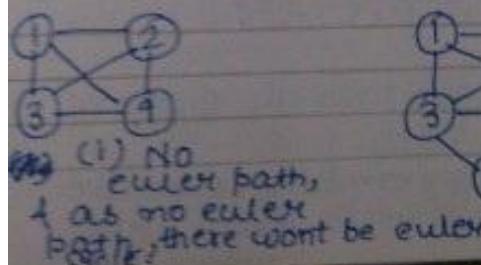
- (a) → if there is:- if $D \in \text{NP}$ & some $B \leq_p D$, then $B \in \text{NP}$.
- Q. Two people 'A' & 'B' have been asked to show that a problem Π is NPC.
 A shows polynomial time reduction from Π to 3-SAT.
 B shows " " " " from 3-SAT to Π .
 then check for T/F?
- (a) $\Pi - P$ (F)
 (b) $\Pi - \text{NP}$ (T)
 (c) $\Pi - \text{NPH}$ ~~BBQ~~ (T)
 (d) $\Pi - \text{NPC}$ (T)
- $\text{NP} \xleftarrow{\quad} \Pi \leq_p 3\text{-SAT}$
 $3\text{-SAT} \leq_p \Pi$
 $\text{NPH} \xrightarrow{\quad}$
- This side NPC & NPH
 doesn't work,
 only NP works.
 Π is NP
- $\text{NPH} \xleftarrow{\quad}$
 This side
 both NPH
 & NPH works.
 but NPC can be converted into NPH.
- Q. Let S be a NPC &
 ($Q \neq R$) be two other problems known to be in NP, If $S \leq_p R$ &
 $Q \leq_p S$, then T/F?
- (a) $R \in \text{NPC}$ (T)
 (b) $R \in \text{NPH}$ (F)
 (c) $Q \in \text{NPC}$ (F)
 (d) $Q \in \text{NPH}$ (F).
- $S \leq_p R \rightarrow R \text{ is NPH}$
 but R is in NP
 $\therefore R \text{ is in NPC.}$
- $Q \leq_p S \rightarrow$ if our problem is polynomially
 reducible to Harder problem,
 Q is NP.

Euler Graph: (If both euler path & euler cycle are possible).
Path: sequence of zero or more edges. (not disconnected)

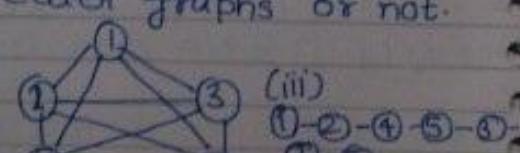
Euler Path: It is a path which covers every edge of the given graph exactly once.

Euler Cycle: It is a closed Euler Path (starting vertex is also the ending vertex).

Check the following graphs are euler graphs or not.



0-2-5-4-0-3-1-0
 euler path
 but no euler
 circuit.



Euler
 Path &
 Euler
 Circuit

Cosmos

* If we have two vertices with odd degree & rest others with even degree, then if we start from either of the odd degree vertices we will end up completing a ~~euler path~~ on the other odd degree vertex (we can't get a euler circuit). (ii) & if we start with an even degree vertex, we can't even get a euler path.

Note 1: In the given graph, every vertex degree is even, then to that graph both euler path & euler circuit is possible, so given graph is euler graph.

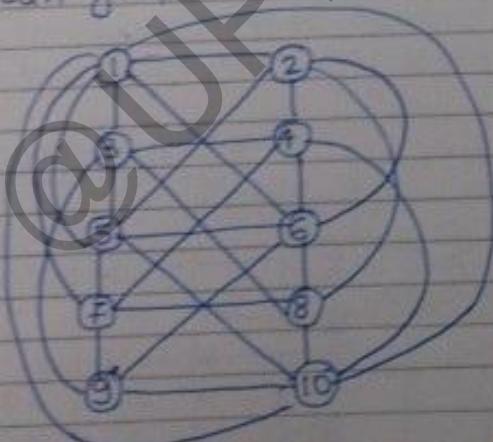
* Checking given graph is Euler Graph or not, there is $O(V^2)$ time complexity algo, so it is a P-class problem. (Checking degree of one vertex using adjacency list will take $O(V)$ time & we have to repeat this V times, complexity is $O(V^2)$)

Note 2: If the given graph contain exactly 2 vertices with odd degree then to that graph euler path is possible but euler circuit is not possible, given graph is not euler graph.

Note 3: If the given graph contain more than 2 vertices with odd degree, euler path & euler circuit both are not possible.

Hamiltonian Graph

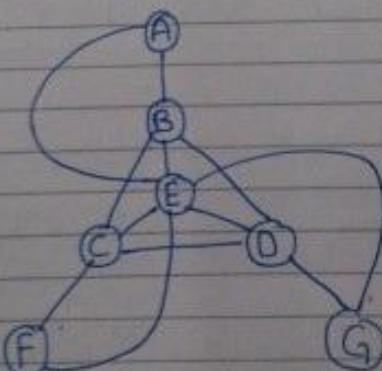
- Hamiltonian path: It is a path in which every vertex of a given graph is covered exactly once. (Starting & ending vertex is same)
- Hamiltonian cycle: It is a closed Hamiltonian path
- Graph containing both Hamiltonian Cycle & path is a Hamiltonian graph.



0 - 1 - 2 - 3 - 4 - 5 - 6 - 7 - 8 - 9 - 0

Hamiltonian path & cycle possible.

∴ Hamiltonian Graph.



A - B - C - D - E - D - G

- Hamiltonian path
- but no hamiltonian cycle.

* There is no algo to check given graph is Hamiltonian graph or not other than Brute force, so it is one of the NPC.

3-SAT (3 variable satisfiable problem)

$(x_1 \vee x_2 \vee x_5) \wedge (x_5' \vee x_{10} \vee x_1') \wedge (x_{1000} \vee x_8 \vee x_9) \wedge (x_{50} \vee x_{99} \vee x_{26})$
Note :- 3-SAT is NPC, but 2-SAT problem is P.

P-Class	NP-Class
① Shortest path	① Longest path.
② Euler	② Hamiltonian
③ 2-SAT	③ 3-SAT
④ Edge-cover	④ Vertex-cover

Cosmos