

## Fixed universe Successors

(1) Maintain a dynamic set ( $S$ ). e.g.  $n$  elements  
 (Fixed: universe) — we know the elements  
 universe  $U = \{0, \dots, n-1\}$

$S \subseteq U$  (elements of  $S$  belongs to  $U$ )

\* Insert ( $x \in U \setminus S$ ) insert an element from  $U$  in  $S$

\* Delete ( $x \in S$ ) delete.

\* Successor ( $x \in U$ ) (next element after  $x$  in  $S$ )

\* find the next element in  $S$ , larger than  $x$

\* predecessor ( $x \in U$ ) — previous element of  $x$  in  $S$ .

## Data Structure

say:  $U = \{0, 1, \dots, 15\}$

$S = \{1, 9, 10, 15\}$

Successor of 2  $\Rightarrow 9$

Successor of 1  $\Rightarrow 9$

Universe is fixed,  $S \subseteq U$

## Options

### I) Array

$S$	1	9	10	15
-----	---	---	----	----

NOT SORTED

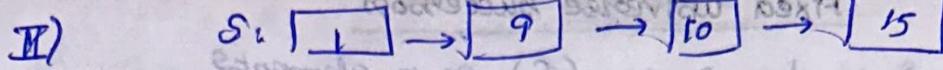
insertion, removal

Insert: Shift (need to)  $= O(n)$

Delete:  $O(n)$

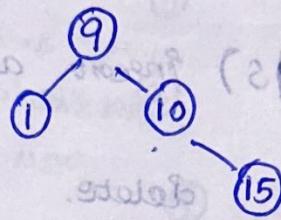
Successor ( $x$ )  $\Rightarrow O(n) \rightarrow$  Scan the array.

Linked list — Unordered.



'Insert / Delete' - Search goes the element'  $\rightarrow O(n)$   
 Successor / predecessor  $\Rightarrow O(n)$

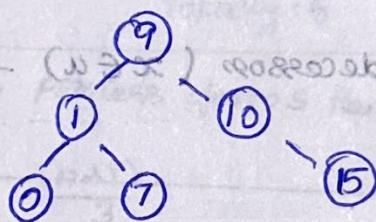
### III) Balanced binary search tree



Insert:  $\log n$  times

Delete:  $\log n$

Successor:



= Successor (7) [In order traversal]

= 9 (go to height)

$$P \leftarrow \frac{S_0}{S_1} \quad P \leftarrow \frac{S_1}{S_2}$$

=  $\log n$

$$\{S_1, \dots, S_{\log n}\} = n$$

$$\{S_1, S_2, P_1, P_2\} = 2$$

what we need:  $O(\log(\log n))$

$m = \log n$  elements (sorted)

↳ Binary search

↳  $O(\log \log n)$

Any sequence  
can give  
this order.

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

$$\sqrt{u} = \log u$$

$$\text{Successor} = O(\log(\log u))$$

$$\frac{1}{2} \log u$$

1975 → Invented by van sekey emde boas

Suggested a DS - Successor array / Predecessor

in the order of  $\log(\log u)$

1 ... 000

$$T(u) = T(\sqrt{u}) + O(1) \rightarrow O(\log(\log u))$$

I) Other type of arrays:

'Bit vectors'



maintains array of  $u$  (size)

$u:$

1		...		
0	(n)		15	

$$u(x) = \begin{cases} 1 & \text{if } x \in S \\ 0 & \text{otherwise.} \end{cases}$$

If elements  
In array  
→ 1  
else → 0.

$$S = \{1, 9, 10, 15\}$$

$u:$

0	1	0	...	9	10	15
0	1	0	...	1	1	0

Insert:

Insert (3)

$$1. u[3] \leftarrow 1$$

3 15

0	1	0	1	...	1
---	---	---	---	-----	---

'Switch off' = 'switch on'

$u \rightarrow \text{size}(0 \text{ to } u-1)$

Delete (9)

$$1. u[9] \leftarrow 0$$

0 ... 9 15

0	1	...	0	1	...	1
---	---	-----	---	---	-----	---

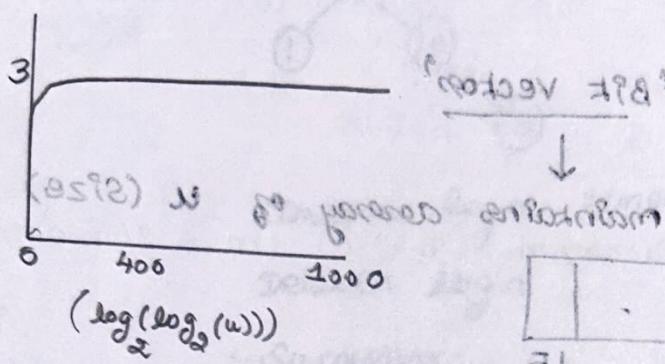
How much fast?

Insert/Delete →  $O(1)$

successor?

Succession (x) now yd between I  $\leftarrow$  BTP  
 All the elements are 0 except  $a_{11}$ .  $\rightarrow$  stepwise  $\rightarrow$  000  
 (n.g.) gal. go without any np

we want:  $\log(\log u)$



Achieve  $\alpha(\bar{u})$

$$O(\log \log u) \rightarrow \text{Goal}$$

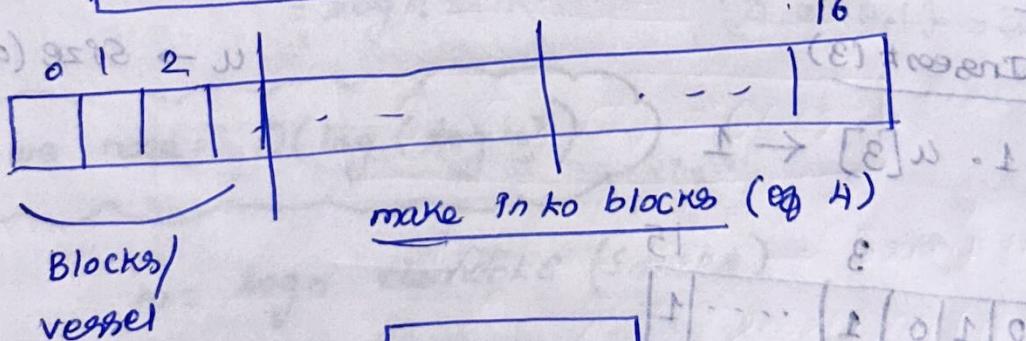
$\downarrow$

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

$$\sqrt{u} = 4$$

Take a Sonar:

4 by 4 matrix = 16



## 4-blocks

$$\therefore \sqrt{u} \text{ blocks} = 4 \text{ blocks}$$

(P) 935198

→ [P] u →  
2 dimensional

(↓) 0 ← van Ende boas DS

$w[0] = \boxed{\quad | \quad | \quad |}$ ,  $w[1] = \boxed{\quad | \quad | \quad |}$

$\sqrt{u} = \text{size of each block}$

$w[0] = \boxed{0 \ 1 \ 2 \ \dots \ \sqrt{u}-1}$

$0 \rightarrow [w[0]] [w[1]] \dots$

"2-d array"

$w[0][0]$ ,  $w[0][1]$

$w[0][0] \dots$

$w[0][\sqrt{u}-1]$

$0100 \Leftarrow s=8$

$s \in \{1, 9, 10, 15\}$

$w[0] :$

$\begin{array}{|c|c|c|} \hline 0 & 1 & 0 & 0 \\ \hline 4 & 5 & 6 & 7 \\ \hline \end{array}$

$H(x)$

$w[1]$

$\begin{array}{|c|c|c|c|} \hline 0 & 0 & 0 & 0 \\ \hline 8 & 9 & 10 & 11 \\ \hline \end{array}$

$w[2]$

$\begin{array}{|c|c|c|c|} \hline 0 & 1 & 1 & 0 \\ \hline 12 & 13 & 14 & 15 \\ \hline \end{array}$

$w[3]$

$\begin{array}{|c|c|c|c|} \hline 0 & 0 & 0 & 1 \\ \hline \end{array}$

$x:$

$H(x)$	$L(x)$
high of $x$	low of $x$

$$x = H(x) \sqrt{u} + L(x)$$

Convert  $x$  to binary & half size

$\therefore \text{REPL} \Rightarrow \text{then } \frac{\text{add. bits}}{2} \text{ bits} \quad \boxed{\text{bit} \quad \text{bit}} \quad \therefore 10 \mid 1$

$$(w)0 = (\sqrt{u} \times \sqrt{u})0$$

$$x = 9 = \underbrace{1}_{H(x)} \underbrace{0}_{L(x)} 0 1$$

$10 \mid 0 1 \rightarrow \text{position of number}$

$\downarrow$   
Block number = 2

$$\therefore w[H(x)] [L(x)]$$

$$x \rightarrow H(x) \sqrt{u} + L(x)$$

Insert ( $x$ )  $\boxed{\quad \quad \quad} = (\Sigma)W$ ,  $\boxed{\quad \quad \quad} = (\Sigma)W$

$w[H(x)] [L(x)] \leftarrow 1$

Delete ( $x$ )

$w[H(x)] [L(x)] \leftarrow 0$

Successor ( $x$ )

$$S = \{1, 9, 10, 15\}$$

$x=2 \Rightarrow \underline{\underline{0 \ 0}} \ | \ \underline{\underline{1 \ 0}}$   
↓                    ↓  
0 block      2 element

① Find successor in its block

② Find successor in next blocks

$\boxed{0 \ 1 \ 0 \ 0}$  ✓ $u$

$\boxed{0 \ 0 \ 0 \ 0}$  ✓ $u$

$\boxed{0 \ 1 \ 1 \ 0}$  ✓ $u$

$\boxed{0 \ 0 \ 0 \ 1}$  ✓ $u$

: (0)W

: (0)W

: (0)W

: (0)W

$$\therefore O(\sqrt{u} \times \sqrt{u}) = O(u)$$

'Augmentation'  $\rightarrow$  Search in

0 block - waste of time - Avoid searching (Add some extra info)

some extra info)

non-empty

$\boxed{\quad \quad \quad}$

$\boxed{1}$

$\boxed{\quad \quad \quad}$

$\boxed{0}$

$\rightarrow$  empty

$\boxed{\quad \quad \quad}$

$\boxed{1}$

$\rightarrow$  nonempty.

$\boxed{\quad \quad \quad}$

$\boxed{1}$

successor(x)       $x \rightarrow H(x) \mid L(x)$       (binary)

1) look at the successors of  $x$  within widget  $w[H(x)]$   
starting after  $L(x)$

2) if successor found return

3) else find the next non-empty  
widget  $w[i]$

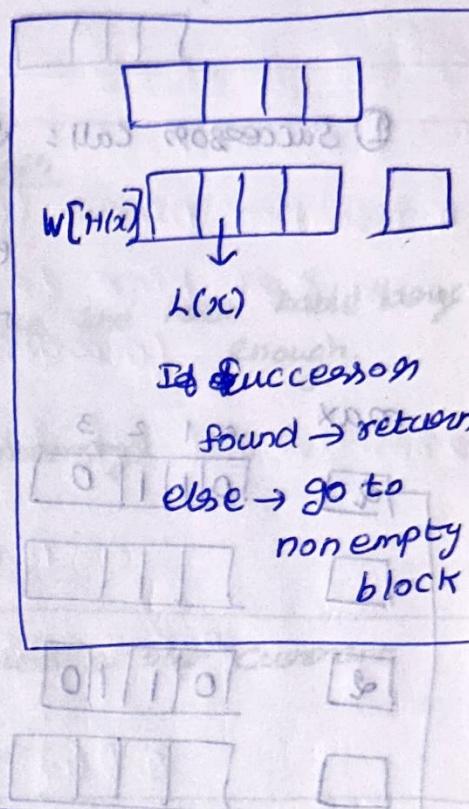
A) find the successors of  $w[i]$   
starting from -1

$$\textcircled{1} \rightarrow \sqrt{u}$$

$$\textcircled{2} \rightarrow O(1)$$

$$\textcircled{3} \rightarrow O(\sqrt{u})$$

$$\textcircled{4} \rightarrow O(\sqrt{u})$$



### Recursive

successor( $x, w[\cdot][\cdot]$ )

$(x) \rightarrow x_{\text{bin}}$

$\textcircled{1}$  call

successor( $L(x),$   
 $w[H(x)]$ )

$i \leftarrow \text{successor}(w[x], \text{nonempty}[0, 1, \dots, v_n - 1]) \rightarrow \text{successor call.}$

successor( $-\infty, w[i]$ )

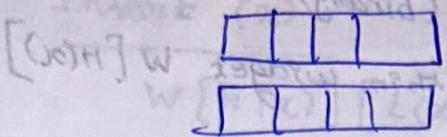
worst case: go from 3 successor calls

we want  $\rightarrow 2$  successor calls

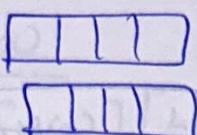
$$T(u) = 3T(\sqrt{u}) + \Theta(1)$$

$$\text{we want } = \alpha T(\sqrt{u})$$

more precisely  
↓  
↓



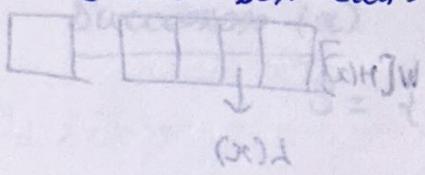
Delete



① Successors call =

$\text{Successors}(L(x), W[H(x)])]$

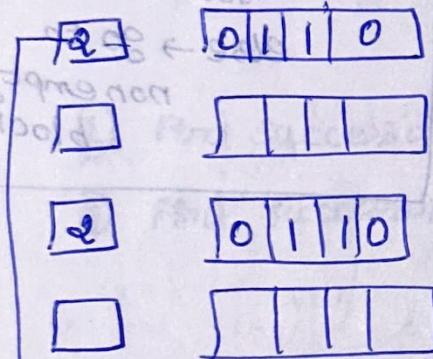
[?] Avoid this call.



(x)1

max

0 1 2 3



notempty



$\text{uv} \leftarrow \textcircled{1}$



$(\text{I})0 \leftarrow \textcircled{2}$



$\text{block}(\text{uv})0 \leftarrow \textcircled{3}$

$(\text{II})0 \leftarrow \textcircled{4}$

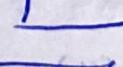
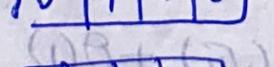
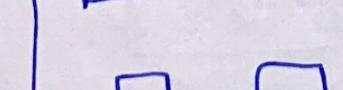
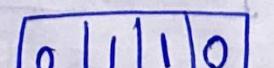
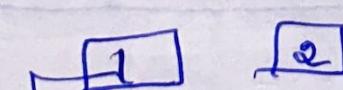
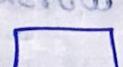
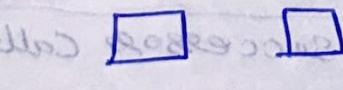
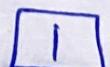
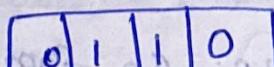
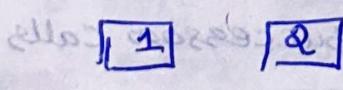
After 2 NO 1 ('Save (1] Successors call')

$\boxed{\text{Max} < L(x)}$

Do) else Don't

'Adding Augmentation - Save time'

min max



1 Starting from  
Index 1.

(1) 'Save more?' → successor - recursive call!

$$T(u) = T(\sqrt{u}) + \Theta(1)$$

→ 'Avoided' - 2 recursive call

$$= O(\log(\log u))$$

### Amortized Analysis

How large should a hash table be?

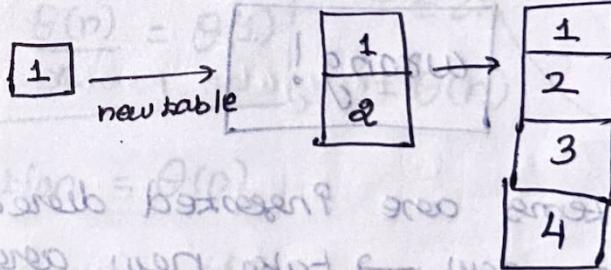
Goal: 'No overflow' → make the hash table large enough.

'dynamic table' - overflow (alloc new memory)

malloc / calloc!

Allocate new larger table: Then position all our current elements to the new larger table.

e.g.: dynamic table



Insert

Insert - overflow

Insert - overflow

Insert - 1

Insert - 5 (overflow)

'Strategy: double the older one'

No need to reallocate frequently!

1
2
3
4
5

OR → (n)  $\Theta = 16 \text{ second element } n^2$   
Table  
→ overflow  
(Copy all terms)

Table size = 8

↑ own time Complexity.

Most items → we just allocating  $O(1)$

Few items → creating  $O(n)$  time

↳ no. of elements in  
the table (prev)  
 $+ O(1)$

New element is - 'babbar'

$$((\text{old}) \text{ new}) O =$$

### worst case analysis

n insertion: n items (Consider sequence of n insertion)

\* worst case time to execute one insertion is  $O(n)$   
overflow →  $O(n) \rightarrow$  shift to new one

\* Best Case (Just insert →  $O(1)$ )

∴ Assuming ! old + new

worst case time for n insertions

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

each time - new table



\* Some items are inserted directly

\* only very few → take new array then copy.

Some cells get always present?

(Worstcase) 2 - insert

Amortized analysis - Avg but there is  
no probability!

$$\text{? } n \text{ insertions} = O(n)$$

→ To prove!

(Amortized avg)

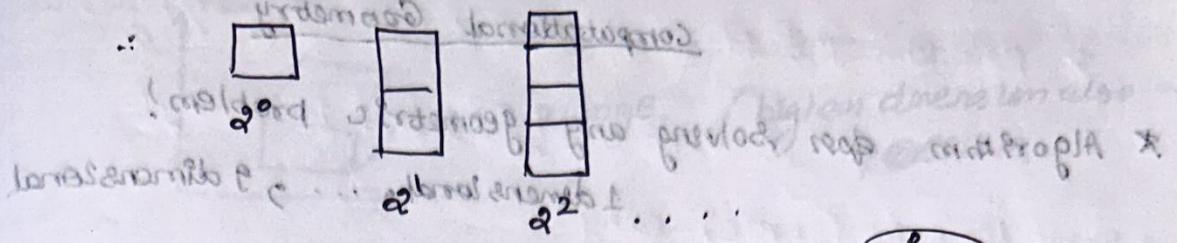
Worstcase

### Tighter analysis:

$C_p$  = cost of the  $p$ th insertion.

$$= \begin{cases} p & \text{if } p \text{ is exact power of 2} \\ 1 & \text{otherwise.} \end{cases}$$

8 = 2 \* 2 \* 2 worst



(total) Insertions to overflow: when reaches  $2^k + 1$   $\Leftarrow$  extra information

$i$	1	2	3	4	5	6	7	8	9	10
Size $i$	1	2	4	4	8	8	8	<del>8</del>	16	16
$c_i$	1	2	3	1	5	1	1	1	9	1

most case = 1

Few Case:  $\Theta(n)$  - new table (copy old items)

$$\text{cost of } n \text{ insertion} = \sum_{j=1}^n c_j$$

No previous copy & new  $\rightarrow$   $n$   $\Leftarrow$  extra info

$$= n + \sum_{j=1}^{\log(n-1)} 2^j \rightarrow \text{Amortized.}$$

Average cost  $\Theta(1)$

$$\frac{1}{n} \text{ insertion} = \frac{\Theta(n)}{n} = \Theta(1)$$

$$\leq 3n$$

$$\therefore n \text{ insertion} = \Theta(n)$$

doing

$$P=5$$

$$2^5 + 1$$

(here).

No probability involved  $\rightarrow$  Amortized analysis.

Amortized analysis  $\rightarrow$  strategy does analysing sequence of operation to show that average cost/operation is even though the single operation within there may experience some expensive!

Types of Amortized analysis

Aggregate

$\leftarrow$  (discussed)

Accounting

Potential method.

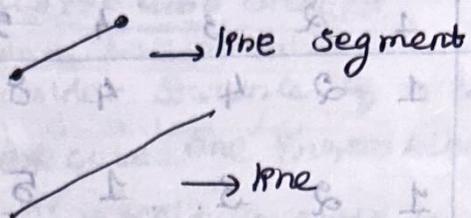
dynamic table.

# Computational Geometry

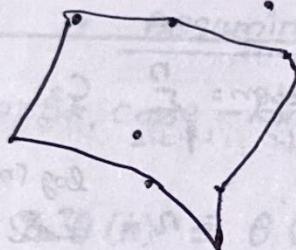
\* Algorithm for solving any geometric problem!

1 dimensional, ..., 9 dimensional.

Fundamental objects  $\Rightarrow$  point (any dimensional point)

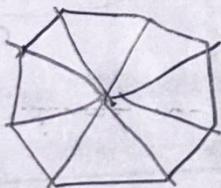


Any dimensional points:



→ small region covering all the points.

Polygon.



(n)  $\theta$  = triangular problem - form  $\Delta$  using these points

(n)  $\theta$  =

(9) Convex hull - Closed region

(Any two points inside the region)

So they have geometric structures?

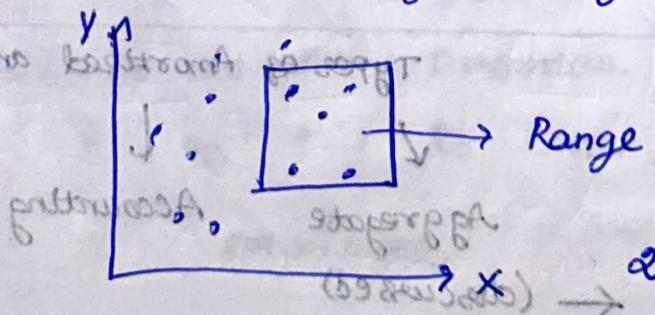
Orthogonal Range Search - more applications

Idea:  $n$  points:  $d$  dimension! range (orthogonal range)

query:

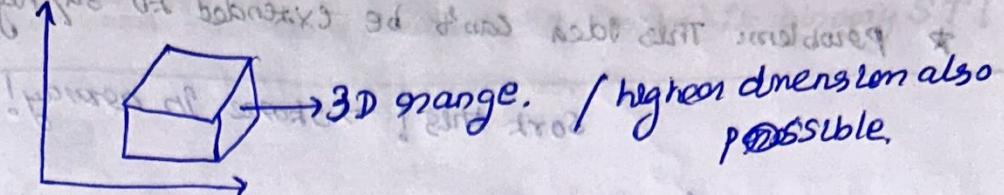
leftmost

bottom



2D

dimensional  
grid



### ③ queries

- 1) Is there any points are there in this range?
- 2) If yes then how many?
- 3) Give the points.

Handle!

d-dimensional

\* Is there any points? → Sort

2D \* check x coordinates, y coordinate fitted in this rect/not  
 3D →  $x, y, z$  (x,y) &  $\downarrow$  one sort solution

$\hookrightarrow O(n \cdot d)$

$d=1$

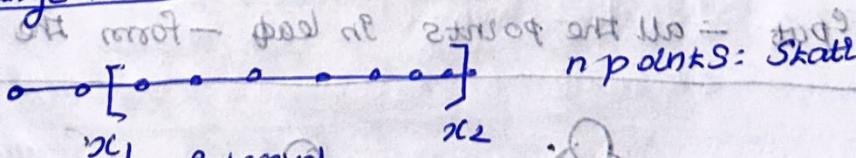
$O(n)$

static!

Static DS (Fast search).

sort process - gives - b-t      orthogonal range search.

### 1D range search



$x_1$        $x_2$

interval

$$x \rightarrow [x_1, x_2] \text{ interval}$$

Interval tree! search. → last class.

Interval - Search  $\rightarrow O(k \log n)$

'sort based bound'

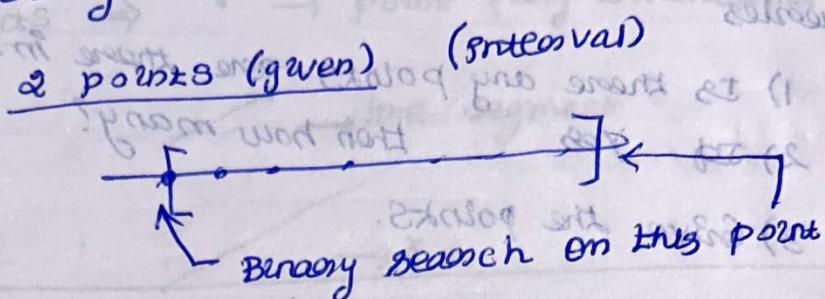
\* Problem: This idea can't be extended to 3d/higher dimensions

put

Sort this! → Store in array!

→ Sort the point (static) - easy

→ Store in an array.



So we get the positions of these two: Now the ~~enter~~ <sup>horizontal</sup> points are the Solution!

(0, n) 0 ↪

l = b Problem: can't be extended to 2d!

(n) 0

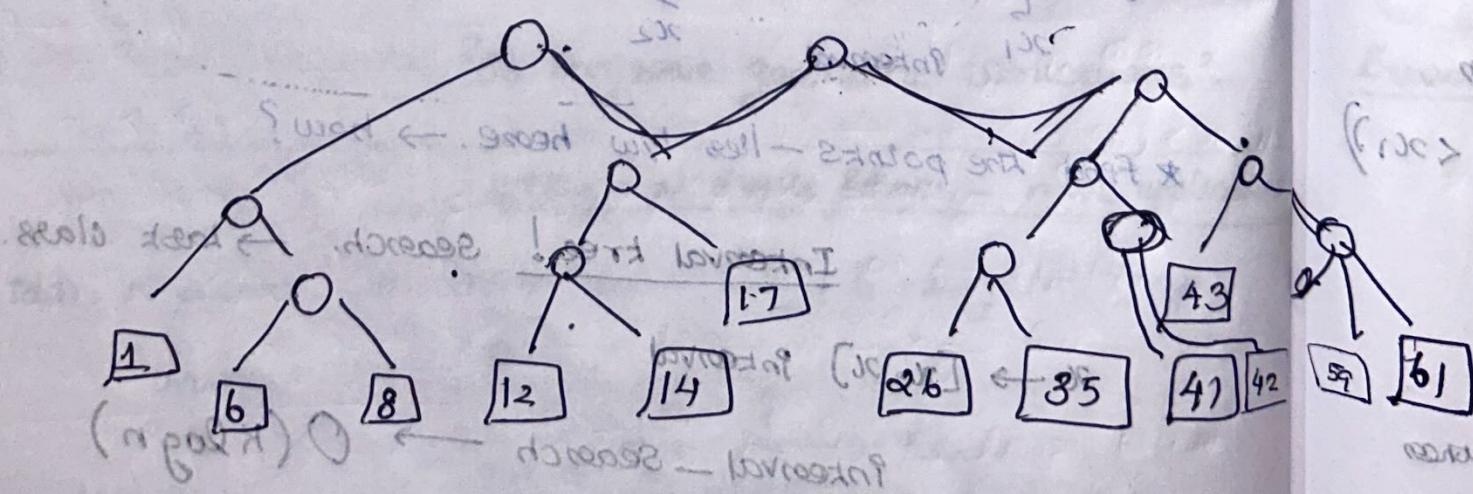
2 coordinates

which one to sort!

(decrease solution space)

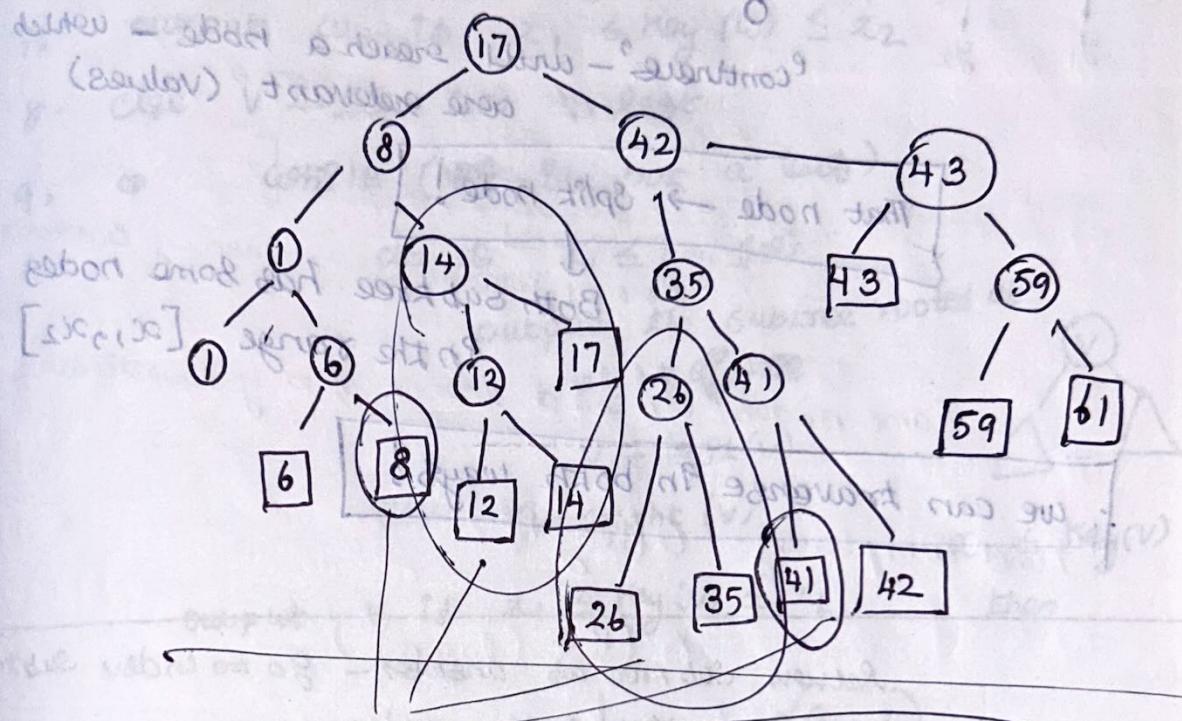
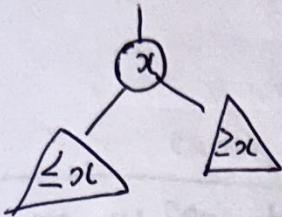
1-d-range-Search tree

Input - all the points in leaf - form the tree?



'Balanced Search tree'

put some value: In empty nodes: To make it binary ST!



e.g. [7, 4 1]

Return these books

(plantar) serowé f\*pol):

$$\begin{array}{l}
 \text{leaf } \theta_3 \rightarrow 8 \\
 (\text{leaf } \theta_3) \text{ pruned} - \text{spare} - 0 \\
 \text{leaf } \theta_3 \rightarrow 12, 14, 16 \\
 (\text{T}) \text{ do not } \rightarrow W \cdot 1 \\
 \text{leaf } \theta_3 \rightarrow 26 \rightarrow 26, 35 \\
 \text{leaf } \theta_3 \rightarrow W \cdot 51 + W \cdot 40 \\
 \text{leaf } \theta_3 \rightarrow 41 \rightarrow 41 \\
 \text{(W) per } \rightarrow \text{set}
 \end{array}$$

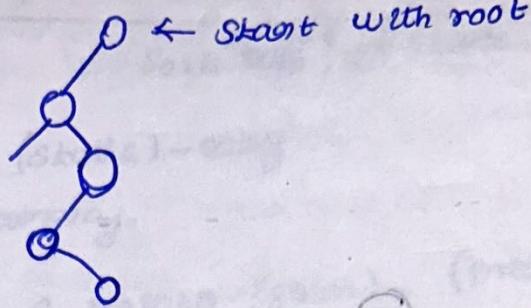
Answer: Leaves in the Subtree!

(iii) ~~tree~~ → ~~W~~eighted - d - range Search

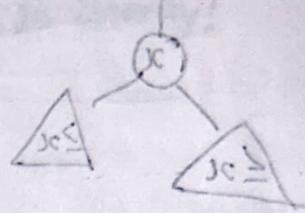
(w)  $\exists \alpha \in \omega \rightarrow \omega$  gold

General idea: return leaves

! T2 ground 1) D orange ovule  $[x_1, x_2]$



'continue' - until reach a node - which  
are relevant (values)



That node → split node!

Both Subtree has some nodes  
in the range  $[x_1, x_2]$

we can traverse in both ways!

Returns sub tree as answer - go to wider sub tree

geb Prod. noch

~~2100E South (newer)~~

"K-nodes" (say)

Send all action first at No.

~~2:00ce~~ \*  $\therefore (\log k)$  subtree (Intuitively)

1D - strange - quenched ( $T$ ,  $[x_1, x_2]$ )

$$1. \quad w \leftarrow \text{root}(\tau)$$

if  $w$  is not a leaf and

$(\succ_{\alpha} \leq \text{key}(w)) \otimes n$

$$(\text{Key}(\omega) < \infty)$$

if  $x_2 < \text{key}(w)$

our focus: left side

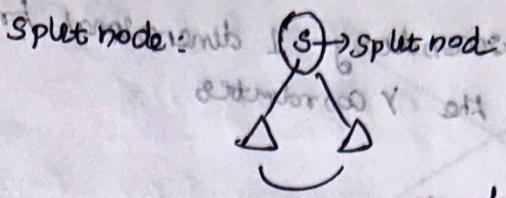
else  $(x_1 > \text{key}(w))$   
completely right side

3. do es

4. ~~pop w - b~~ then  $w \leftarrow \text{left}(w)$

5. else  $w \leftarrow \text{right}(w)$

11 after the while loop there  
will be a lead /split node.



Interestingly here (return each element).

6. If  $w$  is ready  $\leftarrow$   $\{SKB\}$   $\rightarrow$   $SC$

7. output  $w$  to  $x_1 \leq key(w) \leq x_2$

9. while (~~w~~ is not a ~~last~~)

do while  $x_i \leq \text{key}(v)$   
output the subtree rooted at

output the subtree rooted at

$v \leftarrow \text{left}(v)$

else ( $v \leftarrow \text{right}(v)$ ).

Output ( $v$  if  $x_1 \leq \text{key}(v) \leq x_L$  then  
 $(\text{goal} + k)$ )

Then

Time: Start from root  $\rightarrow$  go to leaf:  $O(\log n)$

$K \rightarrow \text{leaves}$ ?  
to reach leaves  $O(K + \log n)$

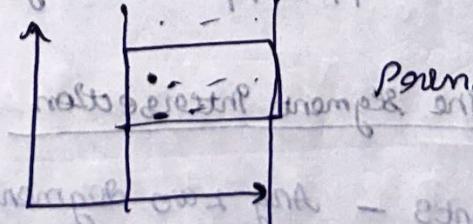
Space!

~~$O(n^2)$~~   $O(n \log n)$

↳ From 1000

$\text{AP}_C \leftarrow \underline{\text{P}_d \text{-} d\text{-range-tree}}$

$$g_{\mu A} \leftarrow \overline{p_1 - r_1}$$



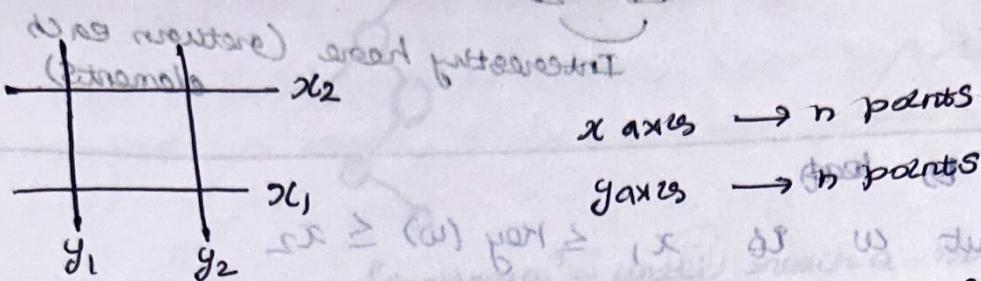
Potency: 1D orange tree

based on x-axes.

red Edmiston's rule - Example and next \*

• Suppose  $\exists$   $y \in \mathbb{R}$  s.t.  $y > 0$  s.t.  $\forall x \in \mathbb{R}$   $x^2 \geq y$

\* secondary 1 dimensional tree based on the Y coordinates



Tgrie 1 (w)  $\rightarrow$  V Tgrie 2

gaxis  $\rightarrow$  ~~points~~  $n$  points

$x$  axis  $\rightarrow n$  points

gases  $\rightarrow$  ~~in~~ points

15 of 30

Trees 1 (w)  $\rightarrow$  V

~~too~~ ~~as~~ ~~(in)~~ signed

제3회 30 30 Take

Take it home  
at some point

do I'd searsh doo y

৭ → V

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

per  $\Delta$   $\approx$  2% vs. true

$$\mathcal{O}(K + (\log n)^2)$$

1 ~~at 02 e good / mab.~~

No. of points lying in

~~equation~~

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

ପାତ୍ର

$\hat{e}_n) \otimes e_1 \otimes e_2 \otimes \cdots \otimes e_d)$

$$O(k + (\log n)^{1.1})$$

## Student records 9/1

elements - n resp abg

$$7 \cdot 9 - 9 \cdot 9 \rightarrow CGP$$

$17 - 19 \rightarrow$  Age

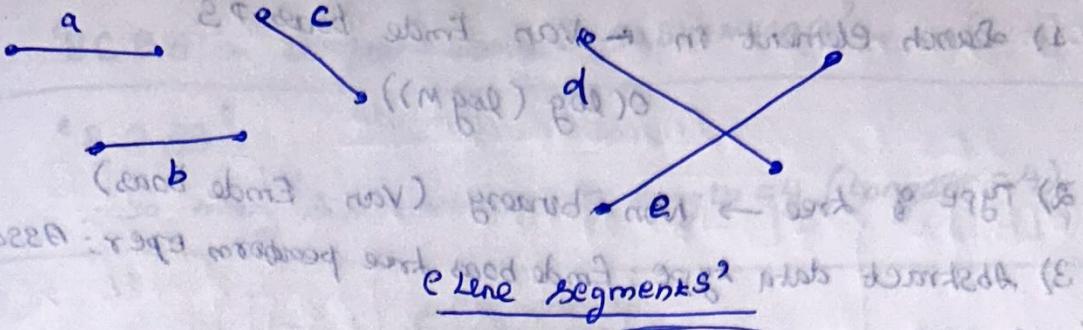
↑

## Line Segment Intersection

Age 5 yrs 8 months

nts - any two segments

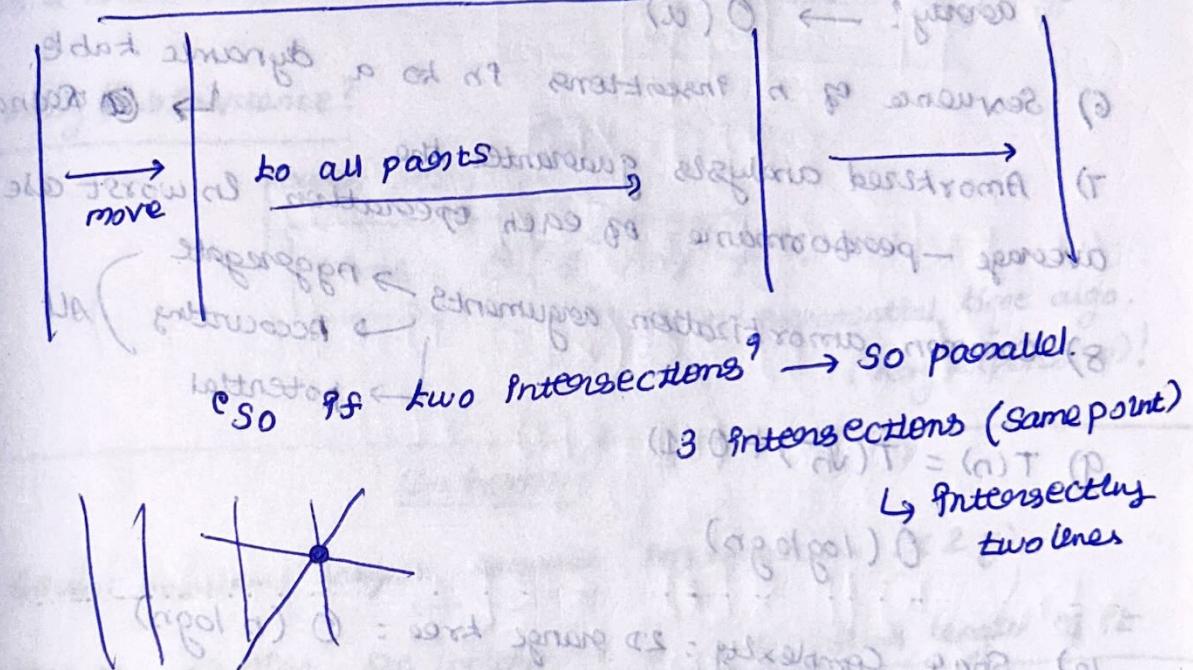
does any pair interfere



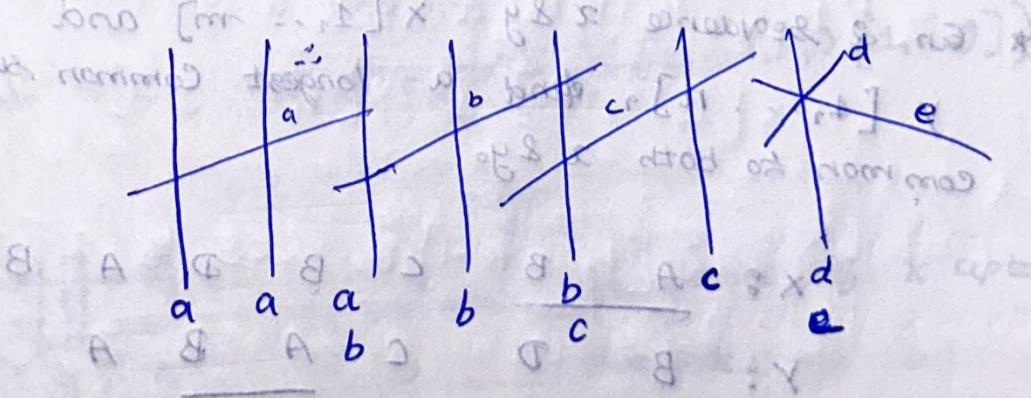
Coordinate wise:  $O(n^2)$   $\therefore n \times n$  pairs

### Sweep Line algorithm

use vertical line - Just move that vertical line.



Intersections in these intersecting points  
maintain a **DS** (dynamic) with this intersecting points  
considering value of  $x$  axis,  $y$  axis.



$x \leftarrow x + 1$  and  $y \leftarrow y + 1$

1) Search element in  $\leftarrow$  Van Emde Boas  $\Rightarrow S$   
~~Time complexity~~  $O(\log(\log n))$

2) Type of tree  $\rightarrow$  Non-binary (Van Emde Boas)

3) Abstract data type: Emde Boas tree perform oper: associative  
(2d) array

4) Van Emde  $\rightarrow$  Universe size = 16, how many blocks?  
4 blocks ( $4^2 = 16$ )

5) Worst case run of successor / predecessor in bit vector  
array?  $\rightarrow O(n)$

6) Sequence of  $n$  insertions in to a dynamic table  $\hookrightarrow \text{denotes}$

7) Amortized analysis guarantees the average performance of each operation in worst case

8) Common amortization arguments  $\rightarrow$  Aggregate  $\rightarrow$  Accounting  $\rightarrow$  Potential

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

$O(\log \log n)$

10) Space Complexity: 2D orange tree:  $O(n \log n)$

### Dynamic programming

Design technique (Divide & conquer)  $\rightarrow$  Longest common subsequence problem

\* Given 2 sequences  $x \& y$   $x [1, \dots, m]$  and  $y [1, \dots, n]$ , find a longest common subsequence common to both  $x \& y$ .

$x:$	A	B	C	B	D	A	B
$y:$	B	D	C	A	B	A	

"BCB" — subsequence of  $x \& y$ .

'BCBA' - Longest common subsequence?

$e_B \oplus AB^T$

$\therefore$  So many subsequence of length = 4 (longest = 4)

### Naïve approach

$x[1, \dots m]$

$\forall [1, \dots, n]$

Note: check every subsequence of  $x$ , then check whether  $y$  is a subsequence of  $x$  or not!  $\rightarrow O(n^k)$  where  $k$  is the length of  $y$

How many Subsequence?

power set =  $\mathcal{P}^m$

$$\text{Time} = \Theta(2^m \times r)$$

↓  
exponential time algo.  
(very expensive)!

Do better!

Given problem: largest common subsequence ( $x \& y$ )

instead of finding the longest c s - do find length eq PK

Find the length of the longest common subsequence?

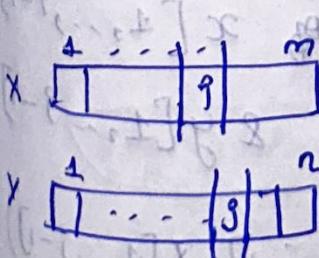
↳ 'punitive'

$$[e] \times = [g] \times = [x] \times$$

## 'Dynamic programming' technique:

With small words come prefixes

$$c[8,9] = \overbrace{\text{Log}}^{\downarrow \text{Length}} (\times [1,..9], y[1,..9])$$



So we take subsequence of  $x$  upto  $q^{\text{th}}$  index.

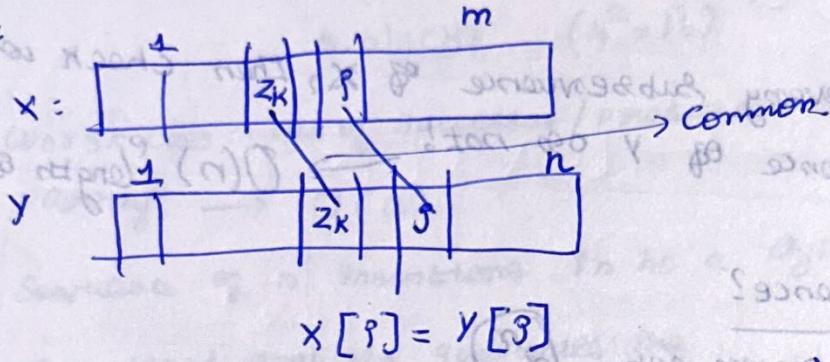
$c[i, j] \rightarrow$  length LCS of x upto i and y upto j

$c[m, n] \rightarrow$  we need (through  $x$  & through  $y$ )

### Recursive formula

$$c[i, j] = \begin{cases} c[i-1, j-1] + 1 & \text{if } x[i] = y[j] \\ \max\{c[i-1, j], c[i, j-1]\} & \text{if } x[i] \neq y[j] \end{cases}$$

Proof:



Let  $K = |\text{Lcs}(x[1, \dots, i], y[1, \dots, j])|$

$z[1, \dots, K] = \text{Lcs}(x[1, \dots, i], y[1, \dots, j])$

Claim  $z[K] = x[i] = y[j]$

$z[1, \dots, K] || x[i] = z[1, \dots, K] || x[i]$

Assume:  $K \rightarrow \text{length}$

Prove:  $K+1$

Take

$z[K] = x[i] = y[j]$

$z[1, \dots, K-1]$  is a common subsequence b/w

$x[1, \dots, i-1] \& y[1, \dots, j-1]$

$x[1, \dots, K-1]$  is Lcs of  $x[1, \dots, i-1]$  &  $y[1, \dots, j-1]$

$\text{Lcs}(x[1, \dots, i-1], y[1, \dots, j-1])$

$\geq [1, \dots, k-1] = \text{LCS}(x[1, \dots, k-1], y[1, \dots, g-1])$

$$c[i-1, j-1] = k-1$$

(Let  $x[i:j]$  be)

$$\begin{aligned} c[i, j] &= k = (k-1) + 1 \\ &+ (1 - \text{LCS}(x[i:j-1], y[i:j-1])) \\ &= c[i-1, j-1] + 1 \\ &\quad \{ \text{LCS}(x[i:j-1], y[i:j-1]) \} \\ &\quad \{ x[i:j-1] \subset \text{LCS}(x[i:j-1], y[i:j-1]) \} \\ &\quad \boxed{x[i:j-1] = y[i:j-1]} \end{aligned}$$

If  $x[i] \neq y[j]$

$$c[i, j] = \max \{ c[i-1, j], c[i, j-1] \}$$

$$\therefore c[i, j] = \begin{cases} c[i-1, j-1] + 1 & \text{if } x[i] = y[j] \\ \max \{ c[i-1, j], c[i, j-1] \} & \text{else } x[i] \neq y[j] \end{cases}$$

$\text{LCS}(x, y, i, j)$

If  $x[i] = y[j]$

if  $x[i] \neq y[j]$  then  $c[i, j] \leftarrow \text{LCS}(x, y, i-1, j-1)$

else  $c[i, j] \leftarrow \max \{ \text{LCS}(x, y, i-1, j), \text{LCS}(x, y, i, j-1) \}$

So it means left - previous for by change

Longest common subsequence

DYNAMIC PROGRAMMING

Hall mark  $\#1$  method solve  $K3 * 3$   
with given between embedding

optimal substructure

An optimal solution to a problem contains

Optimal solutions to subproblems.

## LCS - recursive algorithm

LCS (x, y, i, j)

1) If  $x[i] = y[j]$

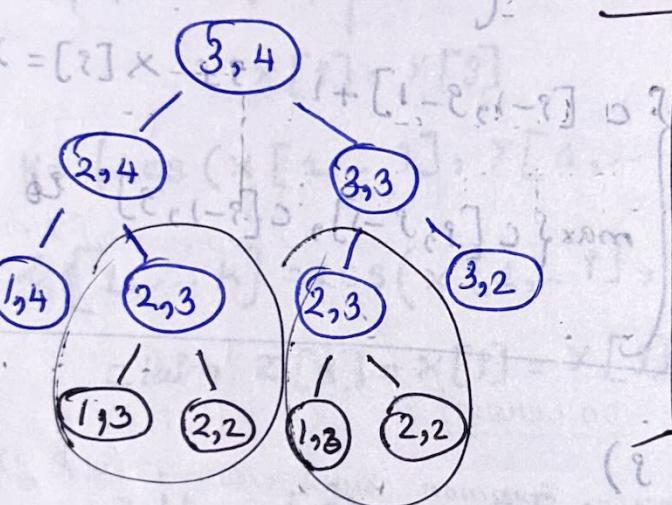
Then  $C[i, j] \leftarrow \text{LCS}(x, y, i-1, j-1) + 1$

else  $C[i, j] \leftarrow \max \{ \text{LCS}(x, y, i-1, j),$

$\text{LCS}(x, y, i, j-1) \}$

worst case  $\rightarrow x[i] \neq y[j] \rightarrow$  need of recursive calls

$[i]x = [i]x$



$m+n$

~~overlapping~~

Something, ~same subproblems (repetition)

Hallmark of dynamic prog problem - many repetition of the overlapping subproblems.

Dynamic programming - Hallmark #2

overlapping subproblems?

\* A recursive solution contains a small # of distinct subproblems repeated many times

Indication: go for dynamic solving.

memoization Algorithm

LCS (X, Y, i, j)

1) If  $i \in [9, 3] = N \setminus L$

then  $LCS(X[9]) = Y[3]$

then  $C[9, 3] \leftarrow LCS(X, Y, 9-1, 3-1) + 1$

else  $C[9, 3] \leftarrow \max \{LCS(X, Y, 9-1, 3),$

$LCS(X, Y, 9, 3-1)\}$

Never calculated, won't calculate again.

	A	B	C	B	D	A	B
empty.	0	0	0	0	0	0	0
B	0	0	1	1	1	1	1
D	0	0	1	1	2	2	2
C	0	1	2	2	2	2	2
A	0						
B	0						
A	0						

$$C[1, 2] = \max \{C[0, 1], C[1, 0]\} + 1$$

$$C[2, 1] = C[1, 0] + 1$$

$$C[2, 1] = \begin{bmatrix} 0 & 1 \\ 0 & 1 \end{bmatrix} \quad \begin{matrix} \text{Not same} \\ \max + 1 \end{matrix}$$

$$C[2, 1] = \begin{bmatrix} 0 & 1 \\ 0 & 1 \end{bmatrix} \quad \begin{matrix} \text{Not same} \\ \max + 1 \end{matrix}$$

Many repetition - avoided

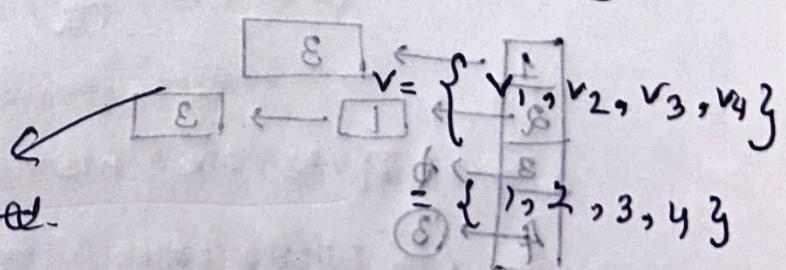
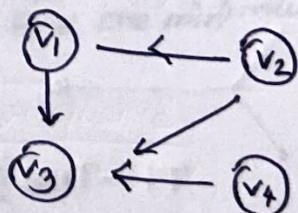
many repetition - avoided

Graphs

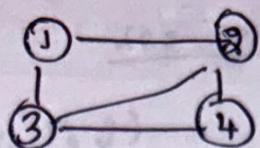
$$G_1 = (V, E)$$

Edges

Vertices



$$E = \{(1, 2), (2, 3), (3, 4), (4, 1)\}$$

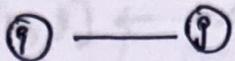


$(v_i, v_j) \in E$  if and only if  $v_i \neq v_j$

undirected

'complete' graph - any two vertex there is an edge.

$$V = \{1, 2, \dots, n\}$$

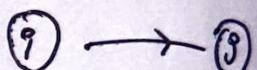


$$|E| = O(|V|^2)$$

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

'Adjacency matrix'

$$a(i, j) = \begin{cases} 1 & \text{if } (i, j) \in E \\ 0 & \text{otherwise} \end{cases}$$



$$\begin{matrix} & 1 & 2 & 3 & 4 \\ 1 & 0 & 0 & 1 & 0 \\ 2 & 1 & 0 & 1 & 0 \\ 3 & 0 & 0 & 0 & 0 \\ 4 & 0 & 0 & 1 & 0 \end{matrix}$$

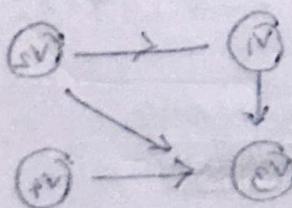
(sparse graph)

Drawback: Sparse graph (less no. of edges)

- not contiguous memory  
- taking time!

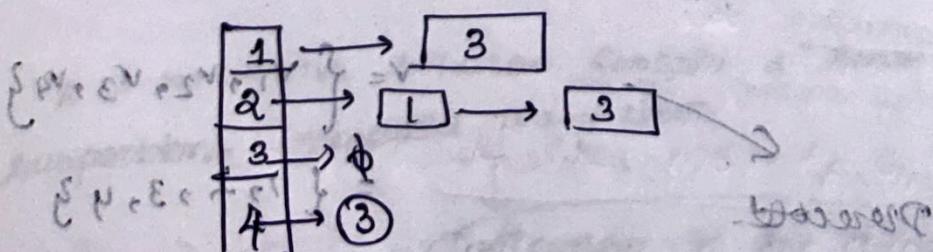
100 vertex, 10 vertex  $\rightarrow$  No need for such matrix!

(wasting memory)



$$(3, v) = 10$$

Adjacent list



$$((E_{\text{adj}}), ((E_{\text{adj}}), (E_{\text{adj}}))) = 3$$

( $E_{\text{adj}}$ )

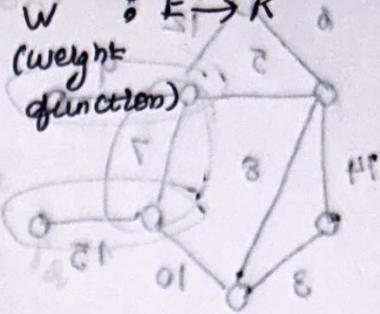
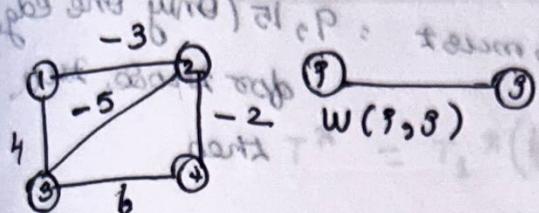
## minimum Spanning tree

$$G = (V, E)$$

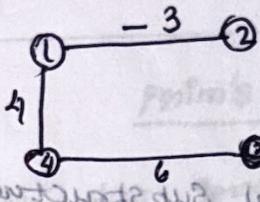
↓  
undirected graph

$$w : E \rightarrow \mathbb{R}$$

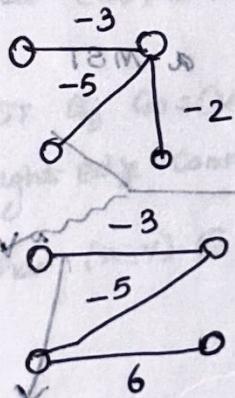
(weight  
function)



minimum Spanning tree  $\leftarrow$  Shouldn't contain any cycle, Spanning - Covers all vertices.



$$w(T_{\text{tree}}) = \sum w(s, t) = 7$$



$$w(T) = -10$$

$\rightarrow$  minimum one (spanning)

$$w(T) = -2.$$

Find a Subgraph - Spanning tree

↓  
Find the minimum spanning one

MST Problem

$\downarrow$   $\text{MST} - IT$

Input:  $\langle G = (V, E), w : E \rightarrow \mathbb{R} \rangle$

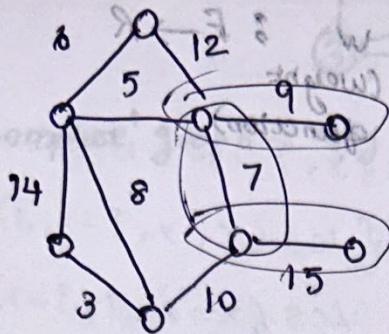
O/P: A spanning tree T

$T$  of below?  $\Rightarrow w(T) = \sum w(u, v)$  min

where all edges  $(u, v) \in T$  don't have

$\{T\} \leftarrow \min \{T\} \dots \}$

$ST \oplus n \leftarrow \leftarrow \leftarrow$



critical must : 9, 15 (only one edge)

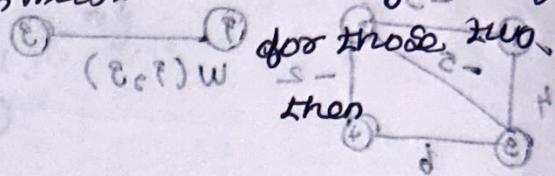
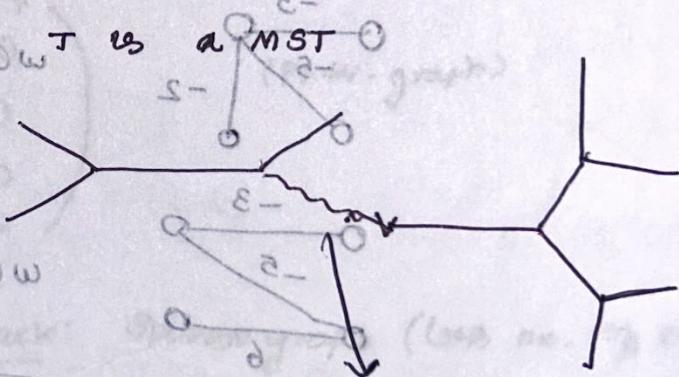


Diagram illustrating a search tree for a shortest path problem. The root node is labeled 0. A shaded path is shown from node 0 through nodes 1, 2, 3, and 4 to node 5. The path cost is labeled as 5. The label  $(v_i) w_i = (sort) w$  is written below the path. To the right, there is a separate graph structure with nodes 5, 6, and 7, and an edge labeled  $\delta$  between nodes 5 and 6.

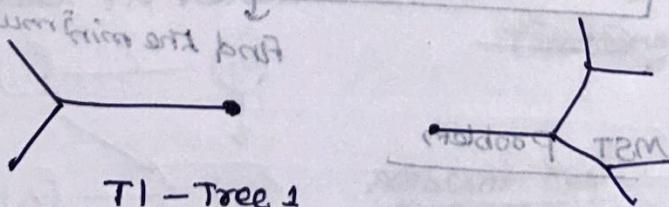
## Optimal Substructure

Let  $G_1 = (V, E)$



~~start from edge - remove T: we remove this edge~~

please confirm with our staff



$$(\star \leftarrow \exists : w \in T \alpha) = \omega > : \text{diag} \circ I$$

T sand pumice : 10

claim  $T_1$  is the MST of  $G_1$  (induced by  $T_1$ )

$G_1$  has all the edges connecting with the vertex  $\{T_3\}$  and by  $T_1$ .

$$G_2 \rightarrow n \quad \quad \quad n \quad \quad n \quad \oplus T_2.$$

$T_1$  - Not a MST of  $G_1$

$\therefore T_1'$  (Another tree-MST) of  $G_1$ ,

$$w(T_1^*) < w(T_1)$$

Take new one

$$T^* = T_1^*(\text{u}) (u, v) \cup T_2$$

Union

$$w(T^*) = w(T^*) + w(u, v) + w(T_2)$$

$$< w(T)$$

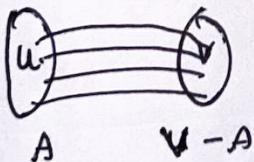
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Prim's algorithm - Greedy approach

Hall mark does greedy algorithm - Greedy choice prop.

A locally optimal choice is globally optimal

let  $T$  be a MST of  $G=(V, E)$  &  $A \subseteq V$ . Suppose  $(u, v) \in E$   
is the least weight edge connecting  $A$  &  $V-A$ , then  $(u, v) \in T$   
Then  $(u, v) \in T$



---

'Read notes'