

DSA



DS - Characteristics

- Correctness
- Minimize time & space complexity

Need

- Search data
- Handle multiple requests
- Processor speed high

Execution Time Cases

Worst, Average, Best case



Algo - Characteristics

Unambiguous, well defined I/O,
finite, feasible, independent

Analysis - A Priori - Theoretical analysis

A Posteriori - Empirical Analysis

(Post Implementation)

Space Complexity :- Amt of memory
space needed by algo.

Components - Fixed - Independent of
size of problem (constants
& simple variables)

- Variable - Depends on
size of problem (dynamic
mem. allocation, recursion stack
etc.)

Time Complexity :- Time needed by algo to run to completion

→ Asymptotic Analysis :-

Define mathematical bounds of algo's runtime performance
Input bound

- ∅ Notation - Worst Case (Upper Bound)
- ∅ Notation - Best Case (Lower Bound)
- ∅ Notation - Avg Case

1. ARRAYS - Holds fixed no. of items of same type.
Can be 1D or ND

Traverse :- Simple for loop

Insert (At posⁿ k)

Step 1 Start

Step 2 : Repeat for $i = n-1$ to k
shift elt by one position
down from i to i+1

Step 3 : set arr[k] = item

Step 4 : n++

Step 5 : Exit

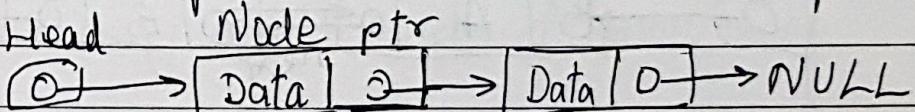
Delete

1. Start
2. For $i \leftarrow k$ to n
 $arr[i] = arr[i+1]$
3. $n--$
4. Exit

2. LINKED LIST

linear collection of data elements (nodes)
 Each node has one or more data fields and a pointer to next node

null ptr denotes end of list
 Extra space needed to store ptrs



Operations :-

Insert :- Start

1. Link ptr of new node to next node

2. Link ptr of prev node to new node

Delete

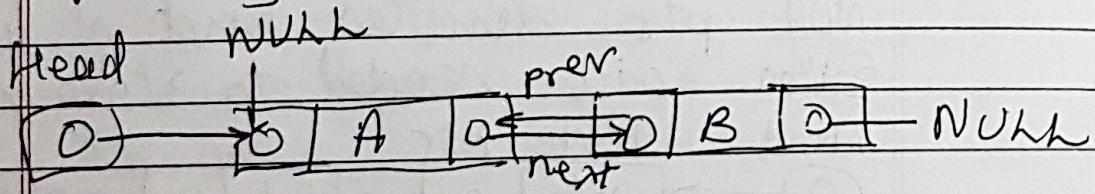
1. Link ptr of prev node to next node
 $\text{current node forgotten}$

Reverse Operation:-

1. Traverse to end of list, make pointer (currently null) to its previous node
2. Repeat for all nodes till first node.
3. Set ptr of first node to null
4. Make head pt to last node (from step 1)

→ Doubly linked list -

Each node has 2 pointers pointing to prev & next node



Insert :-

1. Set next ptr of current node to next node & prev of ptr to prev node
2. Make next of prev node & prev of next node point to this node

Handle empty Ll, insert at start & at end accordingly

Other operations :-

Delete First, Delete Last, Delete,
Display First, Display Backward

→ Circular Linked List

First element ^{prev} points to last
& last ^{next} points to first

In single LL :- last node points
to first node.

3. Stack : LIFO Collection

Sequence of items, accessible
at only one end of sequence

PUSH - Insert item into stack (top)

POP - Pop item from top of stack

TOP - current location of data
in stack

PEEK - gets topmost elt (doesn't delete)

3.1 Polish Notations

Infix $\rightarrow a + b$

Prefix $\rightarrow + ab$

Postfix $\rightarrow ab +$

Postfix most suitable for computers
Universally accepted.

Any operations entered in a computer
is converted to postfix, stored
in stack and then calculated

Operator

:)

exp { n }

* /

+ -

Precedence

4

3

2

1

\rightarrow Infix to Postfix

Left parenthesis '(' \rightarrow Push

Right parenthesis ')' \rightarrow Pop and print
till $s[\text{top}] != '('$

Then pop once more

Operand \rightarrow Print

Operator \rightarrow while($\text{pre}(\text{cin}[i]) <$
 $\leq \text{pre}(s[\text{top}])$)

pop & print;

push operator

Note:- pre stands for precedence.

\therefore While, precedence of operators in infix expression

\leq Precedence of operators at top of stack

Ex: $A + (B * C - (D / E ^ F) * G) * H$

Symbol	Postfix Str	Stack
A	A	
+	A	+
(A	+ (
B	AB	+ (
*	AB	+ (*
C	ABC	+ (*
-	ABC *	+ (-
(ABC *	+ (- (
D	ABC * D	+ (- (
/	ABC * D	+ (- ()
E	ABC * DE	+ (- ()
^	ABC * DE	+ (- () ^
F	ABC * DEF	+ (- () ^
)	ABC * DEF ^ /	+ (-
*	ABC * DEF ^ /	+ (- *
G	ABC * DEF ^ / G	+ (- *
)	ABC * DEF ^ / G * -	+
*	ABC * DEF ^ / G * -	+ *
H	ABC * DEF ^ / G * - H	

Pop full stack

ABC * DEF ^ / G * - H * +

~~Postfix to infix~~

→ Postfix Evaluation

If symbol is operand, push to stack
 If operator :- $op_2 = pop$
 $op_1 = pop$
 Perform op_1 operator $op_2 \in$
 push to stack

Ex 5 6 2 + * 12 4 / -

Symbol	Op1	Op2	Value	Stack
5				5
6				5 6
2				5 6 2
+	6	2	8	5 8
*	5	8	40	40
12				40 12
4				40 12 4
/	12	4	3	40 3
-	40	3	37	<u>37</u>

→ Infix to Prefix

- (1) Reverse infix expression. (Note :- while reversing 'C' will become 'J' and vice versa)
- (2) Obtain postfix expr.
- (3) Reverse postfix expr.

$$\text{Ex: } \frac{(a+b)}{(c-d)} * (c-d)$$

Symbol	Prefix Str	Stack
((
(C C
d	a d	C C
-	ad	C C -
c	dc	C C -
)	dc -	C C -
*	dc -	C * C
(dc -	C * C
b	dc - b	C * C
+	dc - b	C * C +
a	dc - b a	C * C +
)	dc - b a +	C + ,
)	dc - b a + *	

Reverse

* + ab - cd

4 RECURSION

Technique to break large problem to sub problems and call function recursively

→ Tail Recursion :- If no operations are pending when recursive function returns to caller.

```
Ex :- factorial :- (Tail)
int fact (int n) {
    return factl (n, 1); }

int factl (int n, int res) {
    if (n == 1) return res;
    else
        return factl ((n-1), n*res); }
```

Ex Non Tail :-

```
int fact (int n) {
    if (x == 0 || x == 1) {
        return 1;
    } else
        return (x * fact (x-1)); }
```

3

→ Non Tail Recursion :- Info about pending operations must be stored in stack. Hence, stack increases wif increase in calls.
∴ Tail recursion desirable.

→ Direct Recursion:- If fnctn calls itself. Ex:- Brev fact fnctn

→ Indirect Recursion:-

int fun1(int) { if (n == 0)

 return n;

 else

 return fun2(n); }

int fun2 (int x) {

 return fun1(x - 1);

}

Calls to other function which ultimately calls it.

use of circular queue - chooses addition of elements in posn of deleted Elts (prevents waste of space) /

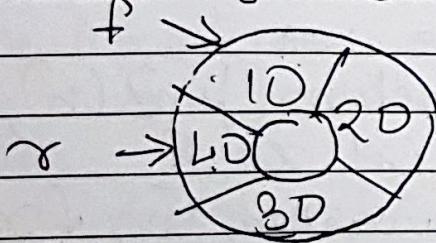
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5. QUEUE (FIFO)

Elt that gets in first, & gets out first. Elts added to end & removed from front.

→ Circular Queue:



To increment front (f) or rear (r) we use
Delete $\rightarrow f = (f + 1) \mod \text{max_len}$
Insert $\rightarrow r = (r + 1) \mod \text{max_len}$
where $[r] = x$

Queue is full if $f = (r + 1) \mod \text{max_len}$
Queue is empty if $f = -1$ and $r = -1$

→ Double Ended Queue (Dequeue)

Elts can be added and removed at either end

(Both ends must have f and r pointers) - called left and right

Dequeues can be input restricted (insert at one end only) or output restricted (remove from one end only).

Implemented using circular array/ll

Note:- Stacks & queues can be implemented w/ arrays or linked lists

6. ABSTRACT DATA TYPE (ADT)

Logically describing of how we view data and operations (data structures) without regard to how they will be implemented.

⇒ Priority Queue :- Each element is assigned a priority.
Priority determines which elt will be processed first.

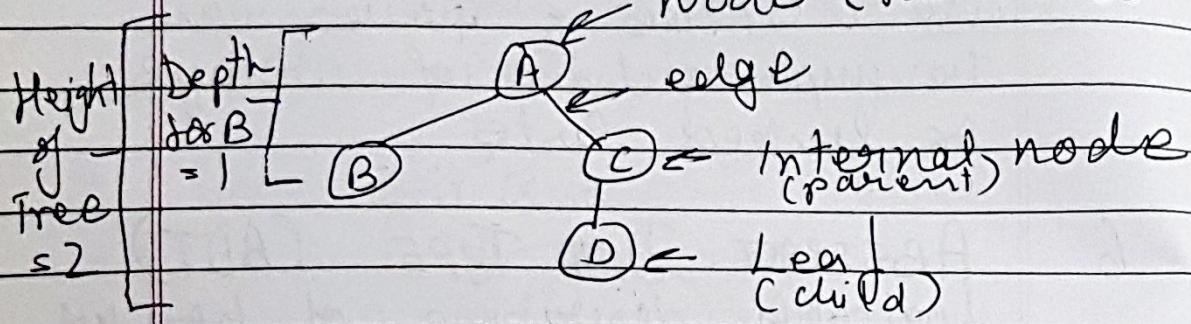
ADT is like a blueprint.
It gives requirement & operations
Ex Array :-

Minimal Read Functionality :-
get elt at ;
& set an elt at posⁿ & n
get(i) - get elt i
set(i, num) - set elt at posⁿ n.

Operations :- max(), min(), search(num),
insert(i, num); append(xe)

1. TREES

Non linear, hierarchical DS
node (root node)



Height :- Longest path to a leaf
Depth of a node :- Length of path to root

→ Binary Tree :- Can have at most two children

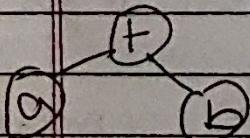
- Traversal of Binary Tree :-

L - Left Subtree

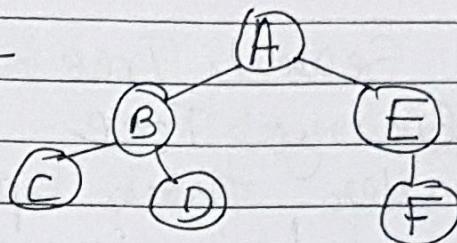
R - Right Subtree

D - Print Data

- ① Inorder (LDR) $\Rightarrow a + b$
- ② PreOrder (DLR) $\Rightarrow + ab$
- ③ PostOrder (LRD) $\Rightarrow ab +$



Ex :-



Inorder :- CBD A F E

PreOrder :- A B C D E F

PostOrder C D B F E A

⇒ PreOrder is same as Depth First Search (DFS)

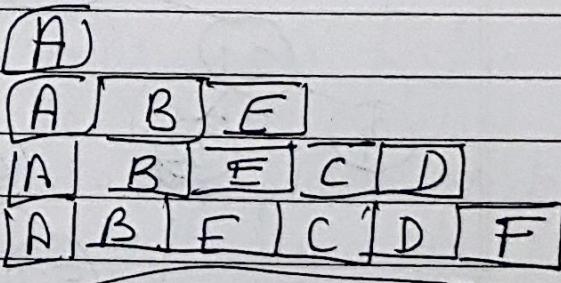
→ Breadth First Search (BFS)

Traverses tree level by level
(use queue).

It would be like :-

A B E C D F

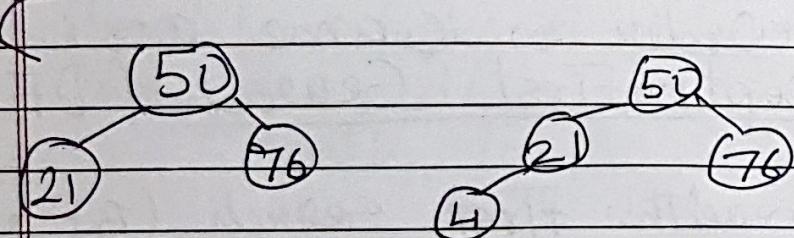
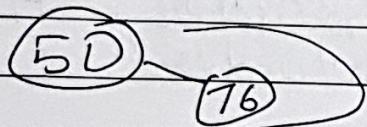
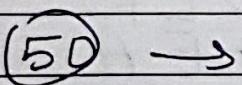
Ques :-



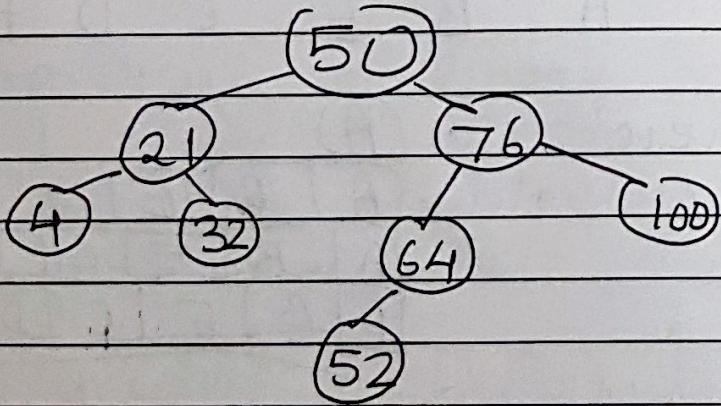
→ Binary Search Tree :-

~~Sorted Binary Tree~~ Left child is smaller than parent, right child is larger than parent

Ex:- 50, 76, 21, 4, 32, 100, 64, 52



Final Tree :-



To find a value (x) :-

$x == \text{node}$ → return true

$x < \text{node}$ → traverse left

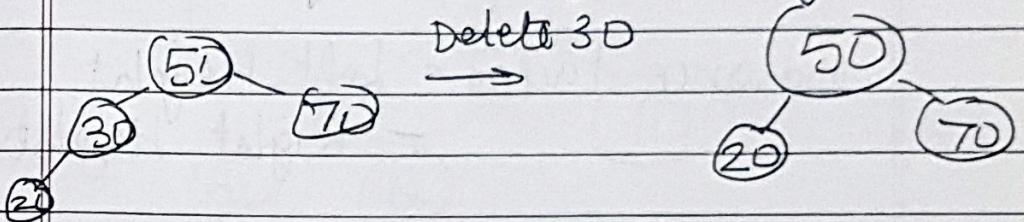
$x > \text{node}$ → traverse right

Delete :-

(1) No children (leaf node)

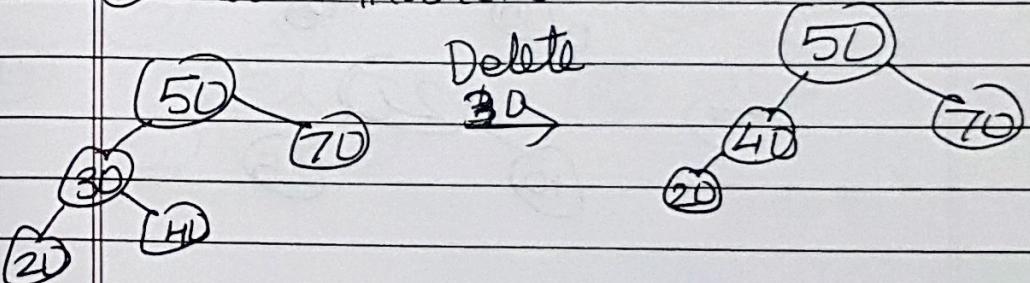
Just delete

(2) One child (Left or Right)



Make parent of node to be deleted point to child.

(3) Two children



Find the min value node to the right of node to be deleted.

Add this node in place of deleted node & make left child of deleted node, left child of the new node and right child of deleted node, right child of new node (if applicable).

→ AVL Tree

Height balanced BST.

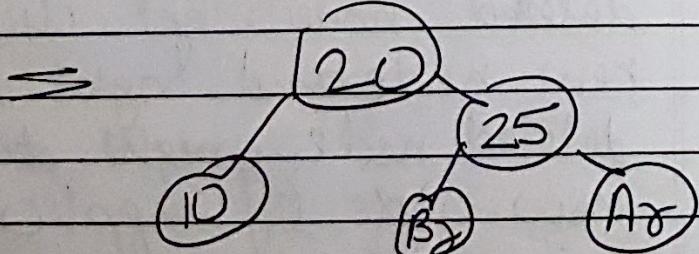
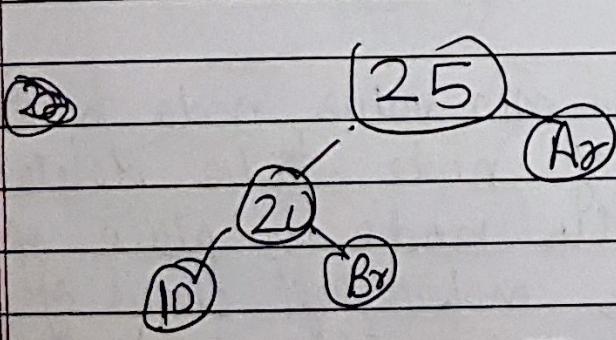
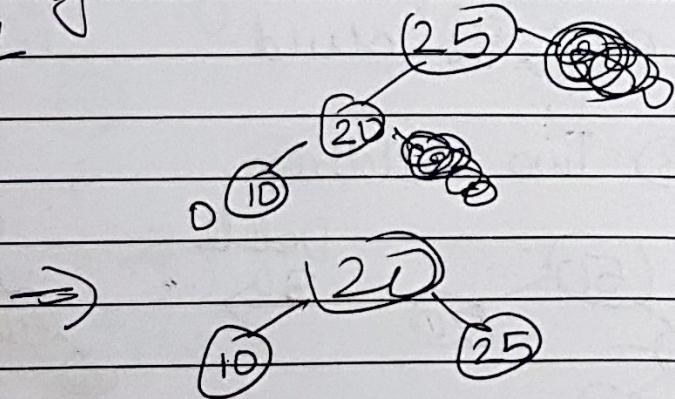
Height of the node kids is at most 1.

Correct balance factor is 1, 0, -1

Balance Factor = Left-Height
- Right-Height

Types of Rotations :-

① LL



Viewing, Insertion, Deletion
takes $O(\log n)$

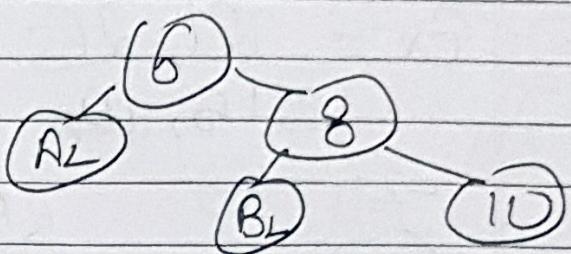
Deletion

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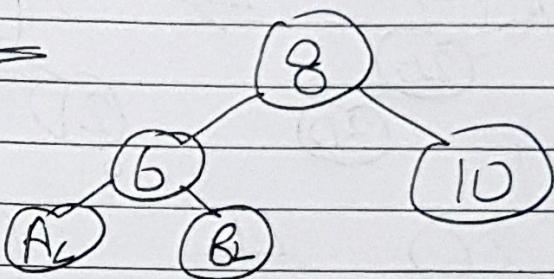
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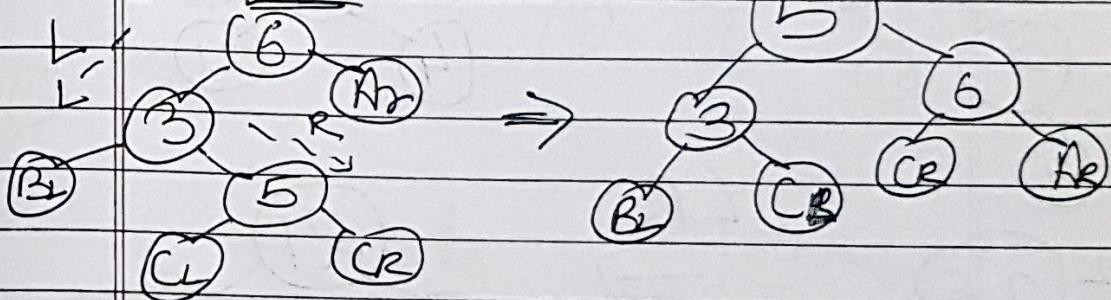
(2) RR



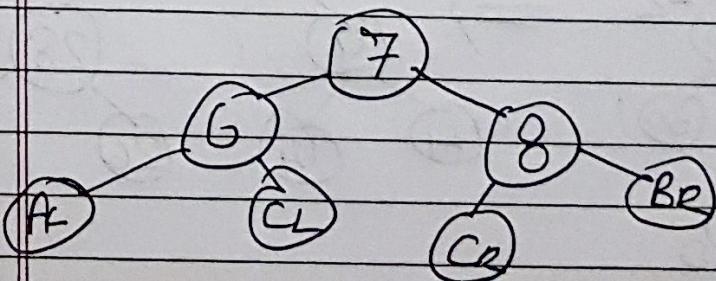
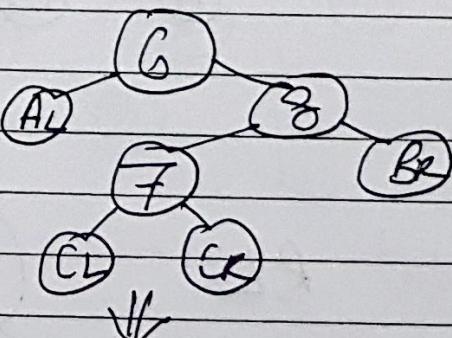
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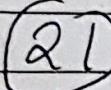
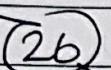
(3) LR



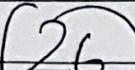
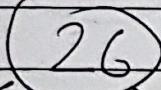
(4) RL



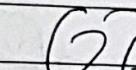
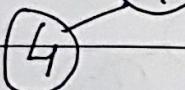
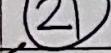
Ex :- 21, 26, 30, 9, 4, 14, 28, 18,
15, 10, 2, ~~24~~

⁻²⁻¹

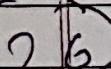
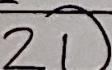
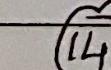
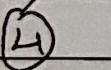
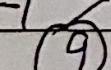
RR

⁰ \Rightarrow 

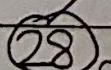
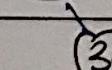
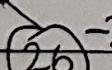
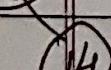
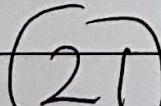
LL

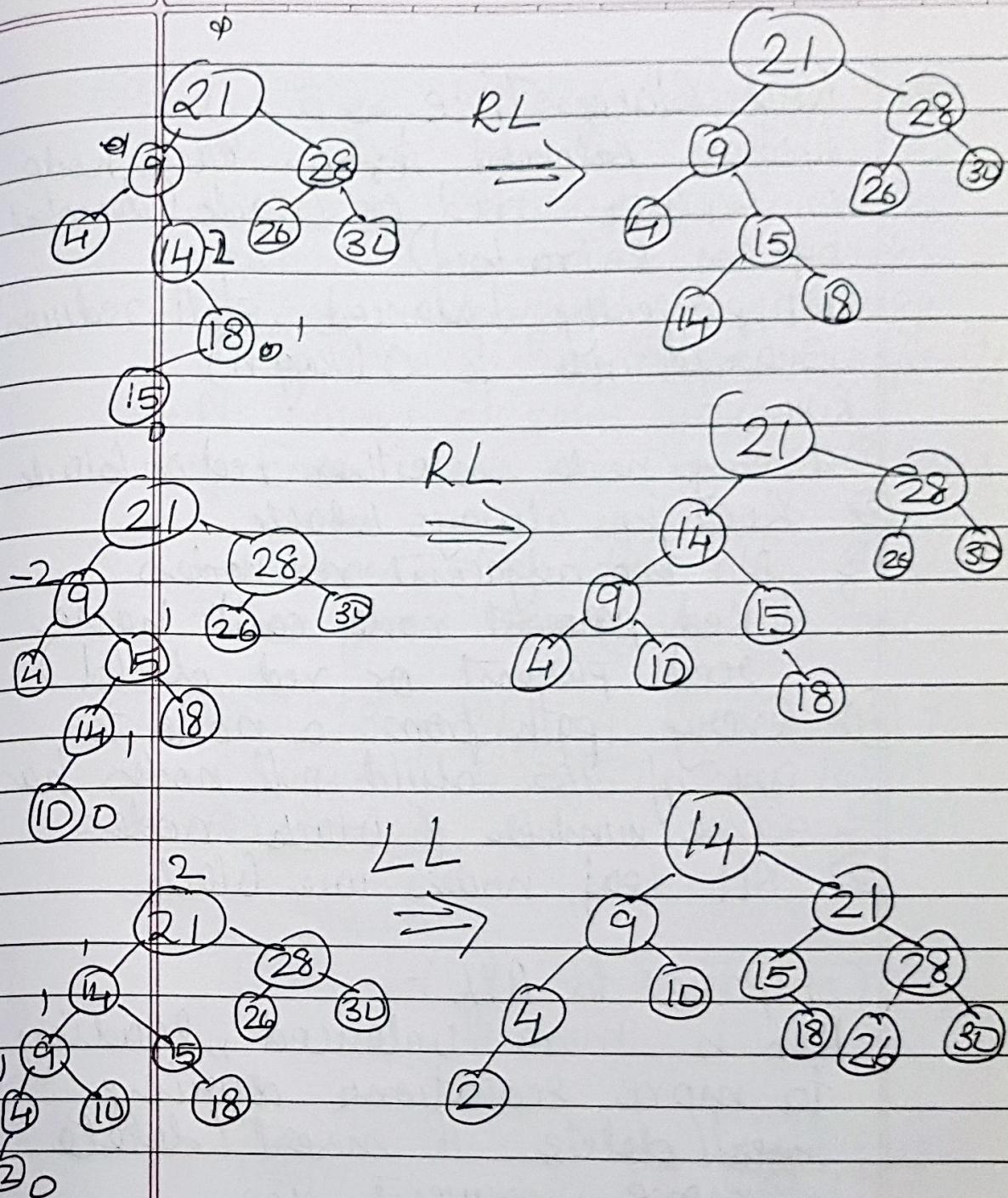
⁰

LR

²

RL





⇒ Red Black Tree

Another balanced tree. Each node is either red or black (denoted by an extra bit)

Not perfectly balanced, still reduces search time to $O(\log n)$

Rules :-

- ① Every node is either red or black
- ② Root is always black
- ③ No two adjacent red nodes
(Red parent node can't have red parent or red child)
- ④ Every path from a node to any of its child null nodes has same number of black nodes
- ⑤ All leaf nodes are black

Compare to AVL :-

AVL is more balanced, leading to more rotations during insert/delete. If insert/delete is more frequent, use Red Black tree

→ Splay Tree :- BST w/ additional property that recently accessed elements are quick to access again

⇒ B-Tree :- Self balancing tree.

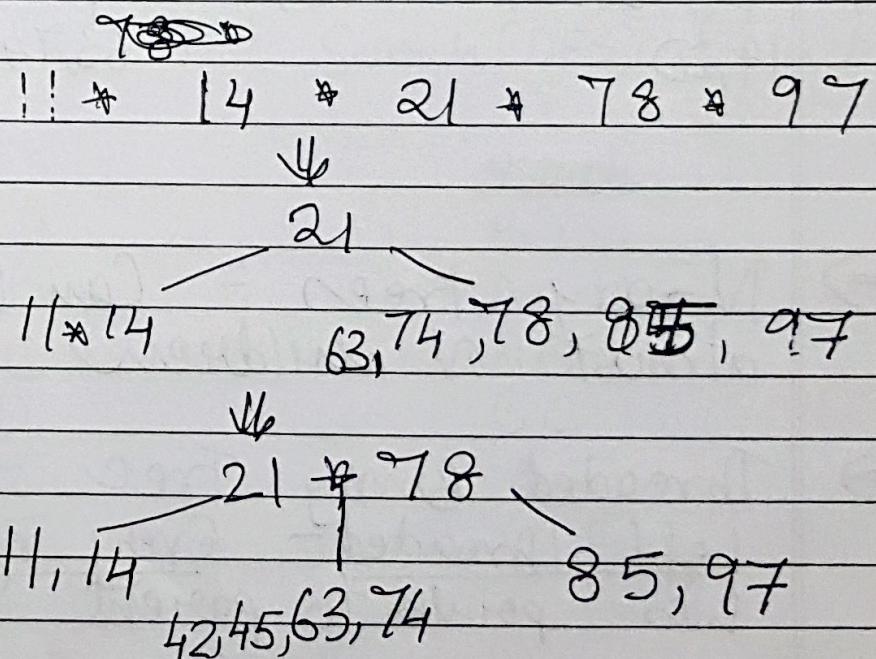
When data is too large to be stored in main memory, it is read from disk in chunks.

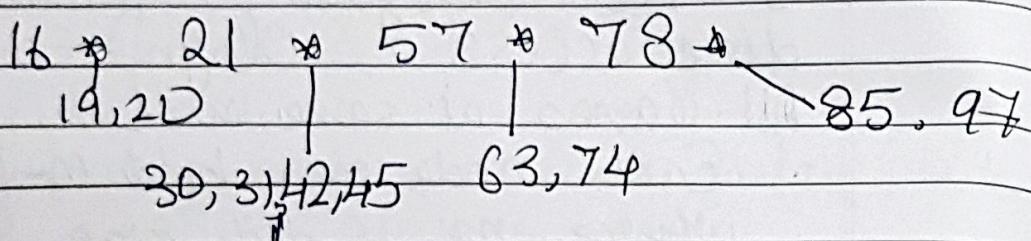
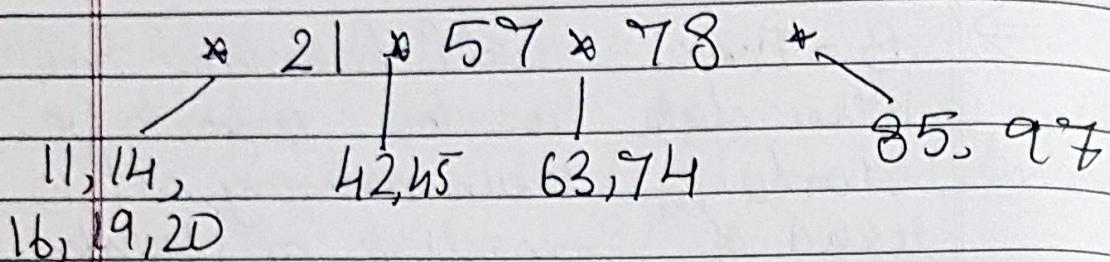
B-Tree designed to minimize disk access $O(\log n)$ complexity.

- All leaves at same level

- Each node can hold $m-1$ keys where m is disk size.
- Number of children = no. of key + 1
- Tree grows & shrinks at root

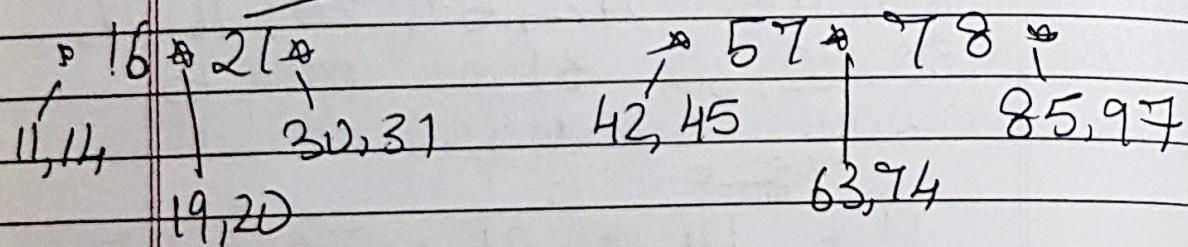
Ex :- 78, 21, 14, 11, 97, 85, 74, 63, 45, 42, 57, 20, 16, 19, 30, 32, 30, 31 $m = 5$





Root will Split
↓

(32)



⇒ N-ary trees : Can have almost N children

⇒ Threaded Binary Tree
Left Threaded : Every right child has pointer to parent

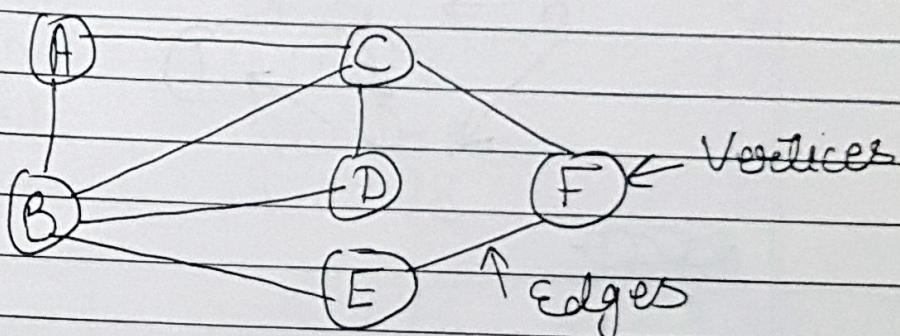
Right Threaded : Left child has pointer to parent

8. GRAPH

- Two way threaded - Both children point to parent.

8. GRAPH

Non linear DS with vertices/nodes and edges. $G(V, E)$



Breadth First Search (BFS) (Queue)
 Depth First Search (DFS) (Stack)

BFS :-

A
B
C
D
E
F

~~Stack~~

B C
ACDF
ABDF
BC
BF
CF

Visited

A B C D E F
1 0 1 0 1 0 1 0

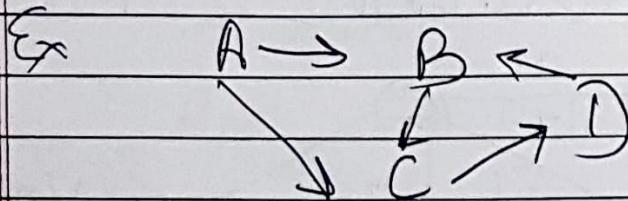
Queue
O/P

A B C D E F
A B C D E F

Adjacency Matrix : Better for dense graph

Adjacency List : Better for sparse graph

→ Directed graph :
Only one direction edge



BS502

9. HASHING

Storing data by dynamic DS
called Hash Table

Table organization and searching
technique in which

Insert/Delete/Search operations
done in O(1)

Uses HASH FUNCTION to put
data in Hash table.

Enables to store & retrieve
data quickly. Can be implemented
as an array

Every entry in hash table is associated w/ some KEY.
 Hash Function transforms key to an array table index.

Key(k) \rightarrow [Hash Function] \rightarrow Address $h(k)$

Ex:- Name	key(k)	$h(k)$ key % B
DLD A	985926	6
EDLC	970876	10
DSF	986047	11
CDA	970428	5

D	1	2	3	4	5	6	7	8	9	10	11	12
					CDA	D2 D A				EDL C DSF		

Characteristics of good hash fnctr
 → Minimize collision i.e. distribute keys uniformly across the table
 → Compute $h(k)$ efficiently
 → Use all info in the key.

→ Collision:- Diff keys when hash to same locations.
 Colliding keys are known as Synonyms.

Popular Hash Fns

- Division Remainder Method
(Modulo Division Method)
- Mid Square Method
- Folding Method
- Multiplication Method

① Division Remainder Method :-

$$h(k) = k \bmod n \text{ or } k \bmod (n+1)$$

Decide a n .

10

HUFFMAN ALGORITHM

Used for text compression
lossy compression - Quality degraded

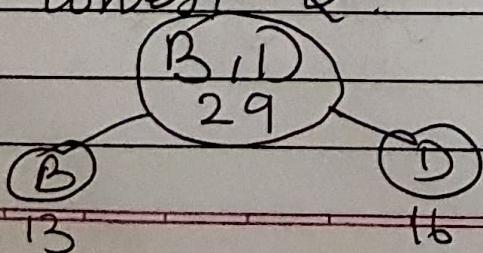
Ex:-

Character →	A	B	C	D	E	∅
Frequency →	22	13	18	16	31	

Sort acc to frequency

B	D	C	A	E
13	16	18	22	31

Combine lowest 2 :-

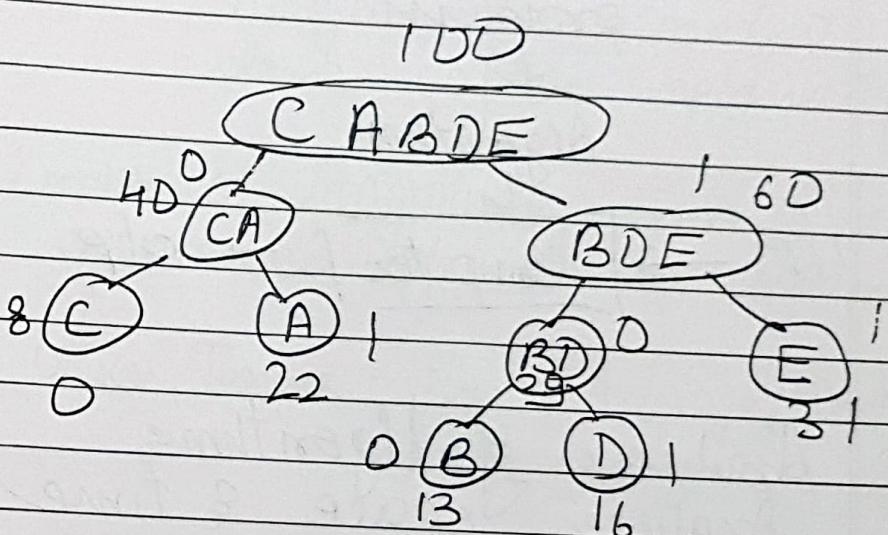


Recorded

C	A	B, D	E
18	22	29	31

BD	E	C, A
29	31	4D

CA	BDE
4D	60



Code for each alphabet

A	0	1	22×2
B	1	0	0
C	0	0	13×3
D	1	0	1
E	1	1	16×3
			31×2

229 bits

Most frequently occurring character has fewer number of bits.

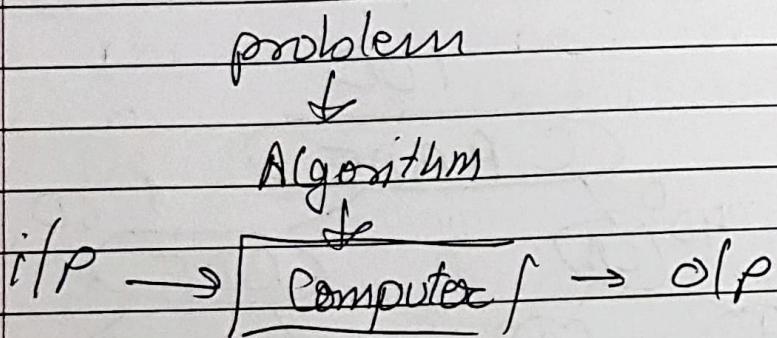
Before compression ($100 + 40 + 60 + 29 + 31 + 18 + 22 + 31 + 13 + 16$) = 800 bit

After compression = 229 bits

Analysis of Algorithms

1 Introduction

Algorithm - Well defined computational procedure that takes some value or set of values as input & produces value(s) as output



→ Analysis of Algorithms
Analyze space & time complexity

Algorithms can be specified in natural language or pseudo code

Time Complexity - Amt of computer time an algo needs to execute & get the result

Space Complexity - Am't of memory needed to run an algo.

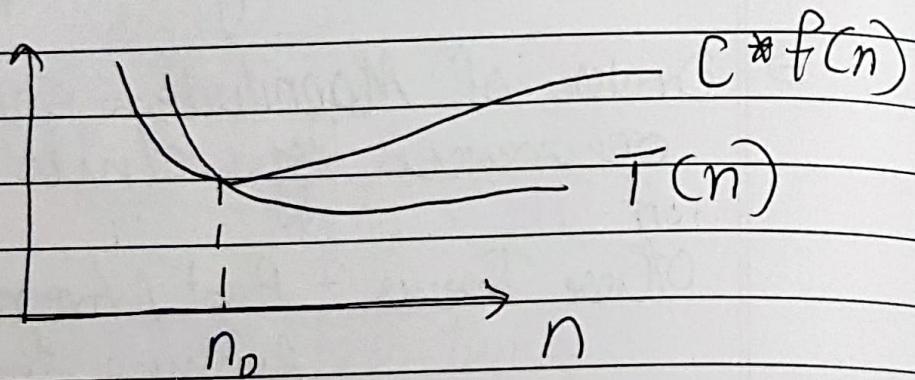
- Priori Analysis
 - Machine independent,
 - done before implementing
- Posteriori Analysis
 - Target machine dependent
 - done after implementing
- Order of Magnitude - Sum of no. of occurrences of statements contained in it.
- Other Terms :- Best / Average / Worst case running time
- Asymptotic Notations - How running time of an algo increases w/ size of input (bounded)

i) \mathcal{O} Notation :- Worst Case running time

for functions $T(n)$ and $f(n)$
nonnegative

$T(n) = \mathcal{O}(f(n))$ if there are positive constants c, n_0 such that

$$T(n) \leq c * f(n) \text{ for all } n, n \geq n_0 \quad (c > 0, n_0 \geq 1)$$



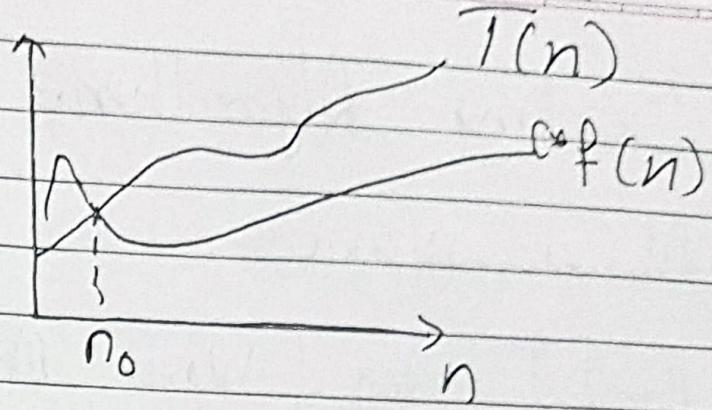
$f(n)$ is the upper bound

ii) $\mathcal{\Omega}$ Notation :- Best Case

$T(n) = \mathcal{\Omega}(f(n))$ if there is c and n_0 such that

$$T(n) \geq c * f(n) \text{ for all } n, n \geq n_0 \quad (c > 0, n_0 \geq 1)$$

$f(n)$ is the lower bound



(iii) Θ notation - Average Case
 $T(n) = \Theta(g(n))$ if there is c_1, c_2, n_0 such that

$$c_1 * g(n) \leq T(n) \leq c_2 * g(n)$$

for all $n, n \geq n_0$
 $(c_1, c_2 > 0, n_0 \geq 1)$

→ Algorithms of two types

① Iterative - Count no. of times instructions are executed

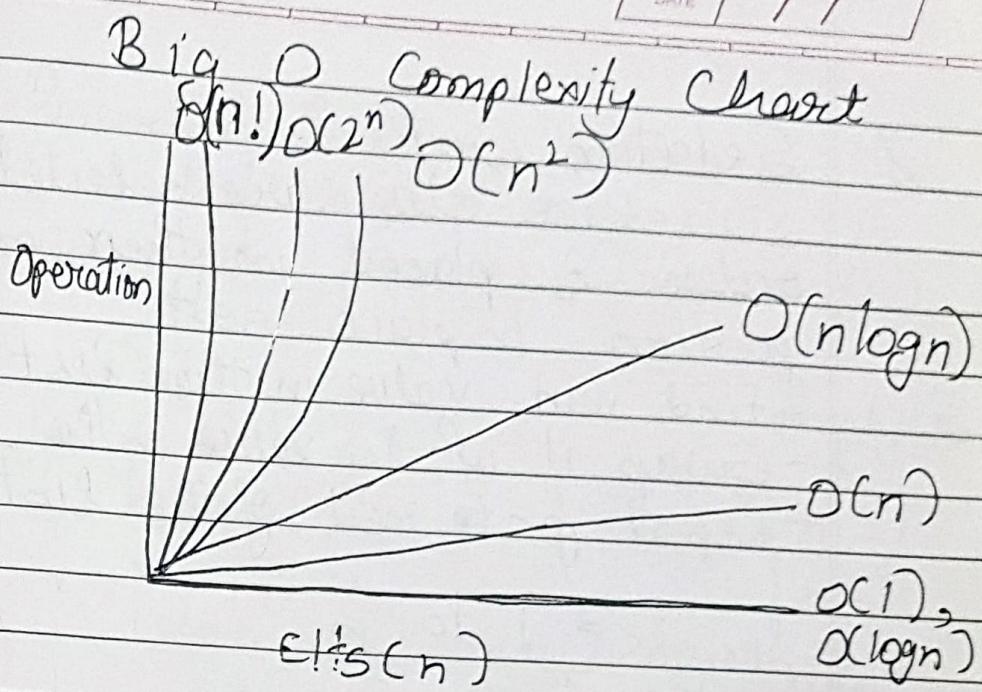
② Recursive - Recurrence equation

2. Sorting Algorithme

At a glance

Name (Sort)	Best Case	Avg Case	Worst Case	Memory	Method	Stable
Quick	$n \log n$	$n \log n$	n^2	$\log n$	Partition	N
Merge	$n \log n$	$n \log n$	$n \log n$	n	Merge	Y
Heap	$n \log n$	$n \log n$	$n \log n$	1	Selection	N
Insertion	n	n^2	n^2	1	Insertions	Y
Selection	n^2	n^2	n^2	1	Selection	N
Bubble	n	n^2	n^2	1	Exchange	Y
Shell	$n \log n$	$n^{4/3}$	$n^{3/2}$	1	Insertions	N
Tree	$n \log n$	$n \log n$	$n \log n$	n	Insertions	Y
Cycle	n^2	n^2	n^2	1	Selection	N
TimSort	n	$n \log n$	$n \log n$	n	Merge + Selection	Y
Used by Python						

TimSort is hybrid of merge + insertion sort



1. Bubble Sort

Simplest algo. Repeatedly swaps adjacent elements if they are in wrong order.

Not suitable for large datasets.

```
for(i=0; i < n-1; i++)
```

```
    for(j=0; j < n-i-1; j++)
```

```
        if (arr[j] > arr[j+1])
```

```
            swap(arr[j], arr[j+1])
```

Useful for almost sorted datasets.

2. Selection Sort

Successive elts are selected in order & placed in their proper position. In place sort.

- Find min. value in the list
- Swap it w/ the value in the 1^{st} posⁿ
- Repeat for rest of the list

Step	Cost
for $i = 1$ to n	$n+1$
for $j = i$ to n	$n(n+1)/2$
if ($A[i] < A[j]$) then	$n(n+1)/2 - 1$
$j = k$	$n(n+1)/2 - 1$
swap ($A[i], A[j]$)	1
swap ($A[i], A[j]$)	n

Use when list is small or memory is limited.

3. Insertion Sort : Places an unsorted element and place in its right position. (like cards)

Code

for $j = 2$ to n

key = $A[j]$

$i = j - 1$

while $i > 0$ and $A[i] > \text{key}$

$A[i + 1] = A[i]$

$i = i - 1$

$A[i + 1] = \text{key}$

Analysis

n

$n - 1$

$n - 1$

$\sum_{i=2}^n t_i$

$n - 1$

$n - 1$

$n - 1$

When list is sorted (nearly sorted).
Space complexity of O(1)

3. Merge Sort (Divide & Conquer)

Divides input array in half repeatedly until only one elt left, and merges the two sorted halves.

Merge-Sort (A , low , high)

if ($\text{low} < \text{high}$)

$\text{mid} = (\text{low} + \text{high}) / 2$

Merge-Sort (A , low , mid)

Merge-Sort (A , $\text{mid} + 1$, high)

Merge (A , low , mid , high)

Merge (A, low, mid, high)

$h = \text{low}$, $i = \text{low}$, $j = \text{mid} + 1$

Auxiliary array $B[i:j]$

while ($h \leq \text{mid}$ & $j \leq \text{high}$)

if ($A[h] \leq A[j]$)

$B[i] \leftarrow A[h]$

$h = h + 1$

else

$B[i] = A[j]$

$j = j + 1$

$i = i + 1$

if ($h > \text{mid}$)

for $k = j$ to high

$B[i] = A[k]$

$i = i + 1$

else

for $k = h$ to mid

$B[i] = A[k]$

$i = i + 1$

for $k = \text{low}$ to high

$A[k] = B[k]$

Uses:- When data structure doesn't allow random access. (linked list ex)

Used in external sorting.

Sequential access

5

Quick Sort (Divide & Conquer)
 Fastest known sorting algo.
 Aka Partition Exchange Sort.
 No merge step involved.

Quicksort (A, lb, ub)
 if ($lb \leq ub$)

 pivot = Partition (A, lb, ub)

 Quicksort ($A, lb, pivot - 1$)

 Quicksort ($A, pivot + 1, ub$)

Partition (A, lb, ub)

$x = A[lb]$

 up = ub

 down = lb

 while ($down < up$)

 while ($A[down] \leq x \& down < up$)

$down = down + 1$

 while ($A[up] > x$)

$up = up - 1$

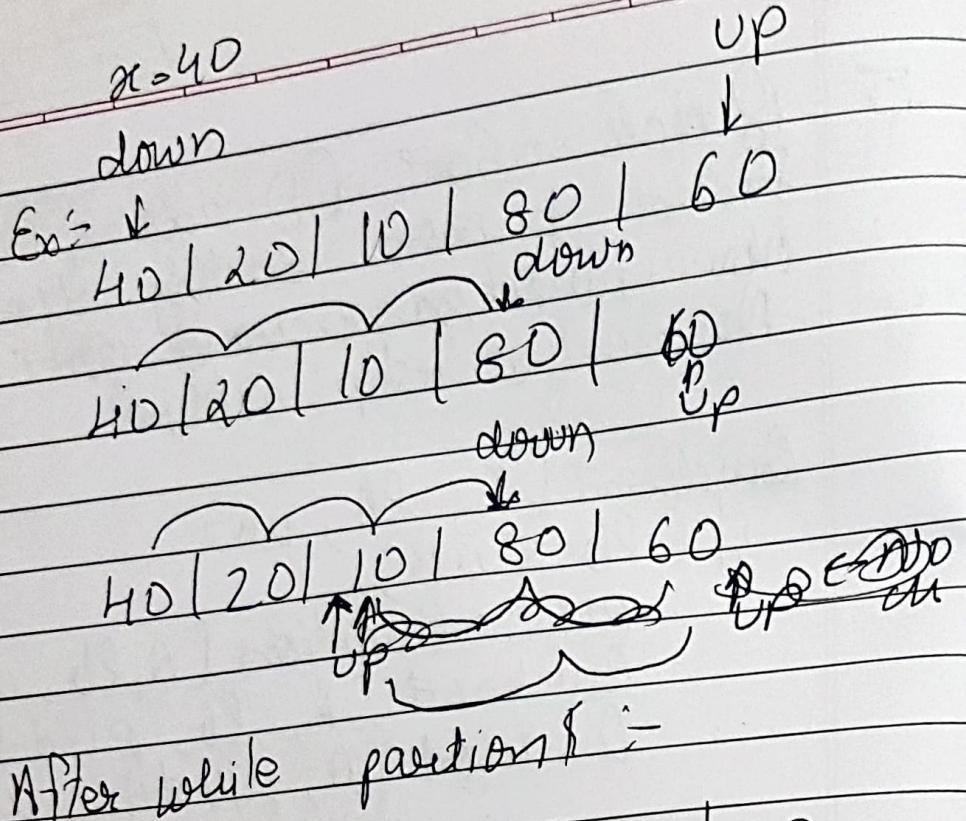
 if ($down \leq up$)

 swap ($A[down], A[up]$)

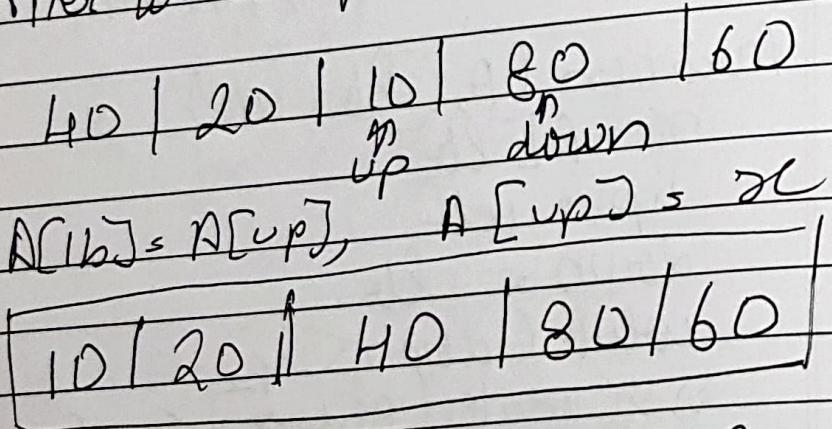
$A[lb] = A[up]$

$A[up] = x$

 Return up



After while partition :-



partition will return 3 as op

When to use :-

More effective when data fits in memory. It is an in-place sort.

Worst performance on sorted array.

Solution :- Randomized quicksort
 - Choose pivot randomly.
 - Make random shuffling.

5.

Searching

1.

Linear Search

linear-search(seq , A)

```
for ( $i = i$  to  $n$ )
    if ( $A[i] = \alpha$ )
```

return i

return null

Time Complexity: $O(n)$ (Avg/Worst)
 Best: $O(1)$

2.

Binary Search (Divide & Conquer)

Bin search (A, n, target)

left = 1

right = n

while ($\text{left} \leq \text{right}$)

$\text{mid} = \lceil \log(\text{left} + \text{right}) / 2 \rceil$

if ($\text{target} = A[\text{mid}]$)

return mid

else if ($\text{target} > A[\text{mid}]$)

low = mid + 1

else

high = mid - 1

Time Complexity Avg/Worst = $O(\log n)$

5. Approximating Time Complexity

→ Iterative :- Count number of times instructions are executed

Ex:- for i = 1 to n
 for j = 1 to n
 for k = 1 to n
 ...

$$\text{Time Complexity} = O(n^3)$$

for i = 1 to n n
 ...
 for j = 1 to n n
 ...

$$\text{Total} = n + n = 2n$$

$$\text{Time Complexity} = O(n)$$

→ Recursive Algorithms :-

Three methods :-

(i) Recursion Relation/Substitution
 Ex:- A(n)

if ($n \geq 1$)

 return $A(n/2) + A(n/2)$

$$\text{Time } T(n) = C + 2 T(n/2)$$

If return was $n-1$, it would
be

$$T(n) = c + 2T(n-1)$$

* Some Common Recurrences

Recurrence	Solution
$T(n) = T(n/2) + d$	$T(n) = O(\log_2 n)$
$T(n/2) + n$	$O(n)$
$2T(n/2) + d$	$O(n)$
$2T(n/2) + n$	$O(n \log n)$
$T(n-1) + d$	$O(n)$

(ii) Master's Theorem : For divide & conquer algo;

if problem of size n is divided into ~~into~~ a problems of size n/b
let cost of each stage to divide &
conquer be $f(n)$

Then, according to Master's theorem

$$\text{If } T(n) = aT(n/b) + f(n) \quad a \geq 1, b \geq 1 \text{ then,}$$

$$T(n) = \begin{cases} \Theta(n^{\log_b a}) & f(n) = O(n^{\log_b a - \epsilon}) \\ \Theta(n^{\log_b a} \log n) & f(n) = \Theta(n^{\log_b a}) \\ \Theta(f(n)) & f(n) = \Omega(n^{\log_b a + \epsilon}) \end{cases}$$

$$\text{and } af(n/b) < c_f(n) \quad \epsilon > 0, \epsilon > 0, c < 1$$

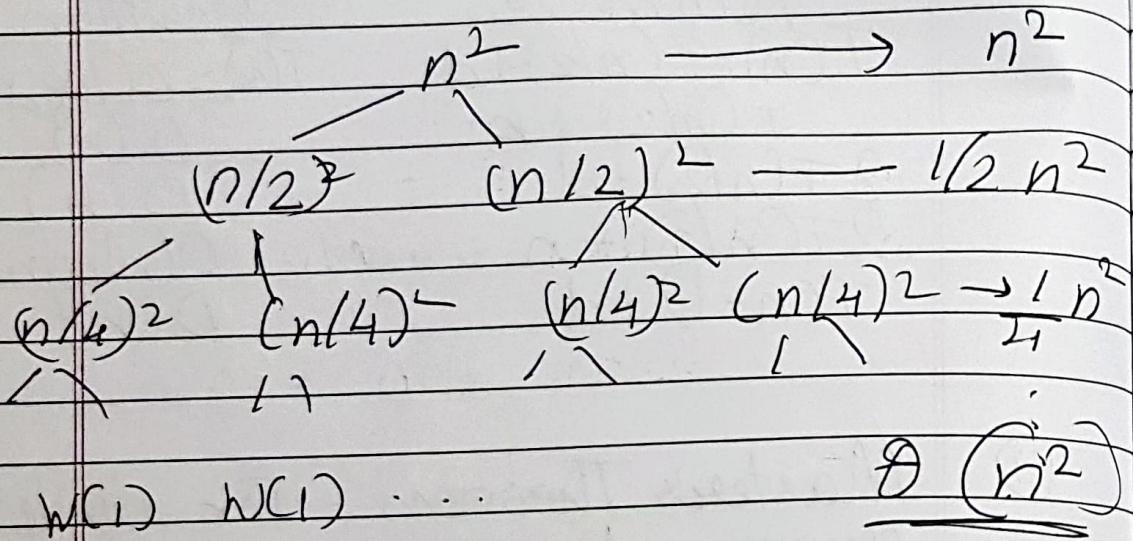
(iii)

Recurrence Tree

Node - Cost at various levels
Sum up cost of all levels

Ex :-

$$w(n) = 2w(n/2) + n^2$$



5.

DIVIDE & CONQUER

Divide problem to subproblems
 Solve Subproblem - Conquer
 Combine to get solution



Previous examples:-

- (1) - Merge Sort
- (2) - Quick Sort
- (3) - Binary Search

(4)

Strassen's Matrix Multiplication

Standard Matrix Multiplication: $O(n^3)$
 Strassen's - $\sim O(n^{\log 7})$

where n is $n \times n$ matrix

MatMul(A, B, C, n)

if $n = 1$

$$C = C + A * B$$

else

MatMul(A, B, C, $n/4$)

MatMul(A, $(B + n/4)$, $(C + n/4)$, $n/4$)

MatMul($A + 2 \times (n/4)$, B, $C + 2 \times n/4$, $n/4$)

MatMul($A + 2 \times (n/4)$, $B + n/4$, $C + 3 \times n/4$, $n/4$)

MatMul($A + (n/4)$, $B + 2 \times (n/4)$, P, $n/4$)

MatMul($A + (n/4)$, $B + 3 \times (n/4)$, $C + (n/4)$, $n/4$)

MatMul($A + 3 \times (n/4)$, $B + 2 \times (n/4)$, $C + 2 \times (n/4)$, $n/4$)

MatMul($A + 3 \times (n/4)$, $B + 3 \times (n/4)$, C + 3 × (n/4), n/4)

There are 18 $n^{1/2} \times n^{1/2}$ matrix
addⁿ subⁿ $O(n^2)$

7 $n^{1/2} \times n^{1/2}$ multiplications

$$T(n) = 7T(n/2) + O(n^2)$$

$$= O(n^{2+81})$$

$$T(n) = O(n^{\log 7})$$

(5)

Max & Min in a list

- Divide problem into $n^{1/2}$ subproblems & find min and max recursively-

Time Complexity = $O(n)$

MaxMin(i, j, max, min)

if $i = j$

max = min = $A[i]$

else if ($i = j - 1$)

if $(A[i] < A[j])$

min = $A[i]$; max = $A[j]$

else

min = $A[j]$; max = $A[i]$

else

mid = $\lceil (i+j)/2 \rceil$

MaxMin(i, mid, max, min)

MaxMin(mid+1, j, max, min)

if ($\max < \max_1$)

max = \max_1

if ($\min < \min_1$)

min = \min_1

6.

DYNAMIC PROGRAMMING

Method used when problem to be solved is a sequence of decisions. Final solution by combining solution to sequence of subproblems.

Steps :-

- Characterize structure of optimal soln
- Recursively define value of optimal soln
- Compute value of optimal soln, typically in a bottom-up fashion.
- Construct optimal soln from computed info.

(1)

All Pairs Shortest Path

Floyd-Warshall Algorithm

A graph $G(V, E)$, find shortest path between every pair of vertices

$w(i,j) = D$ if $i=j$

$w(i,j) = \infty$ if no connecting edge

$w(i,j)$ is wt of edge.

No of iterations = no of vertices

Algorithm \downarrow No of vertices

~~for~~ $n \leftarrow \text{rows}(W)$

$D(0) \leftarrow n$ ~~# input~~

~~for~~ $k \leftarrow 1$ to n

~~for~~ $i \leftarrow 1$ to n

~~for~~ $j \leftarrow 1$ to n

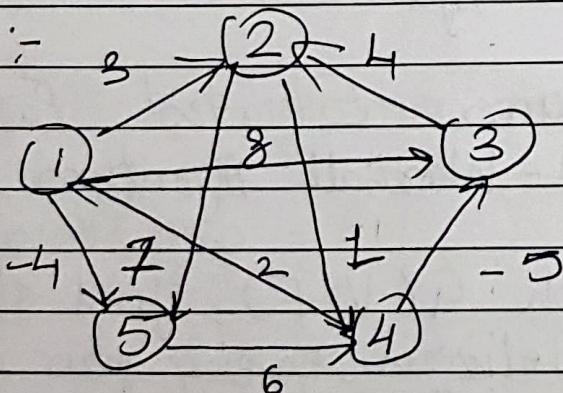
$$D_{ij} \leftarrow \min(D_{ij}, D_{ik} + D_{kj})$$

return D

$$\cancel{D_0 = W_0}$$

Time complexity = $O(n^3)$

Ex :-



	1	2	3	4	5
1	0	3	8	∞	-4
2	∞	0	∞	1	not
3	∞	4	0	∞	∞
4	2	∞	-5	0	∞
5	∞	∞	∞	6	0

Iteration 1 :- D_1 -> Distance from to all nodes via node 1

$D^{(1)}_s$	1	2	3	4	5
1	0	3	8	∞	-4
2	∞	0	∞	1	7
3	∞	4	0	∞	∞
4	2	5	-5	0	-2
5	∞	∞	∞	6	0

Expl:-

$i = 4, j = 2$ To go from node 4 to 2 via 1, total cost
 $= \min(\infty, 2 + 3 = 5) = 5$

Similarly $i = 4, j = 3$

$$W^b = \min(-5, 2 + 8 = 10) = -5$$

Iteration k=2

$D^{(2)}_s$	1	2	3	4	5
1	0	3	8	4	-4
2	∞	0	∞	1	7
3	∞	4	0	5	11
4	2	5	-5	0	-2
5	∞	∞	∞	6	0

Algorithm \downarrow no of vertices

for $n \leftarrow \text{rows}(W)$

$D(0) \leftarrow n$ // Input

for $k \leftarrow 1$ to n

for $i \leftarrow 1$ to n

for $j \leftarrow 1$ to n

$$D_{ij} \leftarrow \min(D_{ij}, D_{ik} + D_{kj})$$

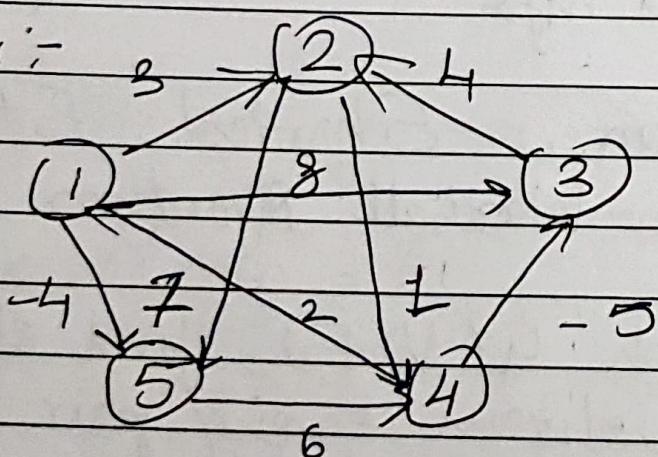
return D

~~D_{ij}~~

~~$D_0 = \infty$~~

Time complexity = $O(n^3)$

Ex :-



Input - $D_0 = \infty$

	1	2	3	4	5
1	0	3	8	∞	-4
2	∞	0	∞	1	$\cancel{7}$
3	∞	4	0	∞	∞
4	2	∞	-5	0	∞
5	∞	∞	∞	6	0

Iteration 1 : D_1 ^{shortest} Distance from to
all nodes via node 1

$D(1)_s$	1	2	3	4	5
1	0	3	8	∞	-4
2	∞	0	∞	1	7
3	∞	4	0	∞	∞
4	2	5	-5	0	-2
5	∞	∞	∞	6	0

Expl:-

Q i = 4, j = 2 To go from node 4 to 2 via 1, total cost
 $= \min(\infty, 2 + 3 = 5) = 5$

Similarly i = 4, j = 3

$$W_b = \min(-5, 2 + 8 = 10) = -5$$

Iteration k = 2

	1	2	3	4	5
1	0	3	8	4	-4
2	∞	0	∞	1	7
3	∞	4	0	5	11
4	2	5	-5	0	-2
5	∞	∞	∞	6	0

~~k=3~~

	1	2	3	4	5
1	0	3	8	4	-4
2	∞	0	∞	1	7
3	∞	4	0	5	11
4	2	-1	-5	0	-2
5	∞	∞	∞	6	0

~~k=4~~

	1	2	3	4	5
1	0	3	-1	4	-4
2	3	0	-4	1	-1
3	7	4	0	5	3
4	2	-1	-5	0	-2
5	8	5	1	6	0

~~k=5~~

	1	2	3	4	5
1	0	1	-3	2	-4
2	3	0	-4	1	-1
3	7	4	0	5	3
4	2	-1	-5	0	-2
5	8	5	1	6	0

Output = D_5

② Longest Common Subsequence

Substring v/s Subsequence

Substring :- Substring of a string S is another string S' that occurs in S and all the letters are contiguous in S

Eg S :- HellWorld
 S' :- World.

Subsequence :- Subsequence of string S is another string S' that occurs in S and all letters need not be contiguous

Eg S :- HellWorld ; S' = Herd

Longest Common Subsequence :-
Given two strings A of length x and B of length y , find the longest common subsequence between both strings from left to right

Brute force Method :-

- S1 :- Find all subsequences of A, (2^x)
- S2 :- For each subsequence, find whether it is subsequence of B, (2^y)
- S3 :- Choose the longest common subsequence

Time complexity $y \times 2^x$ or $O(n2^m)$

Dynamic Programming Method :-
 Two Strings:
 $X = \{x_1, x_2, x_3, \dots, x_m\}$
 $Y = \{y_1, y_2, y_3, \dots, y_n\}$

First compare x_m and y_n , if matched, find subsequence in remaining string & append x_m .
 If $x_m \neq y_n$,

remove x_m from X & find LCS from x_1 to x_{m-1} and y_1 to y_n .

remove y_n from Y & find LCS from x_1 to x_m and y_1 to y_{n-1} .

$C[i, j]$ = length of LCS of $x_i \& y_j$

$$C[i, j] = \begin{cases} 0 & \text{if } i=0 \text{ or } j=0 \\ C[i-1, j-1] + 1 & \text{if } i, j > 0 \text{ & } x_i = y_j \\ \max(C[i, j-1], C[i-1, j]) & \text{if } i, j > 0 \\ & \quad \quad \quad \{x_i \neq y_j\} \end{cases}$$

LCS- Length (X, Y)

$m \leftarrow \text{length}(X)$

$n \leftarrow \text{length}(Y)$

for $i \leftarrow 1$ to m

do $c[i, 0] \leftarrow 0$

for $j \leftarrow 0$ to n

do $c[0, j] \leftarrow 0$

for $i \leftarrow 1$ to m

for $j \leftarrow 1$ to n

if $x_i = y_j$

$c[i, j] \leftarrow c[i-1, j-1] + 1$

else if $b[i, j] \leftarrow "↖"$

else if $c[i-1, j] > c[i, j-1]$

$c[i, j] \leftarrow c[i-1, j]$

$b[i, j] \leftarrow "↑"$

else

$c[i, j] \leftarrow c[i, j-1]$

$b[i, j] \leftarrow "←"$

return $c \& b$

PRINT-LCS (b, X, i, j)

if $i = 0$ & $j = 0$

return

if $b[i, j] = "↖"$

PRINT-LCS ($b, X, i-1, j-1$)

print x_i

else if $b[i, j] = "↑"$

PRINT-LCS ($b, X, i-1, j$)

else PRINT-LCS ($b, X, i, j-1$)

Total Runtime = O(mn)

Ex:- LCS of ACBCF &
A B C D AF

	A	C	B	C	F
A	0	0	0	0	0
B	0	1↖	1↖	1↖	1↖
C	0	1↑	1↑	2↖	2↖
D	0	1↑	2↖	2↑	3↖
E	0	1↑	2↑	2↑	3↑
F	0	1↖	2↑	2↑	3↑
	0	1↑	2↑	2↑	4↖

Follow as per arrow, point on (↖)
 F C B A → Reverse ⇒ A B C F

(3)

Single Source Shortest Path

For graph $G = (V, E)$, to find the shortest path from given source vertex $S \in V$ to every other vertex $V \in V$



Bellman - Ford Algorithm

Given a weighted, directed graph $G = (V, E)$ with source S , the algo returns a boolean value indicating whether or not there is a -ve weight cycle reachable from the source.

$\text{Bellman-Ford}(f, n, s)$

INITIALIZE-SINGLE-SOURCE(G, s)

for $i \leq 1$ to $|V[G]| - 1$

 for each edge $(u, v) \in E[G]$
 $\quad\quad\quad$ RELAX(u, v, w)

 for each edge $(u, v) \in E[G]$

$d[v] > d[u] + w(u, v)$

 return FALSE

~~return~~

return TRUE

INITIALIZE-SINGLE-SOURCE(G, s)

for each vertex $v \in V[G]$

do $d[v] \leftarrow \infty$

$\pi[v] \leftarrow \text{NIL}$

$d[s] \leftarrow 0$

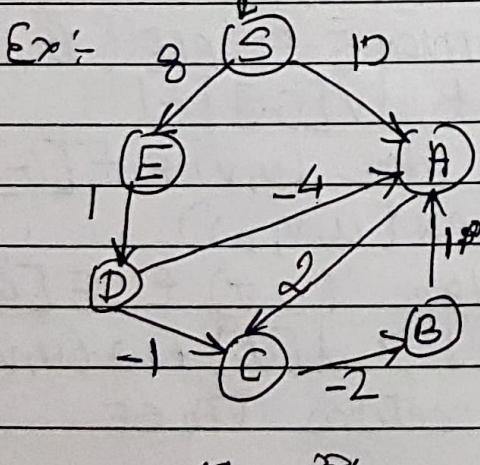
RELAX(u, v, w)

if $d[v] > d[u] + w(u, v)$

$d[v] \leftarrow d[u] + w(u, v)$

$\pi[v] \leftarrow u$

Time complexity:- For V vertices
 $\in E$ edge edge $D(VE)$
source



	U	V	w
S	A	10	
S	E	8	
A	C	2	
E	D	1	
B	A	1	
D	A	-4	
D	C	-1	
C	B	-2	

Initialization

d	S	A	B	C	D	E
π	N	N	N	N	N	N

Ist Iteration (go through u,v,w list)

	S	A	B	C	D	E
d	0	-105	6	8	102+2	8+1=9
T	N	SD	C	AD	E	S

Keep looping through u,v,w list
fill n-1 or two iterations give
same result.

While creating u,v,w list always
start w/ S & go to next
connected vertex.

II

	S	A	B	C	D	E
d	0	5	5	7	9	8
T	N	D	C	A	E	S

	S	A	B	C	D	E
d	0	5	5	7	9	8
T	N	D	C	A	E	S

Output

$S \rightarrow A$	$S \xrightarrow{8} E \xrightarrow{1} D \xrightarrow{-4} A$
$S \rightarrow B$	$S \xrightarrow{8} E \xrightarrow{1} D \xrightarrow{7} A \xrightarrow{2} C \xrightarrow{1} B$
$S \rightarrow C$	$S \rightarrow E \rightarrow D \rightarrow A \rightarrow C$
$S \rightarrow D$	$S \rightarrow E \rightarrow D$
$S \rightarrow E$	$S \rightarrow E$

(4)

Multistage graph

Can use single source shortest path.

(5)

0/1 Knapsack Problem

DP Knapsack (V, p, w, M, n)for $i \leftarrow 1$ to n $V[i, 0] \leftarrow 0$ for $j \leftarrow 0$ to M $V[0, j] \leftarrow 0$ for $i \leftarrow 1$ to n for $j \leftarrow 1$ to M if $w[i] \leq j$ $V[i, j] \leftarrow \max \{ V[i-1, j], p[i] + V[i-1, j - w[i]] \}$

else

 $V[i, j] \leftarrow V[i-1, j]$ Complexity = $O(n \times M)$

n = No. of elts

m = capacity of knapsack

w_i - weight of itemp_i - price of item

Maximize price within given capacity

$\frac{E_x}{M} = \frac{7}{4}, n = 4$
 $w = \{1, 3, 4, 5\}, p = \{1, 4, 5, 7\}$

Hem	1	2	3	4	5	6	7
$w_1 = 1, p_1 = 1$	0	0	0	0	0	0	0
$w_2 = 3, p_2 = 4$	0	1	1	1	1	1	1
$w_3 = 4, p_3 = 5$	0	1	1	4	5	5	5
$w_4 = 5, p_4 = 7$	0	1	1	4	5	7	8

Trace - Knapsack (w, v, V, m)

$$sw \leftarrow \emptyset$$

$$sp \leftarrow \emptyset$$

$$i \leftarrow 0, j \leftarrow m$$

while ($v > 0$)

$$\text{if } (v[i, j] = v[i-1, j]) \\ i \leftarrow i - 1$$

else

$$sw \leftarrow sw + w[i]$$

$$sp \leftarrow sp + p[i]$$

~~i+1~~

$$j' \leftarrow j$$

$$j' \leftarrow j' - w[i]$$

$$j' \leftarrow i - 1$$

too poor, poor?

$$sw$$

$$j = 7 - 4 = 3$$

$$sp$$

$$\underline{\underline{4}}$$

7. Greedy Method

Make choice that looks best at that moment.

Sometimes works, sometimes, doesn't
Properties :-

- Globally optimal soln is obtained from locally optimal soln
- Best choice in current situation selected
- Optimal Substructure :- Problem has optimal substructure if an optimal soln to the problem is composed of optimal solns to subproblems.

① Single Source Shortest Path

- Dijkstra's algorithm

All weights must be non-negative

S :- Set of vertices whose final shortest path weights have already been determined.

Q :- A min priority queue keyed by their distance values.

Repeatedly select vertex $v \in V - S$ (kept in Q), with minimum shortest

path and add u to S , & relax all edges leaving u .

Dijkstra (G, w, s)

INITIALIZE-SINGLE-SOURCE (G, s)

$$S \leftarrow \emptyset$$

$$Q \leftarrow V[G]$$

$$\text{while } Q \neq \emptyset$$

$$u \leftarrow \text{EXTRACT-MIN}(Q)$$

$$S \leftarrow S \cup \{u\}$$

for each vertex $v \in \text{Adj}[u]$

RELAX (u, v, w)

INITIALIZE-SINGLE-SOURCE (G, s)

for each vertex $v \in V[G]$

$$d[v] \leftarrow \infty$$

$$\pi[v] \leftarrow \text{NIL}$$

$$d[s] \leftarrow 0$$

RELAX (u, v, w)

$$\text{if } d[v] > d[u] + w(u, v)$$

$$d[v] \leftarrow d[u] + w(u, v)$$

$$\pi[v] \leftarrow u$$

Time complexity $\mathcal{O}(V^2)$

Priority Queue Impl.

Time Complexity

Array

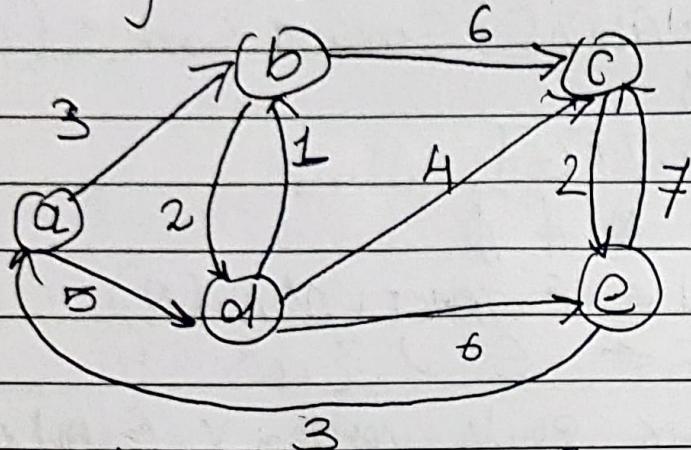
$O(V^2)$

Priority Queue

$O(V \log V)$

Binary Heap

$O(E \log V)$



$$S = \emptyset$$

$$Q^S = \{a, b, c, d, e\}$$

	a	b	c	d	e
d	0	∞	∞	∞	∞
T	n	n	n	n	n

$$u = a \quad Q = \{b, c, d, e\} \quad S = \{a\} \quad V = b, d$$

	a	b	c	d	e
d	0	3	∞	5	∞
T	n	a	n	a	n

$$u = b \quad Q = \{c, d, e\} \quad S = \{a, b\} \quad V = \{c, d\}$$

	a	b	c	d	e
d	0	3	9	5	∞
T	n	a	b	a	n

$U = d$; $\emptyset = \{c, e\}$, $S = \{a, b, d\}$; $V = \{b, c, e\}$

	a	b	c	d	e
d	0	3	g	5	11
π	w	a	b	a	d

$U = c$, $\emptyset = \{e\}$, $S = \{a, b, c, d\}$; $V = \{e\}$

	a	b	c	d	e
d	0	3	g	5	11
π	w	a	b	a	d

$U = e$, $\emptyset = \emptyset$, $S = \{a, b, c, d, e\}$

② Knapsack (Fractional)

- Sort items in decreasing c_i/w_i
- Add items till no more items or sack is full (exceeds W)
- If sack is not full, fill with fraction of next unselected item.

Knapsack(C, W, M, X, n)

for $i \leftarrow 1$ to n
 $X[i] \leftarrow 0$

$RC \leftarrow M$

for $i \leftarrow 1$ to n
 if $W[i] > RC$
 break
 $X[i] \leftarrow 1$
 $RC \leftarrow RC - W[i]$

if $i \leq n$ then
 $X[i] \leftarrow RC / W[i]$

M - Knapsack capacity

$W[i]$ - Weight of item i

$X[i]$ - 0/1 array telling if item i is selected or not.

Time Complexity: $O(n \log n)$

③ Spanning Tree

- For an connected undirected graph, spanning tree of the graph is subgraph which is a tree and connects all vertices.

for $G(V, E)$, $T = (V, E')$ is a spanning tree iff T is a tree.

Minimum Spanning Tree (MST)

is a spanning tree with weight less than or equal to every other spanning tree of that graph.

Algorithms

3.1 Kruskal's Algorithm

- Set A is ~~empty~~
- Edge A is added to A if it is always a least weighted edge in the graph that connects two distinct components.

MST Kruskal (G, w)

$A \leftarrow \emptyset$

for vertex $v \in V[G]$

 Make-Set(v)

Sort edges of E by increasing wt w

for each edge $(u, v) \in E$

 if $\text{Find-Set}(u) \neq \text{Find-Set}(v)$

$A \leftarrow A \cup \{(u, v)\}$

 Union(u, v)

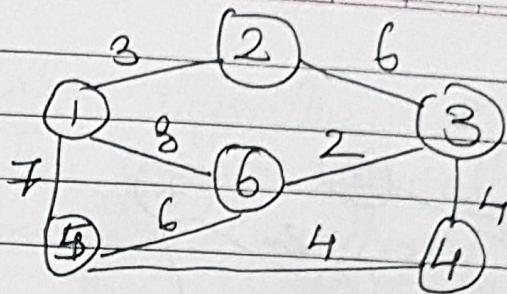
Returns A

Make-Set(x): - Creates set of single elt x

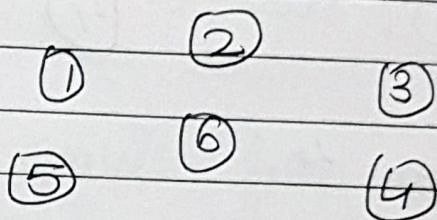
Find-Set(x) - determining if two vertices $v \in V$ belong to same tree by checking if $\text{Find-Set}(v) = \text{Find-Set}(x)$

Union(x, y) - Unites the sets that contain $x \in y$ say $S_x \in S_y$ into a new set that is union of the two sets.

Analysis:- Avg case $\geq \underline{\mathcal{O}(E \log E)}$

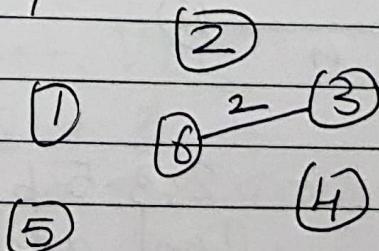


Disjoint Forest

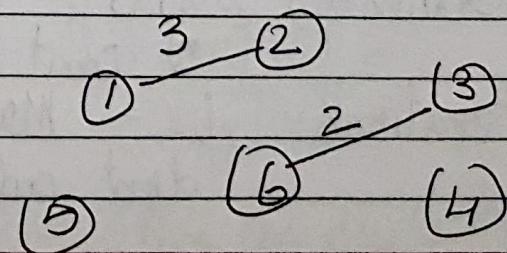


Sort edges	edge	wt
(3,6)		2
1,2		3
3,4		4
4,5		4
2,3		6
5,6		6
1,5		7
1,6		8

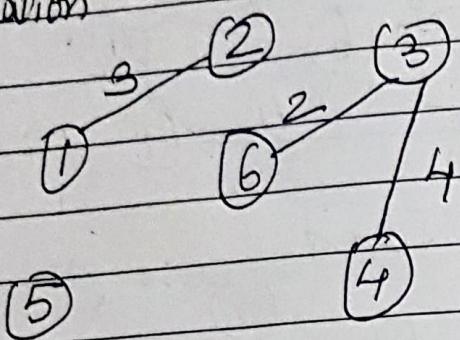
Iteration 1



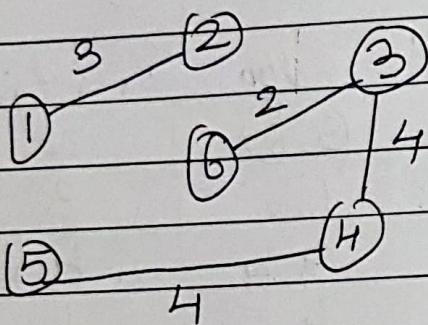
Iteration 2



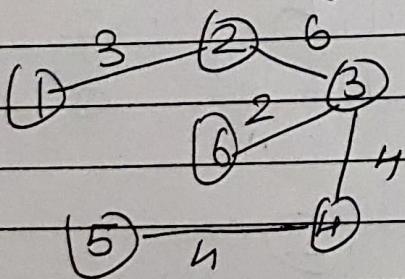
Iteration 3



Iteration 4



Iteration 5 :- (2,3) forms cycle? No, add



Iteration 6 :- 2,3,5,6 makes cycle? Yes
Don't add

Iteration 7 :- 1,5 - Yes makes cycle? Yes
Don't add

Iterations 8
6,6 - Makes cycle? Yes
don't add.

3.2

Prim's Algorithm

- MST grows "naturally" starting from an arbitrary root.
 - Has the property that the edges in the set always form a single tree
- logic
- Tree starts from arbitrary root vertex r .
 - Grow the tree until it spans all vertices in set V

Data structure

- A min. priority queue keyed by edge values

- root vertex

MST-PRIM(G, w, r)

for each $u \in V[G]$

key $[u] \leftarrow \infty$

$\pi[u] \leftarrow N/A$

key $[r] \leftarrow 0$

$\leftarrow V[G]$

while $\emptyset \neq Q$

do $w \leftarrow \text{Extract-Min}(Q)$

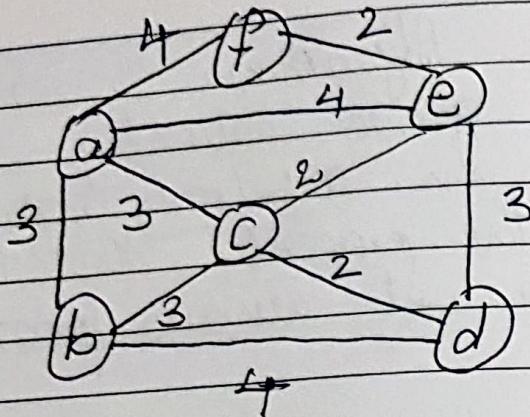
for each $v \in \text{Adj}[u]$

if $v \in Q$ and $w(u,v) < \text{key}[v]$

$\pi[v] \leftarrow u$

$\text{key}[v] \leftarrow w(u,v)$

Analysis: Avg complexity $O(E \log V)$

Ex

key	a	b	c	d	e	f
π	0	∞	∞	∞	∞	∞

① $u = a \quad Q = \{b, c, d, e, f\}$
 $v = b, c, e, f$

key	a	b	c	d	e	f
π	0	3	3	∞	4	4

② $u = b \quad Q = \{c, d, e, f\} \quad v = c, d, e, f$

key	a	b	c	d	e	f
π	0	3	3	4	4	4

③ $u = c \quad Q = \{d, e, f\} \quad v = d, e, f$

key	a	b	c	d	e	f
π	0	3	3	2	2	4

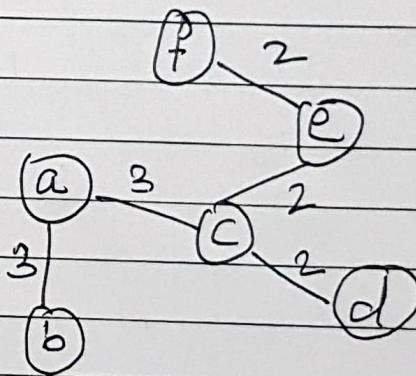
④ $u = d \quad Q = \{e, f\} \quad v = \emptyset, \emptyset$

	a	b	c	d	e	f
key	0	03	3	2	2	4
T	w	a	a	c	c	a

⑤ $u = e \quad Q = f \quad v = a, f$

	a	b	c	d	e	f
key	0	3	3	2	2	2
T	w	a	a	c	c	e

⑥ $u = f \quad Q = \emptyset \quad v = \emptyset, \emptyset$



(4)

Job Sequencing using deadlines
 - list of n jobs with each job i has a deadline $d_i \geq 0$ and profit $p_i > 0$ earned only if job completed

- Find a subset J s.t. each job of this subset can be completed within deadline; maximizing profit

- ① Sort p_i into decreasing order
- ② Add next job i to the soln set J if i can be completed by deadline.
 - Assign i to time slot $[r-1, r]$, where r is $1 \leq r \leq d_i$ and slot $[r-1, r]$ is free.
 - * Schedule in latest possible free slot for optimal soln
- ③ Repeat step 2 till slot full or jobs examined.

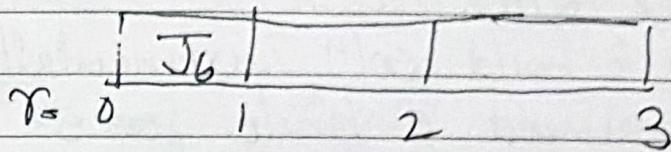
Complexity: $O(n^2)$

$$P = \{p_1, p_2, p_3, \dots, p_7\} = [5, 4, 8, 7, 6, 9, 3] \\ d = \{d_1, d_2, d_3, \dots, d_7\} = [3, 2, 1, 3, 2, 1, 2]$$

Sort in descending order

i	6	3	4	5	1	2	7
p	9	8	7	6	5	4	3
d	1	1	3	2	3	2	2

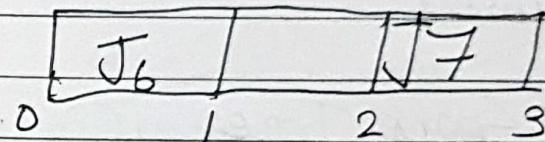
Job scheduling



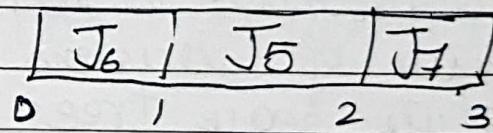
1) Early loop:-

J₃ - Rejected

J₄ - Accepted



J₅ - Accept



→ Optional :-
 ① Optimal Storage on tapes
 ② Huffmann Coding

8. BACKTRACKING

Try to build solⁿ incrementally

Refinement of brute force.

Systematically search set of possible solns "solution space" to solve given problem.

From n solutions (x_1, x_2, \dots, x_n), x_i is chosen.

→ State Space Tree

State Space : Set of states a system can exist in

Solⁿ to problem is obtained by sequence of decisions resulting in state space tree.

Root : - State before any decision

① Sum of Subsets

Given n positive integers find subsets of w_1, \dots, w_n that sums S .
Solⁿ vector $\{x_1, x_2, \dots, x_n\}$ x_i is 1 if included, else 0.

Binary State Space Tree :

Node at depth 1 is for item1 (yes/no)

at depth 2 for item2, etc.

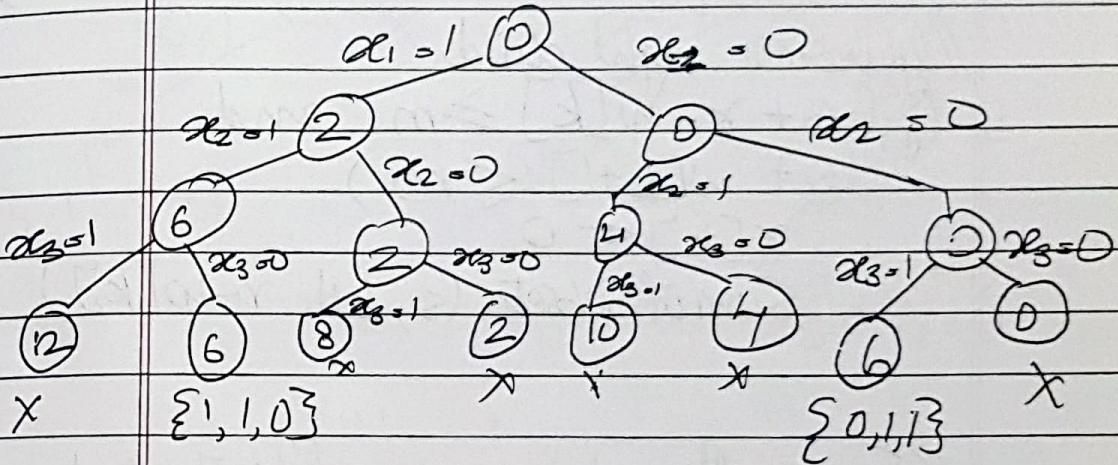
left branch includes w_i , right branch excludes w_i .

Nodes contains sum of weights so far
 i.e.

At every stage, we check whether node is valid or not. If invalid, we backtrack to parent.

Ex

$$w_1 = 2, w_2 = 4, w_3 = 6 \quad S = 6$$



Initial call :- $(0, 1, \gamma)$

S :- Current sum; initialized to 0

k :- current elt to consider

γ :- sum of all elts $w[1:n]$

SumofSubsets (s, k, r)

// generate left child

$x[k] \leftarrow 1$

if ($s + w[k] \leq m$)

 write $x[1:k]$ // one subset found

else if ($s + w[k] + w[k+1] \leq m$)

 SumofSubsets ($s + w[k], k+1, r - w[k]$)

// generate right child

if ($s + r - w[k] \geq m$ and

$s + w[k+1] \leq m$)

$x[k] \leftarrow 0$

SumofSubsets ($s, k+1, r - w[k]$)

// Find all subsets of $w[1:n]$ that

sum to m

$$Cs = \sum_{j=1}^n w[j] * x[j]$$

$$x = \sum_{j=k}^n w[j]$$

$w[j]$ are in ascending order
(sorted array)

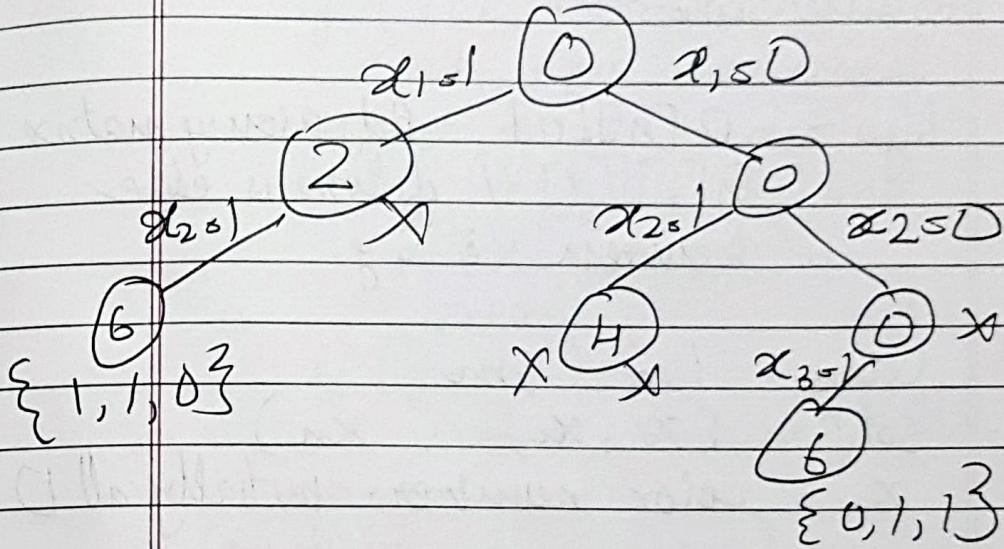
∴ assumed that $w[i] \leq m \in$

$$\sum_{i=1}^n w[i] \geq m$$

left &

New generation of right child results
in a pruned tree.

$$w_1 \leq 2, w_2 \leq 4, w_3 \leq 6 \quad S \leq 6$$



Complexity = $O(2^n)$

②

Graph Coloring

G - Graph, m - No. of colors (positive int)

No two adjacent nodes can have same color.

Algo :- $G[n][n]$ - Adjacency matrix
 $G[i][j] = 1$ if there is edge between $i \in g$.

Colors : $1, 2, \dots, m$

Sol n (x_1, x_2, \dots, x_n)

x_i = color number. Initially all 0

Graph coloring (k) \downarrow Node (Initial $k=1$)

while (true)

Next Value (k)

if ($x[k] = 0$)

return // No new color possible

if ($k = n$)

write($x[1 \dots n]$)

else

Graph coloring ($k+1$)

NextValue(k)

while true

$$x[k] = (x[k]+1) \bmod(m+1) // \text{Next}$$

// Highest color

if ($x[k] > 0$) return

// All colors are used

for y ← 1 to n do

if ($G[k][y] \neq 0$) and

$$(x[k] = x[y])$$

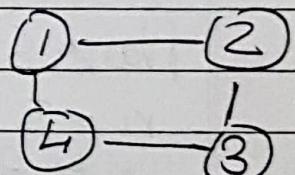
break

if ($y = n+1$)

return // Color found.

Complexity = $O(mn)$

Ex:- 4 nodes, 2 colors



State Space tree - $\{0, 0, 0, 0\}$

Node 1

$$x_1 = 1$$

$$\{0, 0, 0, 0\}$$

$$x_1 = 2$$

Node 2

$$x_2 = 1$$

$$x_2 = 2$$

$$x_2 = 2$$

X

$$x_2 = 2$$

$$x_2 = 1$$

X

$$x_3 = 1$$

$$x_3 = 2$$

$$x_3 = 2$$

X

X

X

$$x_4 = 1$$

$$x_4 = 2$$

$$x_4 = 2$$

X

X

X

$$\{2, 1, 2, 1\}$$

$$\{1, 2, 1, 2\}$$

9. STRING AND PATTERN MATCHING

→ PATTERN MATCHING

Given Text (T) & Pattern (P),
pattern matching finds substring
of T equal to P

Algorithms:

① Naive String Matching, algo :-

Brute force approach.

Compares first char. of P w/ T
if matched, increment both p & t pos
else, shift pointer of T only &
reset P .

Repeat till end of text or pattern found

Naive String Match (T, P)

$n = T$. length

$m = P$. length

for $s = 0$ to $(n-m)$

if $P[0..m] = T[s+1..s+m]$

"pattern occurs w/ shift s"

Time :- $O(nm)$

(2)

RABIN KARP

Generalizes well to related problems like 2-D pattern matching.

Idea

Compare a string's hash value.

Alg slides pattern one by one matching hash value of P w/ hash of current substr of T .

If value matches, check if P matches substring.

Converting substr & P to hash & comparing nrs is easier.

Input :- Text T , Pattern P , radix d (UNICODE, ASCII(256), etc), prime no q .

Radix $| \in |$ - set of possible characters in a string.

For ascii ascii, 256 characters are possible.

RABIN KARP (T, P, d, q)

$n = T$. length

$m = P$. length

$h = d^{m-p} \bmod q$

$P \neq D$

$t_0 = 0$

for $i = 1$ to m // Preprocess

$P = (dP + P[i]) \bmod q$

$t_0 = (dt_0 + T[i]) \bmod q$

for $s = 0$ to $n-m$ // Match

if $P == t_s$

if $P[1..m] == T[s+1..s+m]$

point "Pattern at shift" $+ s$

if $s < n-m$

$t_{s+1} = (d(t_s - T[s]) \cdot h)$

$+ T[s+m+1]) \bmod q$

Time = $O((n-m+1)m)$
Optimal Time $O(m+n)$