

## Search strategies

- i. uninformed search / Blind search.
- ii. Informed search / Heuristic search.

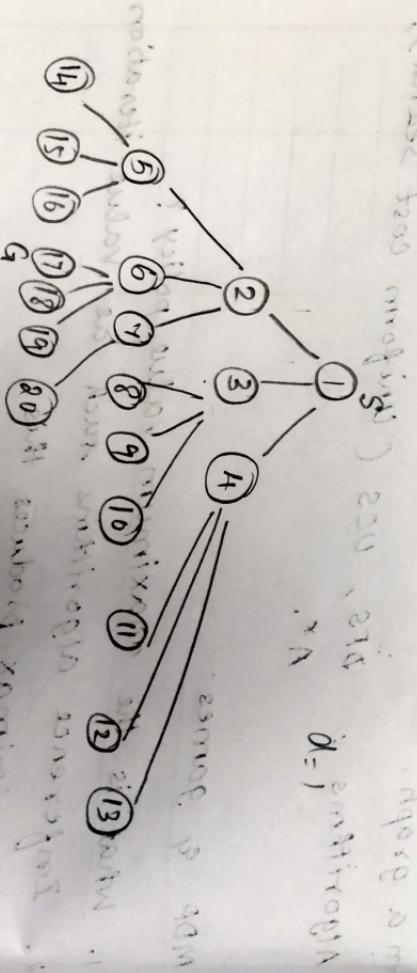
### Uninformed search / Blind search

Consider the state space where the start state is 1 and the successor function for the state i returns 3 states namely  $i+1$ ,  $3i-1$ ,  $3i$ ,  $3i+1$ .

- i. Draw the state space graph for 1 to 20

Let the goal be 17.

- ii. List the nodes generated according to BFS, DFS.



Various problems : some irreducible

• Unsolvable - 0

• Redundant - 0

BFS

12, 8, 4, 9, 7, 8, 9, 10, 11, 12, 13, 14, 15, 16, 17, 18

DFS (51, 82) (8, 92) (4, 8A2)

1 (51, 82) (4, 8A2) (8, 92) (4, 8A2)

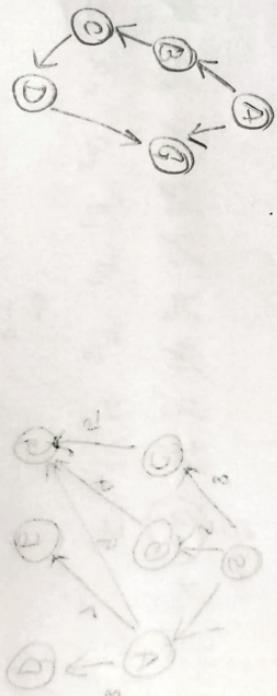
2 (51, 82) (4, 8A2) (8, 92) (4, 8A2)

3 (51, 82) (4, 8A2) (8, 92) (4, 8A2)

4 (51, 82) (4, 8A2) (8, 92) (4, 8A2)

5 (51, 82) (4, 8A2) (8, 92) (4, 8A2)

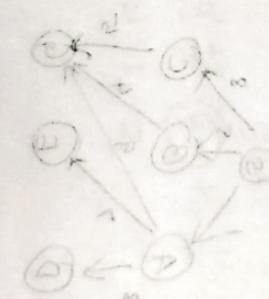
BFS on



Max no edges of same color

over all

Max no edges of same color



F  
E  
D  
C  
B  
A

↓  
explored.

C E A D

: 210

D E A B C

210

D E A B C

210

(8, 92), (2, 8A2), (0, 8A2), (12, 8A2), (8, 9A2), (2, 8A2)

(8, 92), (2, 8A2), (0, 8A2), (12, 8A2), (8, 9A2), (2, 8A2)

~~(S, 0)~~ (SA, 1) (SG, 12)

(SAB, 4) (SAC, 2) (SG, 12).

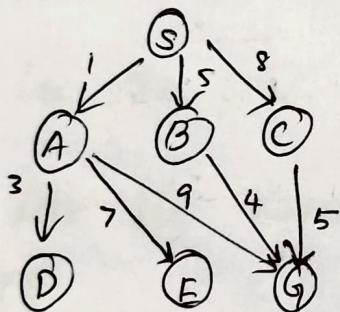
(SAB, 4) (SACD, 3) (SACG, 4) (SG, 12)

(SAB, 4) (SACDG, 5) (SACG, 4) (SG, 12).

(SABD, 7), (SABCDG, 5) (SACG, 4) (SG, 12).

S → A → C → G

Write the sequence of nodes visited for DFS  
and BFS.



DFS :

S A  $\not{D}$   $\not{E}$  G

BFS :

S  $\not{A}$   $\not{B}$   $\not{C}$  D E G

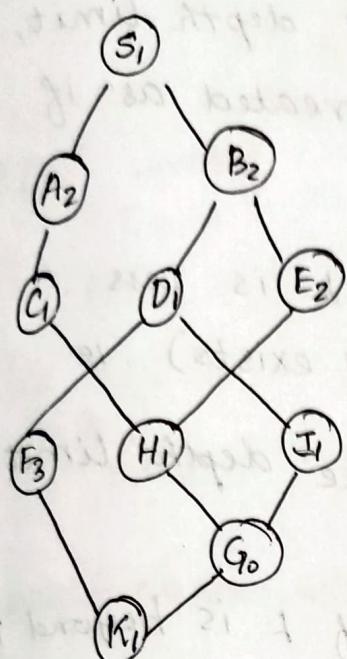
Uniform cost search :

~~(S, 0)~~

~~(SA, 1)~~ (SB, 5) (SC, 8).

(SAD, 4), (SAB, 8), (SAG, 10), (SBD, 5), (SC, 8)

(SAG, 10), (SBG, 9), (SCG, 13).



### BFS

Frontier  $S_1 \frac{A_2}{B_2} \frac{C_1}{D_1} \frac{E_2}{F_3} \frac{H_1}{I} \frac{K_1}{G_0}$  goal

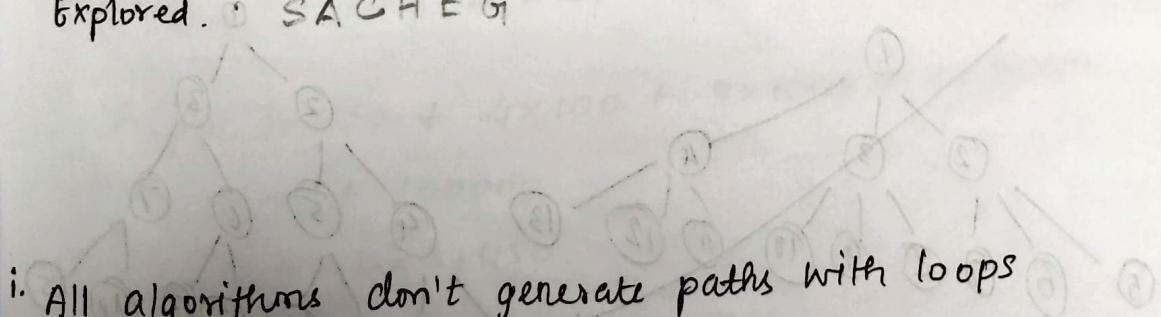
Explored  $S_1, A_2, B_2, C_1, D_1, E_2, H_1, F_3, I, G_0, K_1$

### DFS

frontier

Explored SACHEG

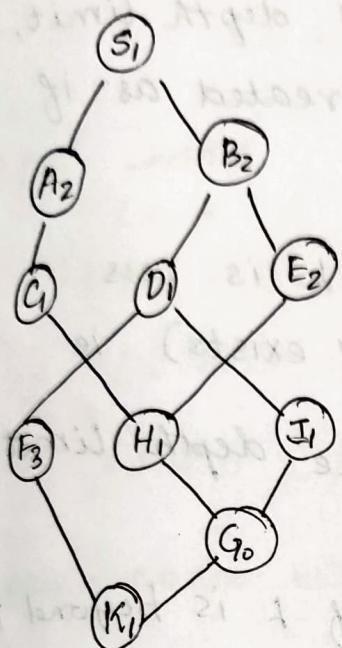
F G H I B S



- i. All algorithms don't generate paths with loops
- ii. Nodes are selected in alphabetical order in case of tie.
- iii. A node is visited when it is at the front of the queue.

(SAE, 8), (SAG, 10), (SBG, 9), (SCG, 8)

(SAG, 10), (SBG, 9), (SCG, 13).



### BFS

Frontier  $S_1 \frac{A_2}{B_2} \frac{C_1}{D_1} \frac{E_2}{F_3} \frac{H_1}{I_1} \frac{G_0}{K_1}$  goal.

Explored  $S_1 A_2 B_2 C_1 D_1 E_2 F_3$   $\leftarrow$   $\rightarrow$   $G_0$   $K_1$

### DFS

frontier

Explored: S A C H E G

$\neq G H F A B S$

TOP

- i. All algorithms don't generate paths with loops
- ii. Nodes are selected in alphabetical order in case of tie.
- iii. A node is visited when it is at the front of the queue.

Drawback of DFS is.

### Depth Limited Search

- i. the infinite space.

The infinite space can be overcome by supplying DFS with predefined depth limit,  $L$ , i.e. nodes at depth  $L$  are treated as if they have no successors.

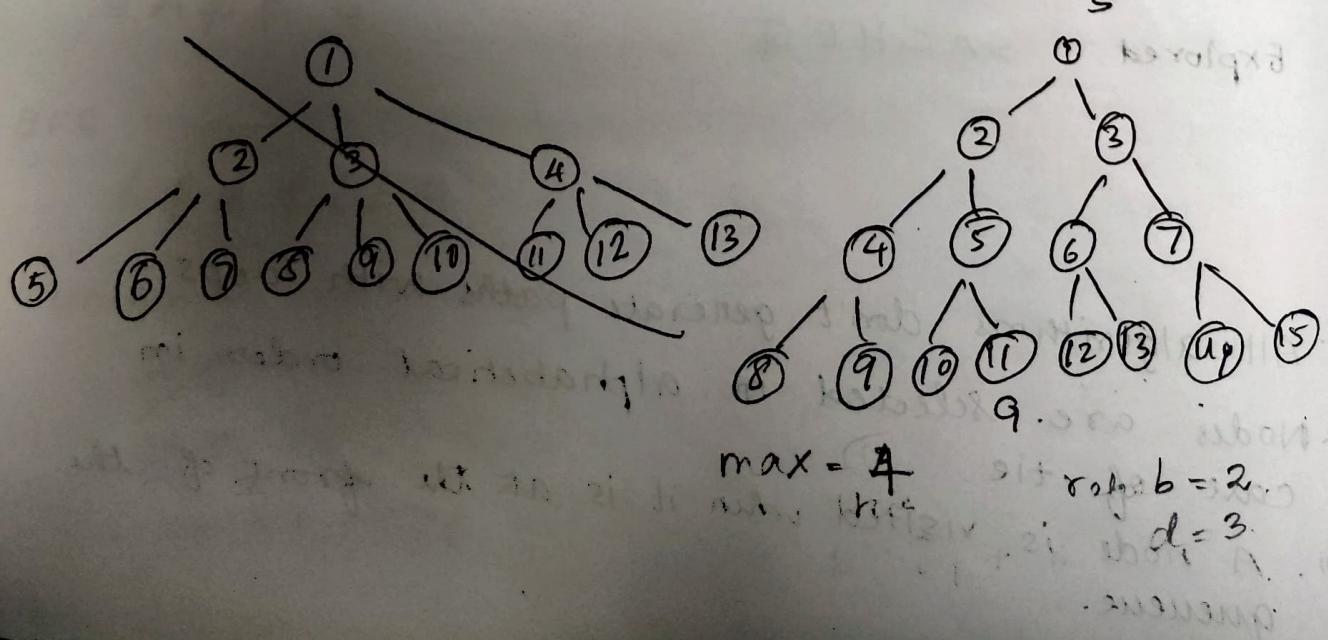
It becomes incomplete if  $L$  is less than  $D$  (level at which the goal exists). ie  
the shallowest goal is beyond the depth limit.

It becomes non optimal if  $L$  is beyond  $D$ .

### Iterative deepening search :

- To have DFS with best depth limit.
- It does increase gradually the depth limit until goal is reached.

Consider



BFS : 1 2 3 4 5 6 7 8 9 10 11

DFS : 1 2 4 8 9 5 10 11

DLS with  $l=3$  : same as DFS.

$l=2$  : 1 2 4 5 3 6 7 X

IDFS ~~with~~

$l=0$  : 1

$l=1$  : 1 2 3

$l=2$  : 1 2 4 5 3 6 7

$l=3$  : 1 2 4 8 9 5 10 11, 3 6 12 13 7 14 15

seq. nodes visited : 1; 123; 1245367;  
1248951011.

The total no. of nodes generated in the worst case is

$$N(IDFS) = db + (d-1)b^2 + (d-2)b^3 + \dots + 1b^d.$$

consider  $b=10$ ,  $d=5$ .

$$N(IDFS) = 50 + 4 \times 100 + 3 \times 1000 + 2 \times 10000 + 100000$$

$$= 1,23,450.$$

	Complete	Optimal	Time	Space
BFS	y	y <sub>c1</sub>	O(b <sup>d</sup> )	O(b <sup>d</sup> )
DFS	N	N	O(b <sup>m</sup> )	O(b <sup>m</sup> )
DLS	y <sup>c</sup>	N	O(b <sup>e</sup> )	O(b <sup>e</sup> )
IDS	y	y	O(b <sup>d</sup> )	O(b <sup>d</sup> )
UCS	y	y		
BDS			O(b <sup>d/2</sup> )	O(b <sup>d/2</sup> )

$$c = l \geq d$$

$c_1 = \text{same cost}$   
for all edges

### Bidirectional Search (BDS)

Search from start & do = (2d)N  
Search from goal simultaneously

The idea behind BDS is to run 2 simultaneous searches; one in the forward direction from the start state, and the other in the backward direction from the goal hoping that they meet.

For example consider a tree with  $b=10$  and  $d=6$ . The total number of nodes generated in BFS.

$$\text{is } 10 + 100 + 1000 \dots + 1000000 = 11,11,110.$$

but in case of BDS, it is.

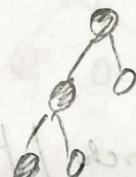
$$\begin{array}{c|c} 1000 \\ 100 \\ 10 \end{array} \quad | \quad \begin{array}{c} 1000 \\ 100 \\ 10 \end{array} = 2,220.$$

### BFS :

- i. complete - yes (if the branching factor is finite).
- ii. optimality - yes (if all step costs are identical).
- iii. time -  $O(b^d)$ .  $d$ : depth of the shallowest goal.
- iv. space -  $O(b^d)$ .

### DFS :

- i. complete - yes (if the depth No.  $\leq b^m$ )
- ii. optimality - No.
- iii. time -  $O(b^m)$  where  $m$  is the depth of the tree. (height).
- iv. space -  $O(b \times m)$ .



### DLS :

- i. complete - yes (if  $l \geq d$ ).
- ii. optimality - No.
- iii. time -  $O(b^l)$
- iv. space -  $O(b \times l)$ .

### IDS :

comp: yes (if  $b$  is finite)

op : yes (if step cost are equal)

T :  $O(b^d)$ .

S :  $O(b^d)$ .

### BDS :

comp : Yes (if branch for  $b$  is finite)

optimal : yes (if all step costs are identical and both are bfs).

T :  $O(b^{d/2})$

S :  $O(b^{d/2})$

### Informed search / Heuristic search :

uses problem-specific knowledge beyond the definition of the problem itself.

expand closer seeming node first.

Heuristic function  $h(n)$  gives an estimate of the distance from  $n$  to the goal goal.

$h(n) = 0$  for goal nodes.

examples: for TSP., straight line distance.

In informed search we are adding something new to the problem.

~~Best First Search~~ ~~for solving mazes~~ : ~~use~~

The most widely used & known form of best first search is A\* search.

evaluation fn.  $f(n) = g(n) + h(n)$ .

$g(n) \rightarrow$  path cost from start to  $n$ .

$h(n) \rightarrow$  estimated cost of deepest path from  $n$  to goal.

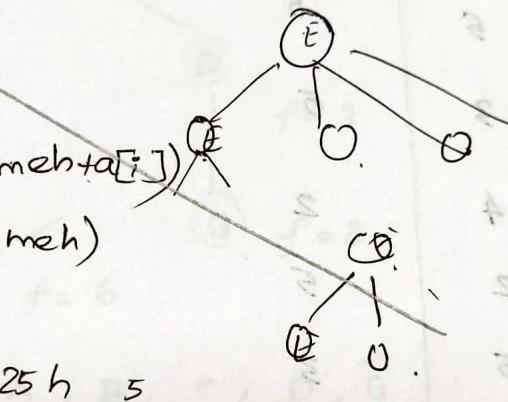
~~$a = [$~~  ; ~~]~~

~~meh~~ ~~msf~~

$$[meh = \max(a[i], meh + a[i])]$$

$$[msf = \max(msf, meh)]$$

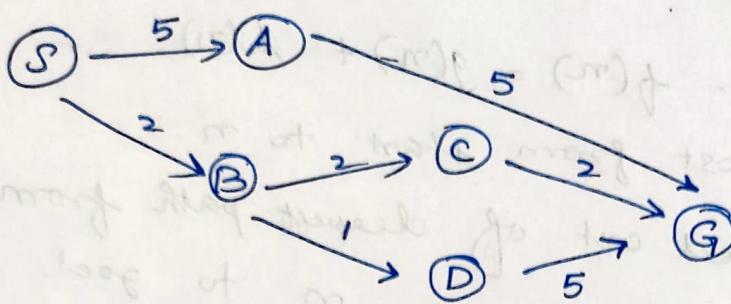
25 h 5



too many at previous step w/ too large storage

Greedy : evaluation function  $f(n) = h(n)$ .

$A^*$  :  $f(n) = g(n) + h(n)$



	$h_1$	$h_2$	$h_3$
S	0	5	6
A	0	3	5
B	0	4	2
C	0	2	5
D	0	5	3
G	0	0	0

Find out the path according to uniform cost search.

$h(n) = 0 \Rightarrow$  in  $A^*$   $f(n)$  becomes  $g(n)$ .

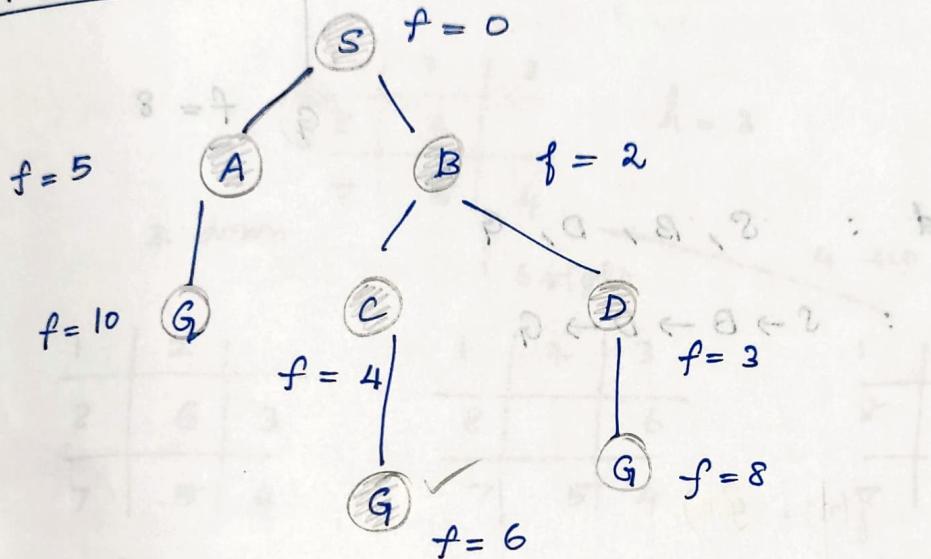
$A^*$  behaves like Uniform cost search.

- (S, 0)
- (SA, 5), (SB, 2)
- (SA, 5), (SBC, 4), (SBD, 3)
- (SA, 5), (SBC, 4), (SBDG, 8)
- (SA, 5), (SBCG, 6), (SBDG, 8)

vi  $(SAG, 10)$ ,  $(SBCG, 6)$ ,  $(SBDG, 8)$ .

$SBCG, 6$ .

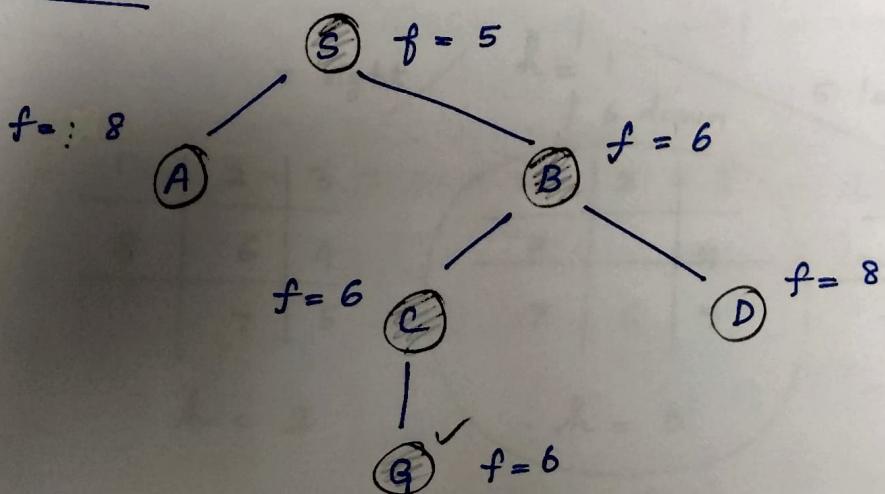
Implement  $A^*$  with all the three heuristic function.  
with  $h_1$



expanded =  $S, A, B, C, D, G$

path =  $S \rightarrow B \rightarrow C \rightarrow G$ .

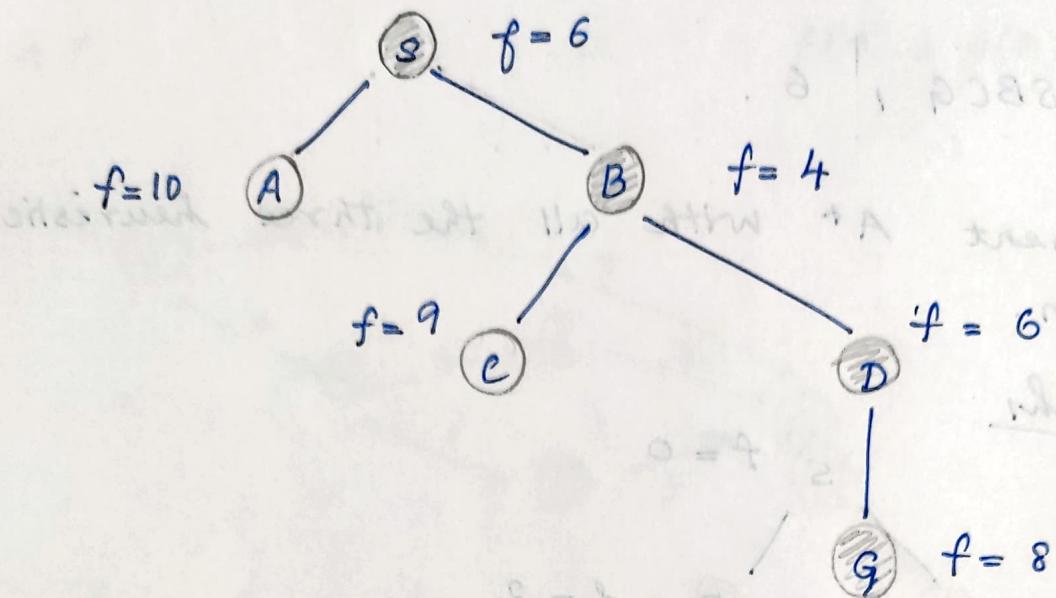
with  $h_2$



expanded =  $S, B, C, G$

path =  $S \rightarrow B \rightarrow C \rightarrow G$

with  $h_3$  :



expanded :  $S, B, D, G$

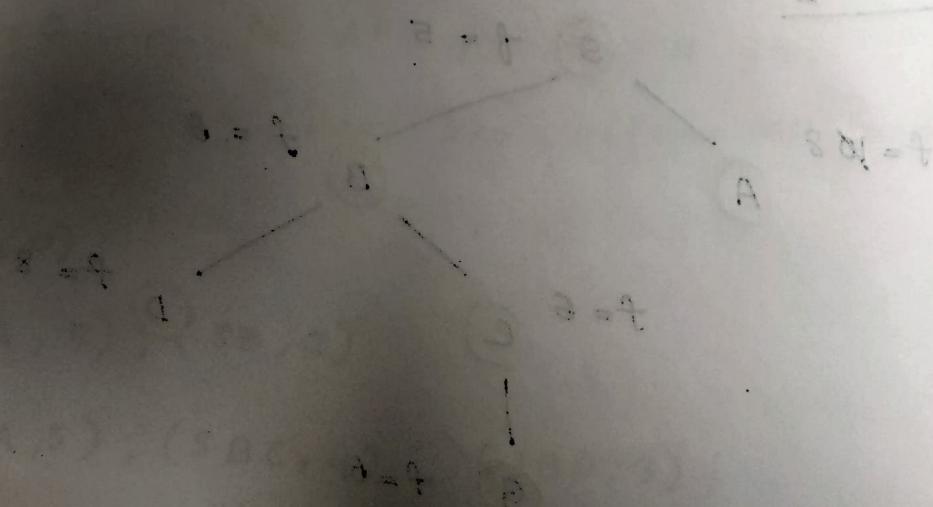
path :  $S \rightarrow B \rightarrow D \rightarrow G$

UOS:  $f(n) = g(n)$

Greedy :  $f(n) = h(n)$

best

A\* :  $f(n) = g(n) + h(n)$ .



3

1	2	3
8	6	
7	5	4

4

1	2	3
8		4
7	6	5

$h$ : no. of misplaced tiles.

1	2	3
8	6	
7	5	4

$$h = 3$$

3 down

6 right

4 up

1	2	
8	6	3
7	5	4

1	2	3
8		6
7	5	4

1	2	3
8	6	4
7	5	

$$h = 4$$

$$h = 3$$

$$h = 2$$

1	2	3
8	6	4
7		5

1	2	3
8	6	
7	5	4

7 right

h = 1

5 left

1	2	3
8	6	4
7	5	

$$h = 2$$

1	2	3
8		4
7	6	5

$$h = 0$$

goal

4 up  $\rightarrow$  5 right  $\rightarrow$  6 down.

start	7	2	4		1	2	
	5	6			3	4	5
	8	3	1		6	7	8

goal

Consider 3 heuristic functions.

$H_1$  = no. of misplaced tiles.

$H_2$  = sum of euclidean distances of the tiles from their goal positions.

$3,1$	3,2	3,3
7	2	4
$2,1$	2,2	2,3
5	.	6
$1,1$	1,2	1,3
8	3	1

$$h_1 = 8$$

$$h_2 = \sqrt{5} + 1 + \sqrt{2} + \sqrt{2}$$

$$+ 2 + \sqrt{5} + \sqrt{5} + 2.$$

$$= 5 + 2\sqrt{2} + 3\sqrt{5}$$

$$= 14.54.$$

$H_3$  : sum of manhattan distances of the tiles from their goal positions.

$$h_3 = 3 + 1 + 2 + 2 + 2 + 3 + 3 + 2$$

$$= 18$$

A heuristic function  $h(n)$  is admissible if for every node  $n$ ,  $h(n) \leq h^*(n)$  where  $h^*(n)$  is the true cost to reach the goal from  $n$ .

- ii. An admissible heuristic function never overestimates the cost to reach the goal. i.e. if  $n$  is the optimal solution reachable from  $n'$
- $$g(n) \geq g(n') + h(n').$$
- iii. A\* is admissible (optimal) if it uses an admissible heuristic.

Proof of optimality

Let  $s$  be the starting state and  $g$  be the optimal goal state.

$A^*$  has  $f(n) = g(n) + h(n)$ . where  $f^*$  is the priority of  $n$  determined by  $f^*(n) = g(G) + h(n)$ .  $G$  is the goal state.

$f(G) = g(G) + h(G) = f^*(\because h(G) = 0)$ .

$f(G_2) = g(G_2) + h(G_2) \geq f^*(\because h(G_2) = 0)$ .

Suppose for contradiction that  $A^*$  has selected  $G_2$  from the queue for expansion. This will terminate  $A^*$  to have  $G_2$  as the goal.

Let us consider any node  $n$  on the optimal path to  $G$ . Since  $h$  is admissible,  $f^* \geq f(n)$ .

if  $n$  is not chosen over  $G_2$ . Then we should have  $f(n) \geq f(G_2)$ .

$$\therefore f^* \geq f(n) \geq f(G_2).$$

$$\Rightarrow f(G_2) \leq f^*$$

a contradiction to ①.

$\therefore A^*$  is optimal.

### Dominance:

if  $h_1$  and  $h_2$  are 2 admissible heuristic,  
if  $h_2(n) \geq h_1(n)$ , for all  $n$ , then  $h_2$  dominates  $h_1$ .

### Monotonicity of heuristic:

A heuristic  $h(n)$  is called consistent, monotonic if  $\forall$  node  $n$ , and  $\forall n'$  child of  $n$  generated by an action,  $a$  from the node  $n$  the estimated cost of reaching the goal from  $n$  is not greater than the step cost of  $n$  and  $n'$  and estimated cost of reaching the goal from  $n'$ .

$$h(n) \leq c(n, a, n') + h(n').$$

If  $h(n)$  is consistent, then the value of  $f(n)$  along any path is non decreasing.

$$g(n') = g(n) + c(n, a, n')$$

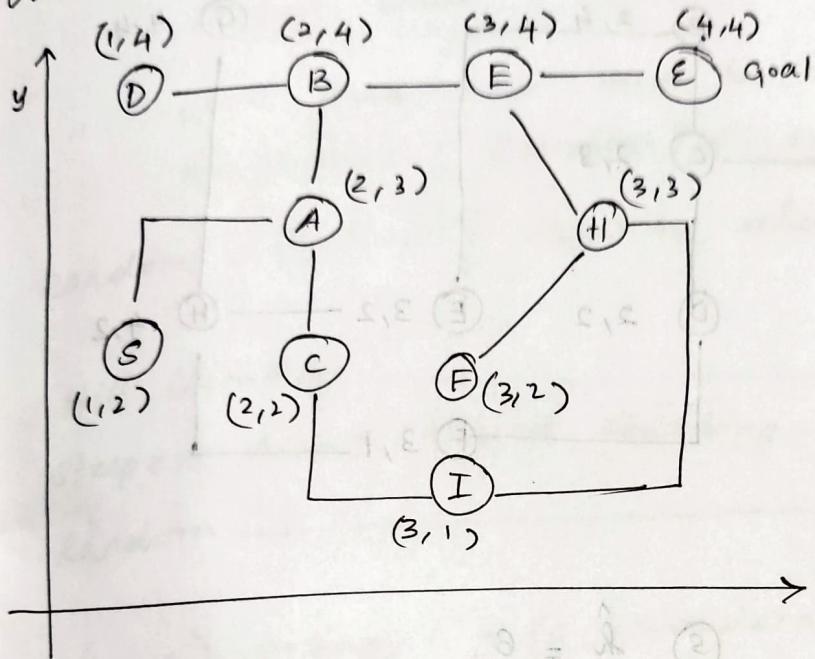
$$f(n') = g(n') + h(n')$$

$$= g(n) + c(n, a, n') + h(n')$$

$$\geq g(n) + h(n) = f(n)$$

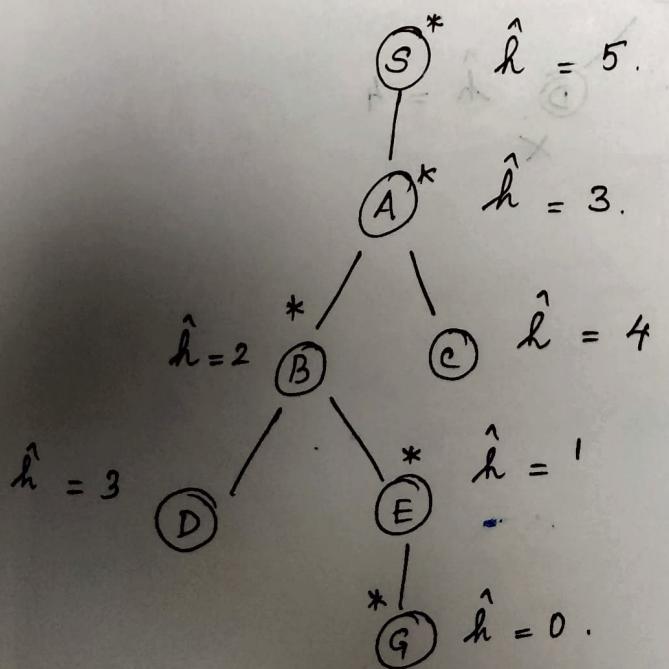
Difference between gradient descent and hill climbing approach.

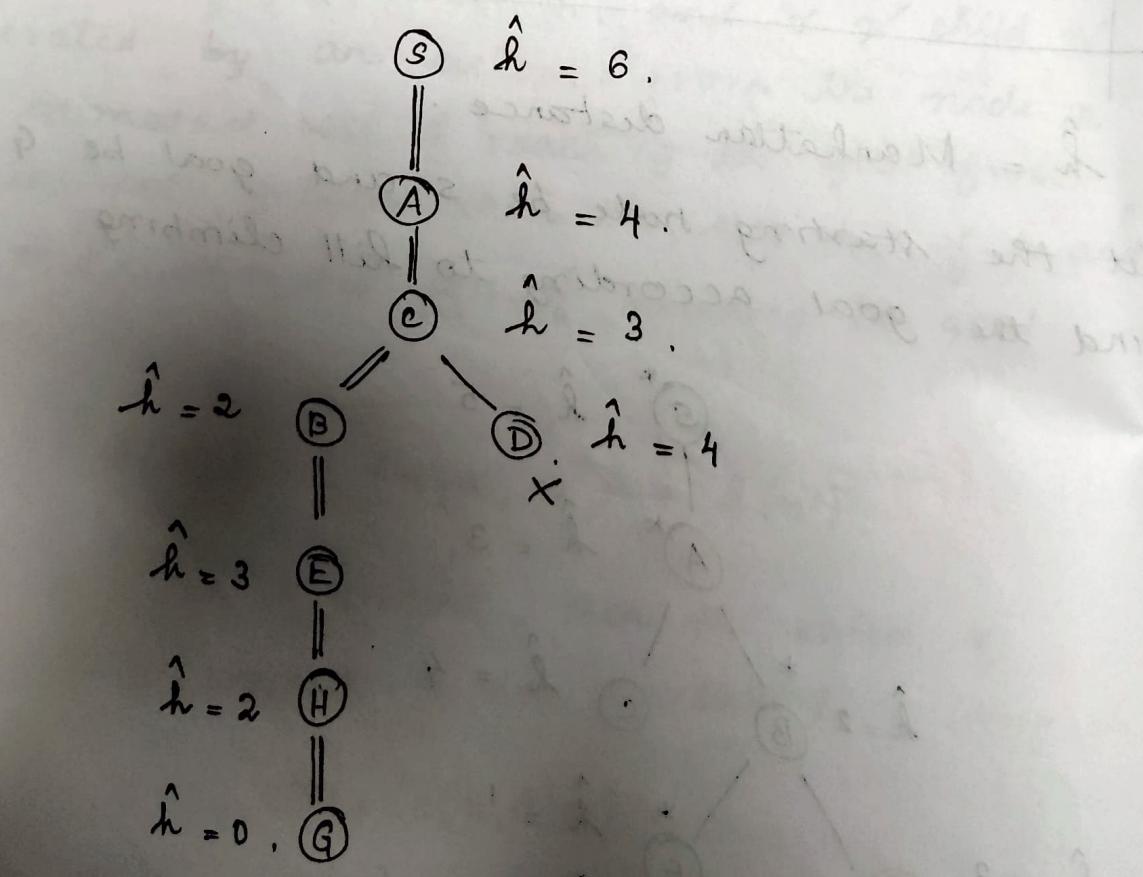
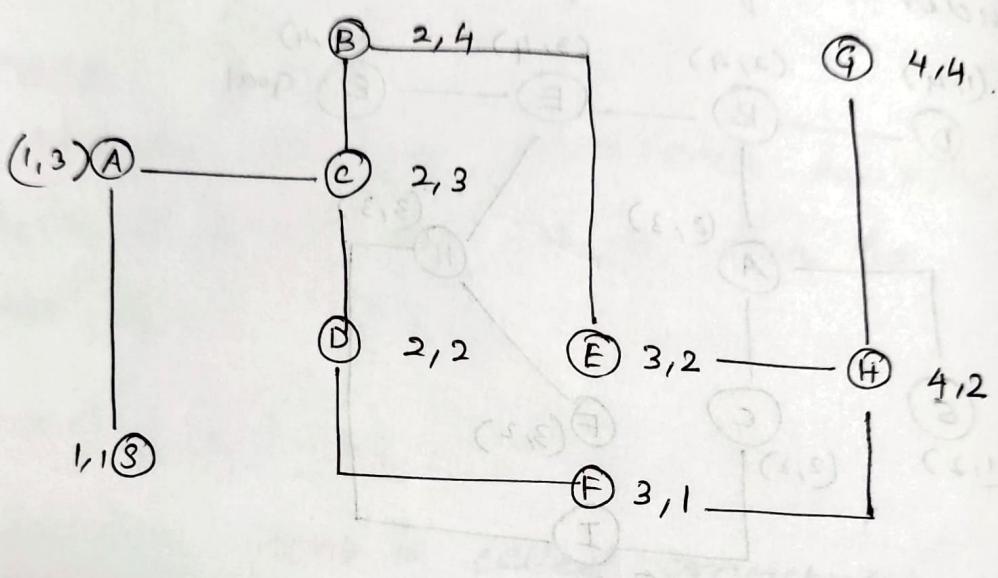
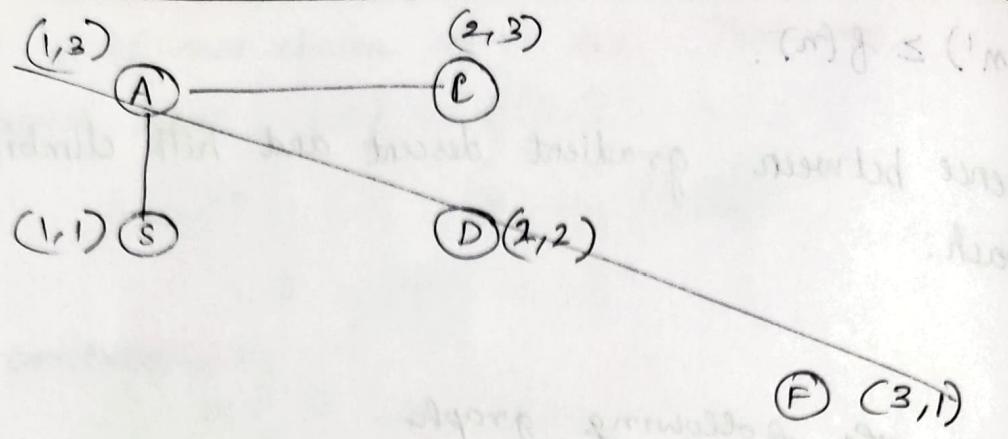
consider the following graph



$\hat{h}$  = Manhattan distance

Let the starting node be s and goal be g.  
Find the goal according to hill climbing.





## Hill Climbing Algorithm :

when the state-space landscape has local minima, any search that moves only in the greedy direction cannot be complete.

At each step do one of 2.

- i. with prob' p' move to neighbour with largest value. (Greedy). exploitation.
- ii. with prob' 1-p' move to a random neighbour (Random). exploration.

Random selection / Greedy selection.

Hill Climbing	not complete
steepest Ascent / Descent climbing	not complete
Random	complete

$(1-\epsilon)$  Greedy +  $(\epsilon)$  random  
is called  $\epsilon$  optimal.

## Simulated Annealing :

Constraint satisfaction Problem.  
 ex. Map colouring, and other assignment problems.

Variables .

$$A \in \{1, 2, 3\}$$

$$B \in \{1, 2, 3\}$$

$$C \in \{1, 2, 3\}$$

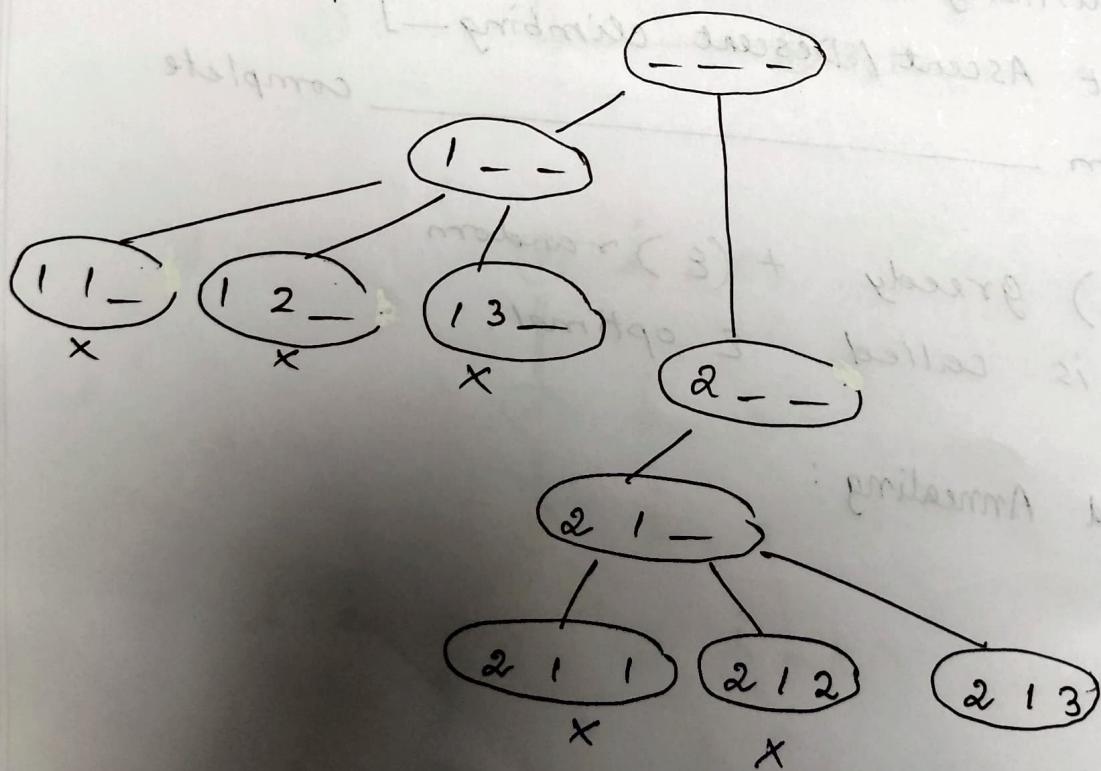
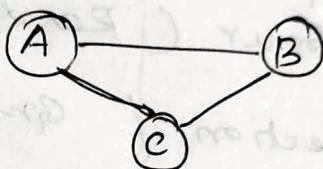
Constraint graph .

Constraints .

$$C_1 : A > B$$

$$C_2 : B \neq C$$

$$C_3 : A \neq C$$



$$\begin{matrix} 1 & 1 & 1 & 1 \\ 9 & 9 & 9 & 9 & 9 & 9 \\ 9 & 9 & 9 & 9 & 9 & 9 \\ 9 & 9 & 9 & 9 & 9 & 9 \\ 9 & 9 & 9 & 9 & 9 & 9 \\ 9 & 9 & 9 & 9 & 9 & 9 \end{matrix}$$

$c_3 c_2 c_1$   
TWO  
 $+ \underline{\text{TWO}}$   
FOUR

The main variables are  
F, O, T, U, N, R.

The carriers are  $c_1, c_2, c_3$ .

the constraints

Adversarial search and games