

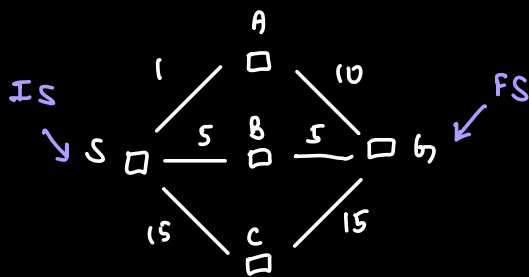
Three Stages of heuristic / informed:

- \* Uniform-cost search
- \* Greedy (Best-first search)

UNIFORM-COST SEARCH (UCS):

generalizes BFS

→ allow arbitrary cost for action > 0.

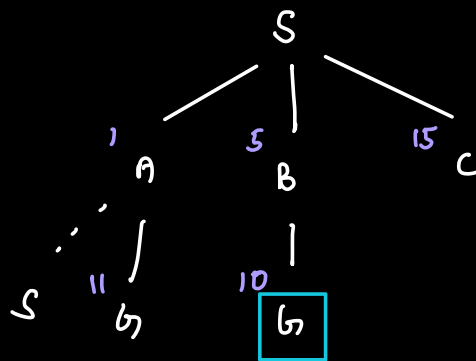


Expand node

- check if goal

- if not, generate children.

(state space)



$$g(B) = 5$$

$$g(G) = 5 + 5 = 10$$

GOAL

S - B - G

(cost is 10)

If we had checked goal during generation, we would have ended at S-A-G with cost of 10.

\* Completeness : yes

\* Optimal : Yes, Lower cost before any higher cost.

\* Time Complexity : BFS is subtype. So it is atleast as bad as BFS.  
 $b^d$

Suppose  $\epsilon$  is the smallest cost of any action.

If the optimal solution has cost  $c^*$ , then

I may have to go down to depth  $\lceil c^*/\epsilon \rceil$

eg:  $\epsilon = 1/2$      $c^* = 5$

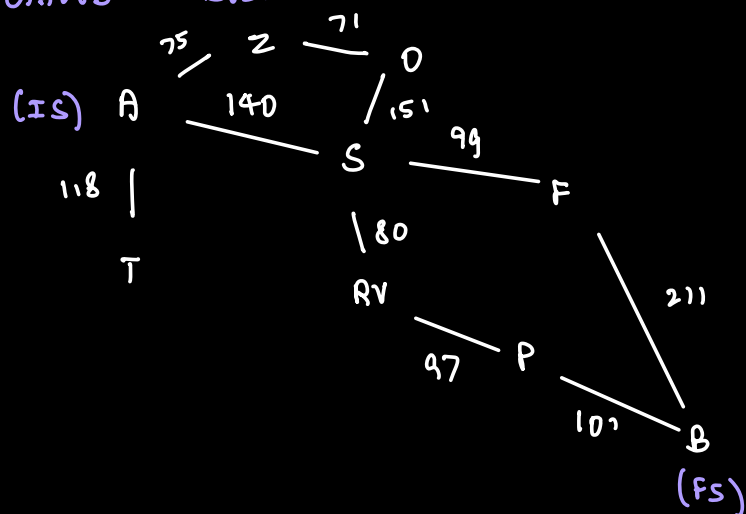
max. depth = 10

$\lceil c^*/\epsilon \rceil$   
 $b$

\* Space Complexity :  $b^{\lceil c^*/\epsilon \rceil}$

[Dijkstra's Algorithm]

GRAFFED BEST-FIRST SEARCH:

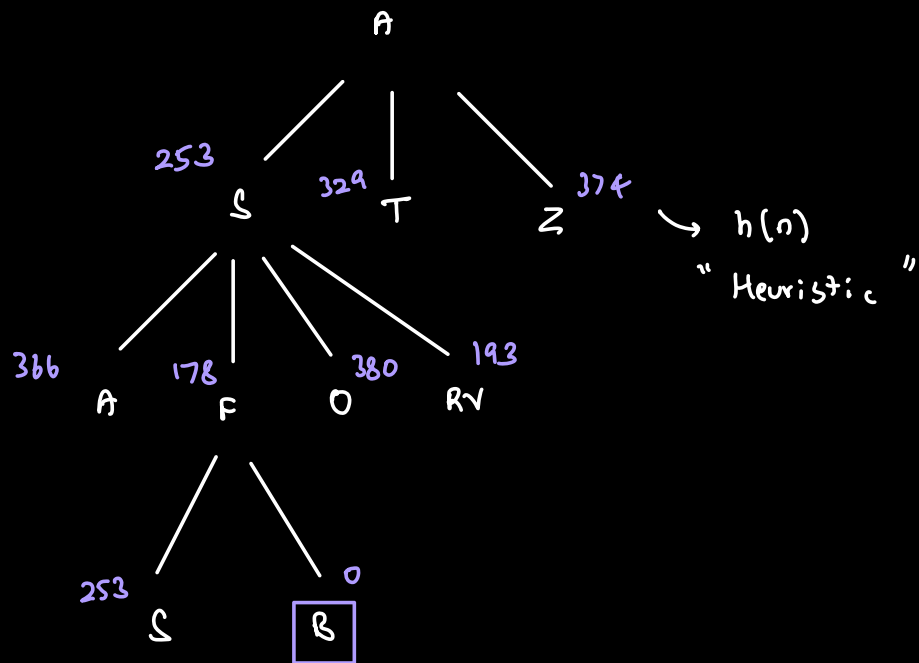


UCS will find

A - S - RV - P - B with cost = 418 //

GBFS needs a heuristic which is the "straight-line distance" from any point to FS.  
 $h(n)$

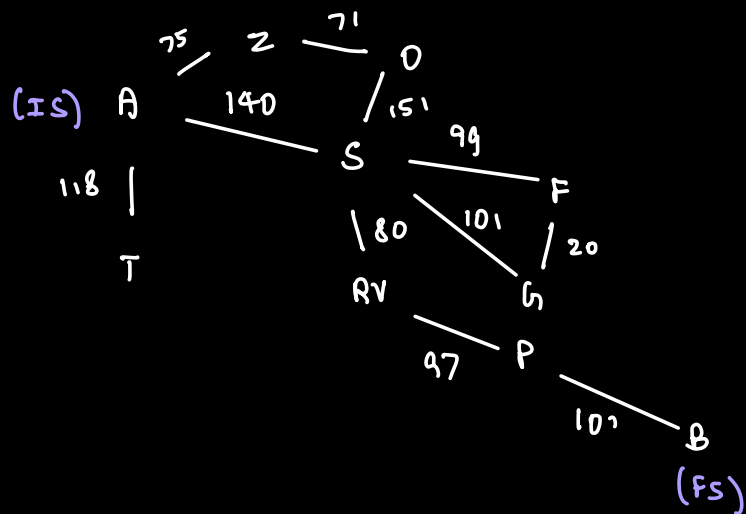
A	366
S	253
RV	193
P	98
F	178
B	0
T	329
Z	374
O	380



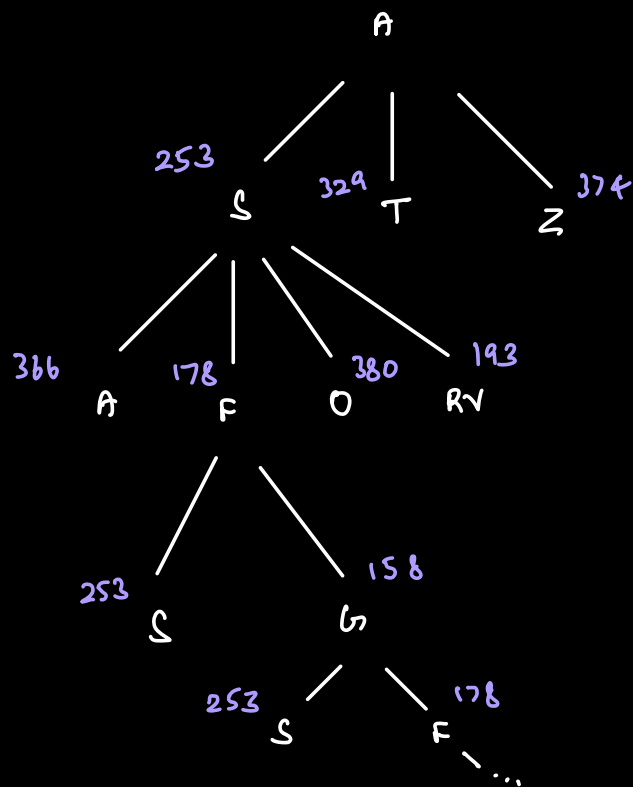
SOLUTION: A - S - F - B

Cost 450 //

NOT OPTIMAL  
NOT COMPLETE!



	$h(n)$
A	366
S	253
RV	193
P	98
F	178
B	0
T	329
Z	374
O	380
G	158



ucs checks past  $\rightarrow$  cost till now!

$[g(n)]$

Greedy checks future  $\rightarrow$  estimate of

future cost.

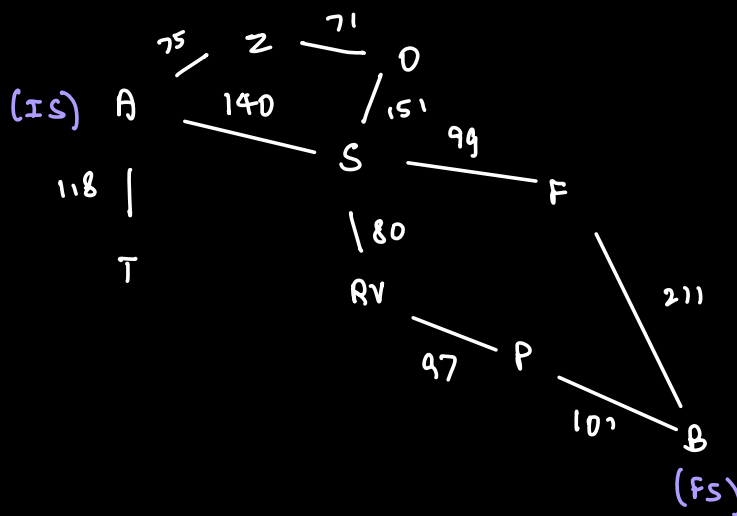
$[h(n)]$

A\* SEARCH:

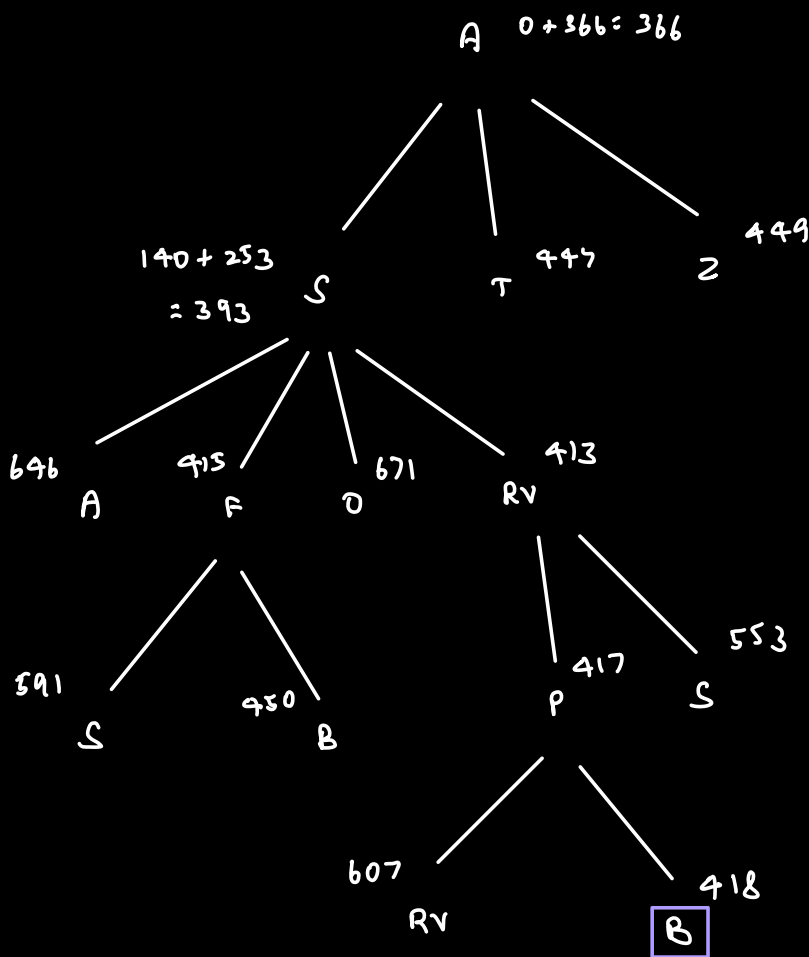
$$f(n) = g(n) + h(n)$$

$\downarrow$

Evaluation function.



	$h(n)$
A	366
S	253
RV	193
P	98
F	178
B	0
T	329
Z	374
O	380



SOLUTION: A - S - RV - P - B

EVALUATION FUNCTION:

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

$g(n)$ : cost so far to reach  $n$

$h(n)$ : estimated cost to goal from  $n$  "heuristic"

$f(n)$ : estimated total cost of a path that goes through  $n$ .

Heuristic is "admissible"

$$\longrightarrow h(n) \leq h^*(n) \quad \{ \text{least cost to go from } n \text{ to goal} \}$$

Don't overestimate

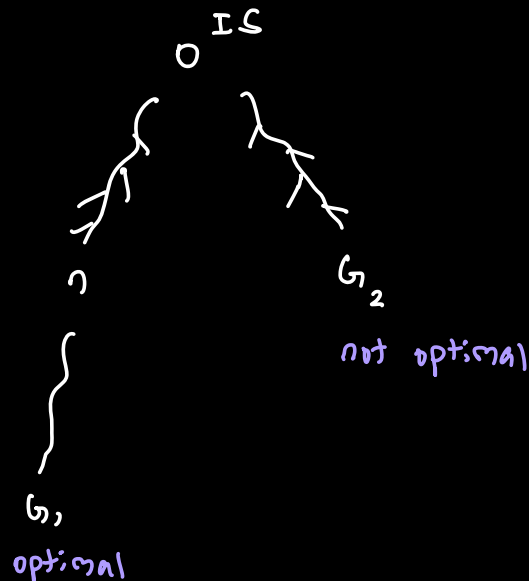
$$\longrightarrow h(n) \geq 0.$$

$$h(G) = 0 \text{ for a goal state } G.$$

A\* with an admissible heuristic ( $h(n)$ ) is OPTIMAL!

Higher the  $h(n)$ , faster the solution.

PROOF:





Assume 2 paths to  $F_S(b)$ , namely  $b_1, b_2$ .

$b_1$  is optimal. So, our algorithm is optimal, if  
for any intermediate node along the path  $\pi_S - b_1$ ,  
including  $\pi_S$   
it will be picked over  $b_2$ . and  $b_1$

$$\text{To prove: } f(n) < f(b_2)$$

We know:

$$* f(b_2) = g(b_2) + h(b_2)$$

$$\hookrightarrow F_S = 0$$

$$= g(b_2)$$

$$* f(b_1) = g(b_1) + h(b_1)$$

$$= g(b_1)$$

$b_1$  is optimal

$$* f(b_1) < f(b_2)$$

$$\Rightarrow g(b_1) < g(b_2) \quad - (1)$$

As  $n$  is along the path  $\pi_S$  to  $b_1$   
and  $h(n)$  is admissible

$$g(b_1) = g(n) + (\text{cost from } n \text{ to goal})$$

$$= g(n) + h^*(n)$$

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

$$\geq f(n) \quad - (2)$$

combine (1), (2)

$$f(n) \leq g(b_1) < g(b_2)$$

$$f(n) < g(b_2)$$

$$f(n) < f(b_2)$$

↓

$n$  is selected always!

HEURISTIC  $h(n)$ :

5	4	
6	1	8
7	3	2

1	2	3
8		4
7	6	5

$n$



$h$  : goal state

Two heuristics (admissible):

$h_1$  : Number of misplaced numbers

All except '7', so  $(1 \times 7) = 7 //$

$h_2$  : Manhattan distance of each number from original position to goal position

$$2 + 3 + 3 + 2 + 4 + 2 + 0 + 2 = 18$$

when  $h_2(n) \geq h_1(n)$

and both are admissible

$$h_2(n) \geq h_1(n) \geq h^*(n)$$

$h_2$  dominates  $h_1 //$

MINIMUM MOVES NEEDED (d)	Mean number of nodes expanded		
	IDS	$A^*(h_1)$	$A^*(h_2)$
2	10	6	6
6	680	20	18
8	6384	39	25
12	364404	227	73
14	3473941	539	113
16	$\vdots$	1301	211
$\vdots$			
24		39135	164

Uniforme

Informed

→ better heuristic.

What if  $h_1$  and  $h_2$  are not dominating each other?

$$h_1(x) \geq h_2(x) \quad \text{for some } x$$

$$h_2(x) \geq h_1(x) \quad \text{for some other } x$$

we choose

$$h(n) = \max(h_1(n), h_2(n))$$

$h(n)=0$  is always admissible. This is nothing but

Uniform Cost Search.