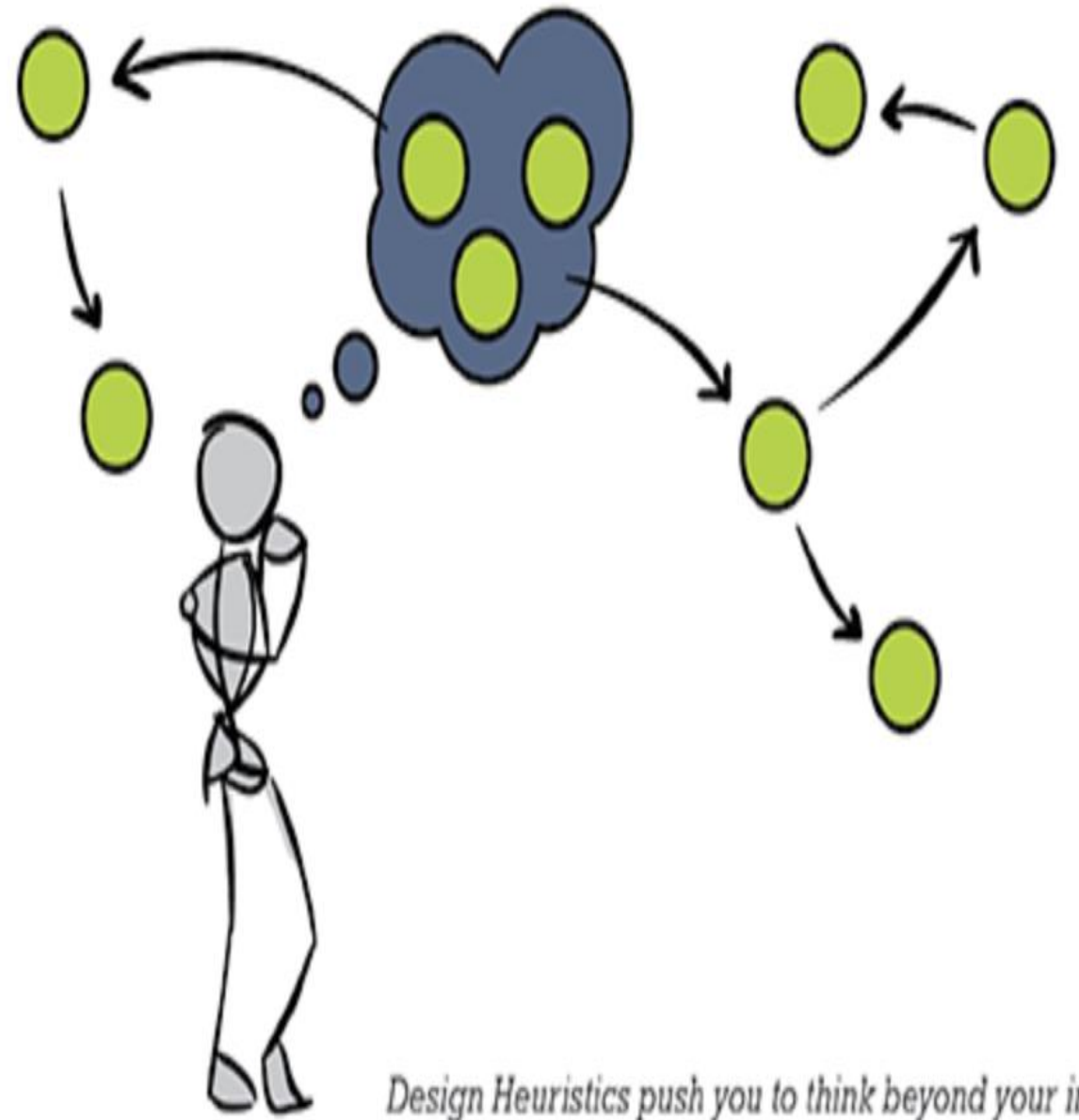


INFORMED SEARCH STRATEGIES



BEST-FIRST SEARCH

Best-first search is TREE-SEARCH or GRAPH-SEARCH algorithm in which a node is selected for expansion based on an evaluation function, $f(n)$

A whole *family algorithms* with different evaluation functions

Best-first search can be implemented using a *priority queue*

- Order nodes on the nodes list by increasing value of an evaluation function, $f(n)$.
- The “best” node according to the evaluation function is expanded.
- $F(n)$ incorporates *domain-specific information* in the form of $h(n)$ in some way

A key component of these algorithms is a heuristic function $h(n)$:

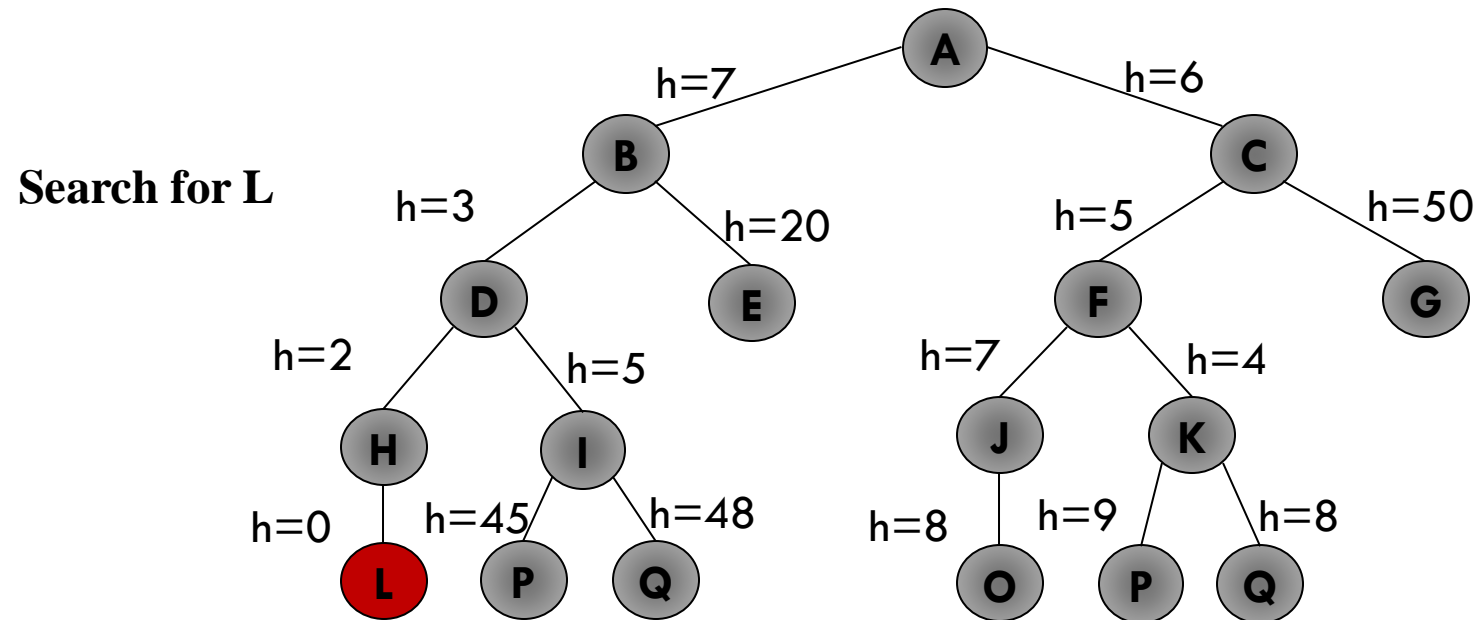
- $h(n)$ = estimated cost of the cheapest path from node n to a goal node.

GREEDY SEARCH

Use as an evaluation function $f(n) = h(n)$.

Selects node to expand that are believed to be closest to a goal node (hence “greedy”)

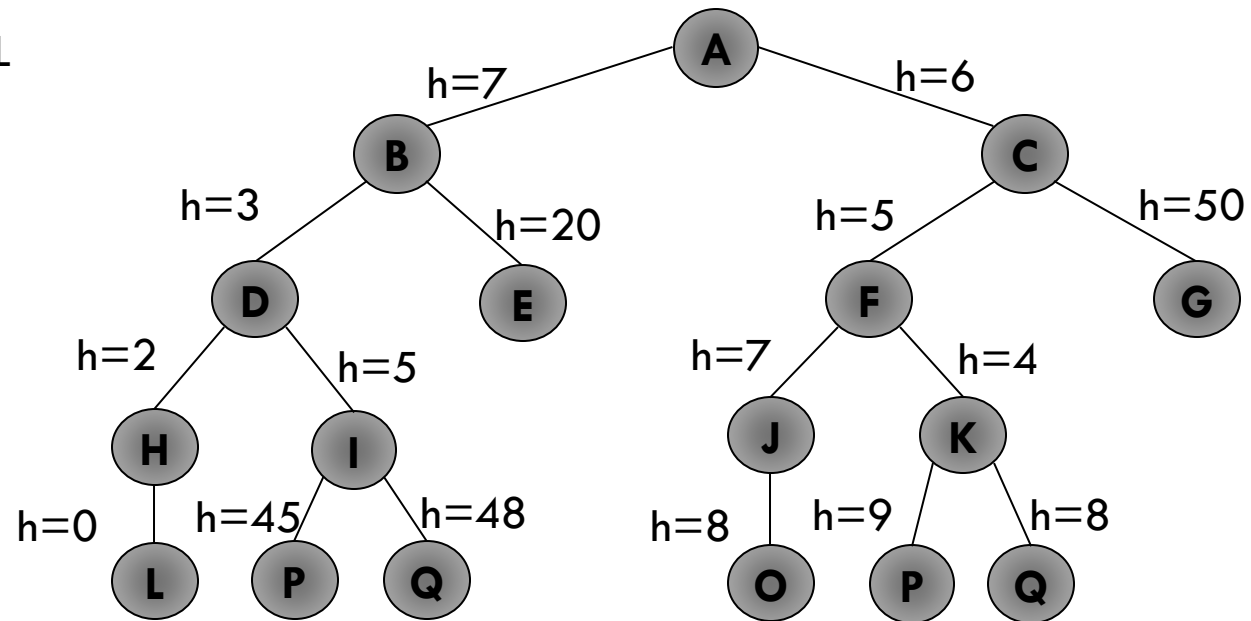
- Select node with smallest f value



GREEDY SEARCH

Best First Search

- A,C,F,K,J,B,D,H → L
- A,C,F,K,B,D,H → L



PROPERTIES OF GREEDY BEST-FIRST SEARCH

Complete: No – can get stuck in loops

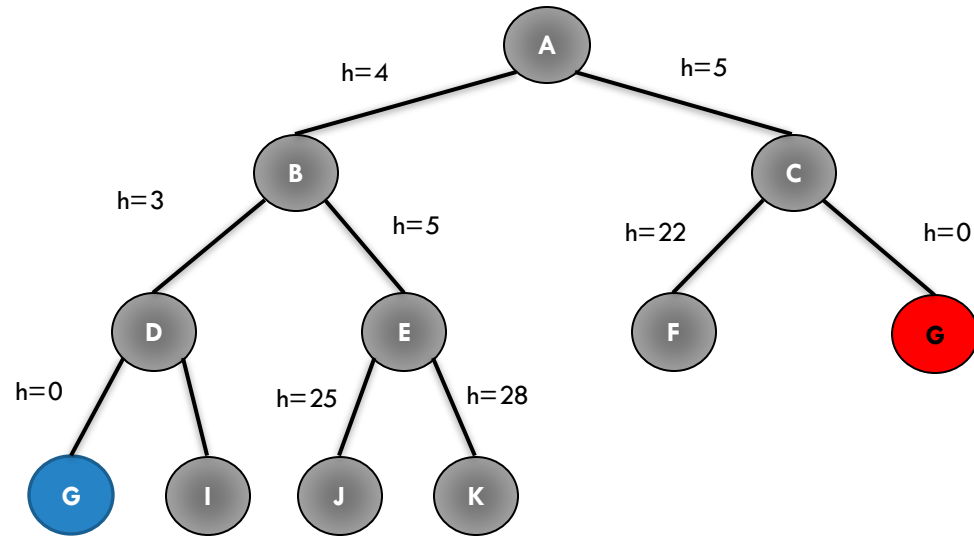
Optimal: No

Time Complexity: $O(b^m)$, but a good heuristic can give dramatic improvement

Space Complexity: $O(b^m)$ -- keeps all nodes in memory

RECALL

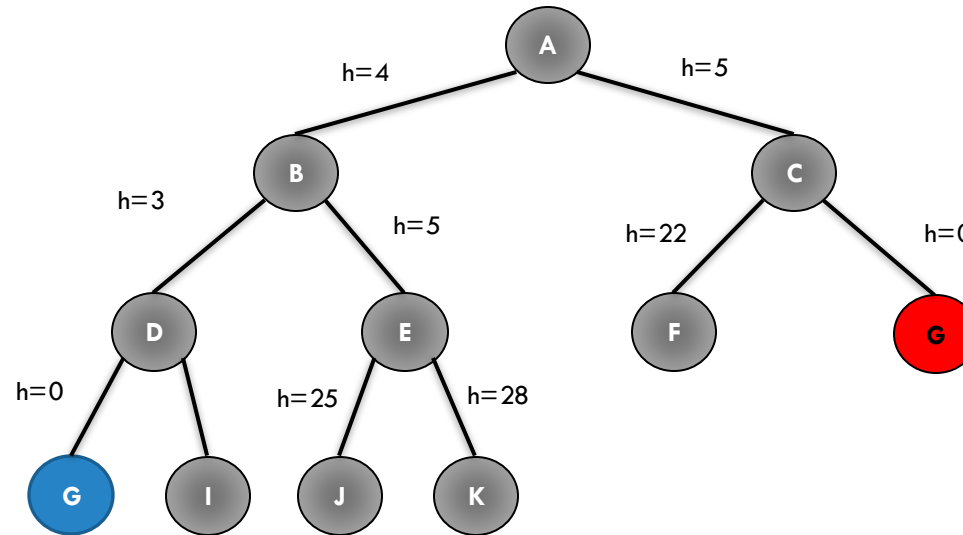
List the nodes expanded before the goal node “G” is found for both Breath-first search and Greedy Best first search in the tree below



BEST FIRST SEARCH VS BREATH FIRST SEARCH

Assuming all arc costs are 1, the greedy search will find goal G (blue), which has a solution cost of 3, while the optimal solution is the path to goal G (Red) with cost 2.

- Breadth-First Search:
 - Nodes expanded: A,B,C,D,E,F ➡ **G**
 - Path Found: A-C-G
 - Path Cost: 2
- Greedy Best-First Search:
 - Nodes expanded: A,B,D ➡ **G**
 - Path Found: A-B-D-G
 - Path Cost: 3



BEAM SEARCH

Beam search

- **Tries to minimize the memory requirement of the breadth-first algorithm.**
- **Informed breadth-first algorithm.**
- Expands only the first β promising nodes at each level.
- β is called Beam Width

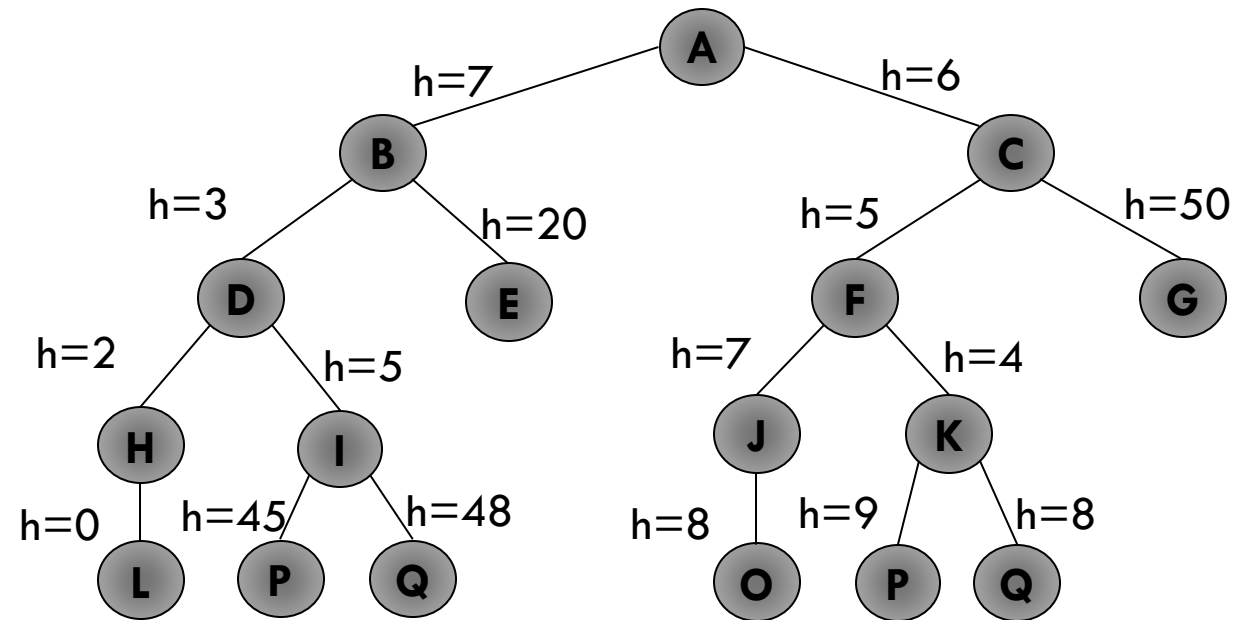
Uses an evaluation function $f(n) = h(n)$, but the maximum size of the nodes list is β .

Only keeps β best nodes as candidates for expansion, and throws the rest away

More space efficient than greedy search, but may throw away a node that is on a solution path

BEAM SEARCH

$\beta = 2$



Expanded nodes: A,B,C,D,F, H, K ➡ L

PROPERTIES OF BEAM SEARCH

Complete: No

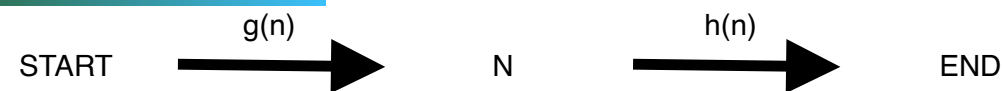
Optimal: No

Time Complexity: $O(\beta d)$

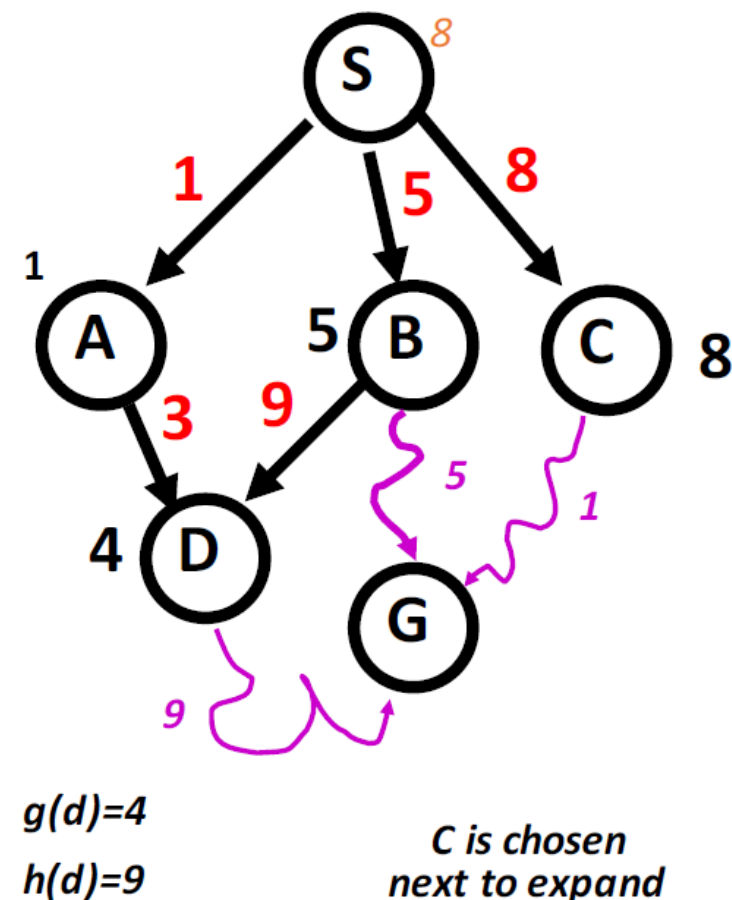
Space Complexity: $O(\beta d)$

Not admissible

ALGORITHM A



- Use as an evaluation function
$$f(n) = g(n) + h(n)$$
- $g(n)$ = minimal-cost path from the start state to state n.
- The $g(n)$ term adds a “breadth-first” component to the evaluation function.
- Ranks nodes on search frontier by *estimated cost* of solution from *start node through the given node to goal*.
- Not complete if $h(n)$ can equal infinity.
- Not admissible.



ALGORITHM A*

Algorithm A with constraint that $h(n) \leq h^*(n)$

$h^*(n)$ = true cost of the minimal cost path from n to a goal.

h is **admissible** when $h(n) \leq h^*(n)$ holds.

Using an admissible heuristic guarantees that the first solution found will be an optimal one.

A* is **complete** whenever the branching factor is **finite**, and every operator has a **fixed positive** cost

A* is **admissible**

SOME OBSERVATIONS ON A

Perfect heuristic: If $h(n) = h^*(n)$ for all n :

then only the nodes on the optimal solution path will be expanded. So, no extra work will be per

Null heuristic: If $h(n) = 0$ for all n :

then this is an admissible heuristic and A^* acts like Uniform-Cost Search.

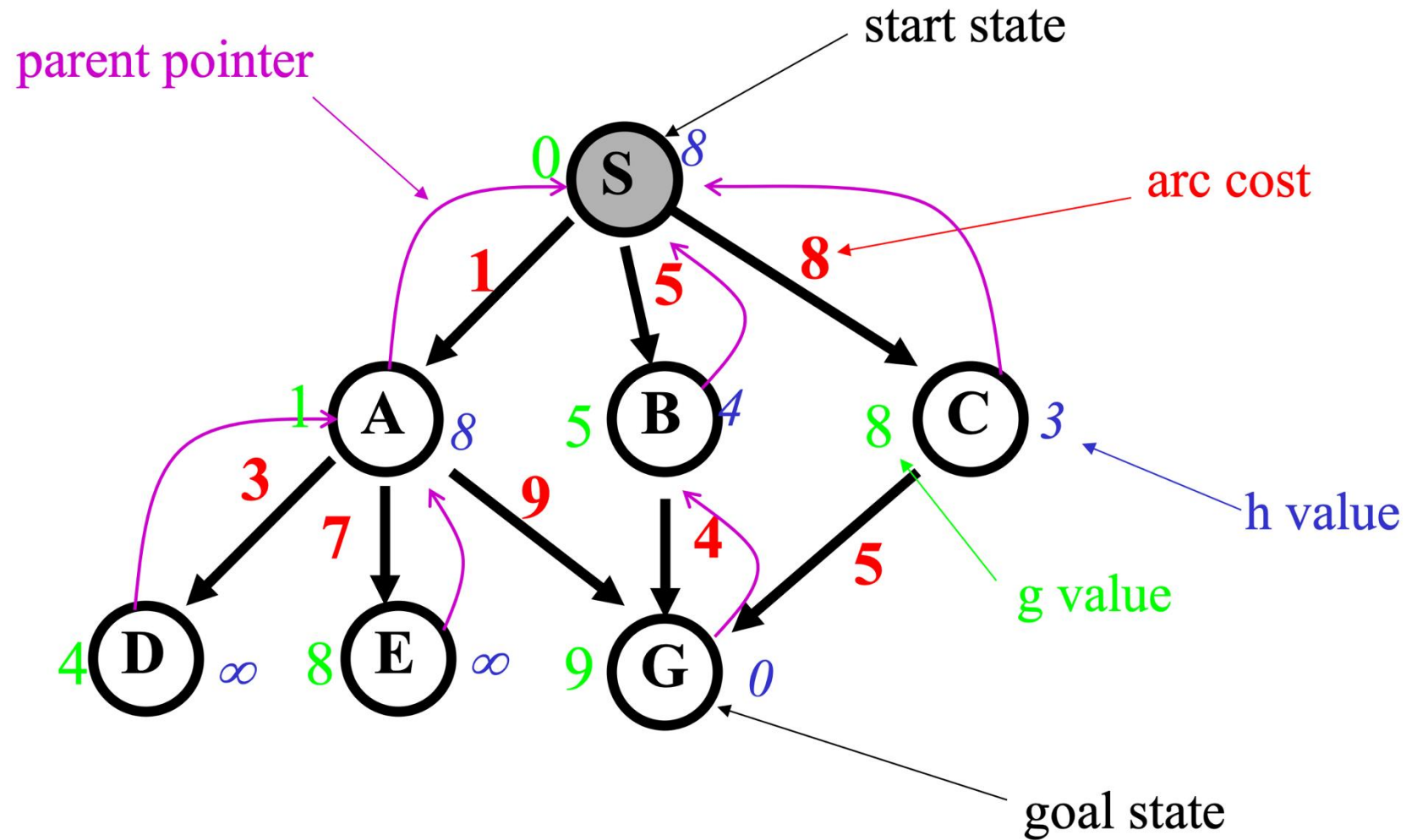
Better heuristic: If $h_1(n) < h_2(n) \leq h^*(n)$ for all non-goal nodes:

then h_2 is a better heuristic than h_1

- If A_1^* uses h_1 , and A_2^* uses h_2 , then every node expanded by A_2^* is also expanded by A_1^* .
- In other words, A_1 expands at least as many nodes as A_2^* .
- We say that A_2^* is better informed than A_1^* .

The closer h is to h^* , the fewer extra nodes that will be expanded

Example search space

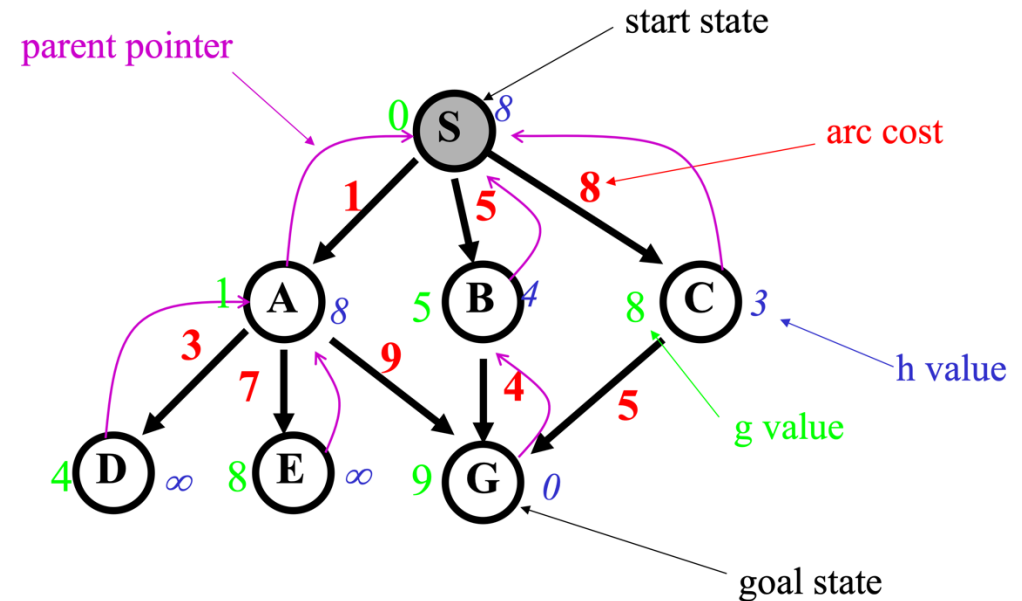


Example

n	g(n)	h(n)	f(n)	h*(n)
S	0	8	8	9
A	1	8	9	9
B	5	4	9	4
C	8	3	11	5
D	4	inf	inf	inf
E	8	inf	inf	inf
G	9	0	9	0

- $h^*(n)$ is the (hypothetical) perfect heuristic.
- Since $h(n) \leq h^*(n)$ for all n , h is admissible
- Optimal path = S B G with cost 9.

Example search space



A* search

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

node exp.

nodes list

	{ S(8) }
S	{ A(9) B(9) C(11) }
A	{ B(9) G(10) C(11) D(inf) E(inf) }
B	{ G(9) G(10) C(11) D(inf) E(inf) }
G	{ C(11) D(inf) E(inf) }

- Solution path found is S B G, 4 nodes expanded..
- Still pretty fast. And optimal, too.

Example search space

