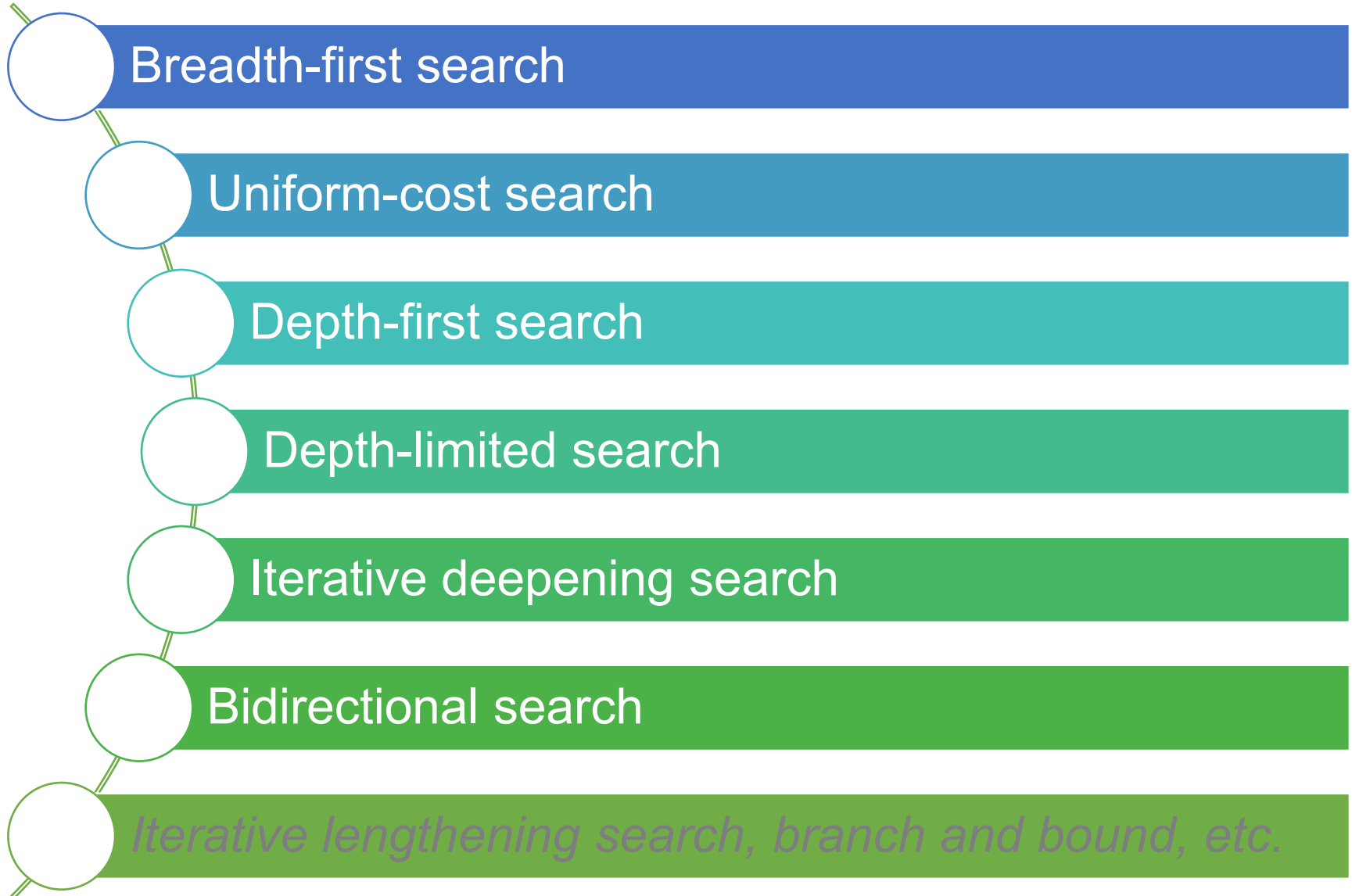


Uninformed search strategies

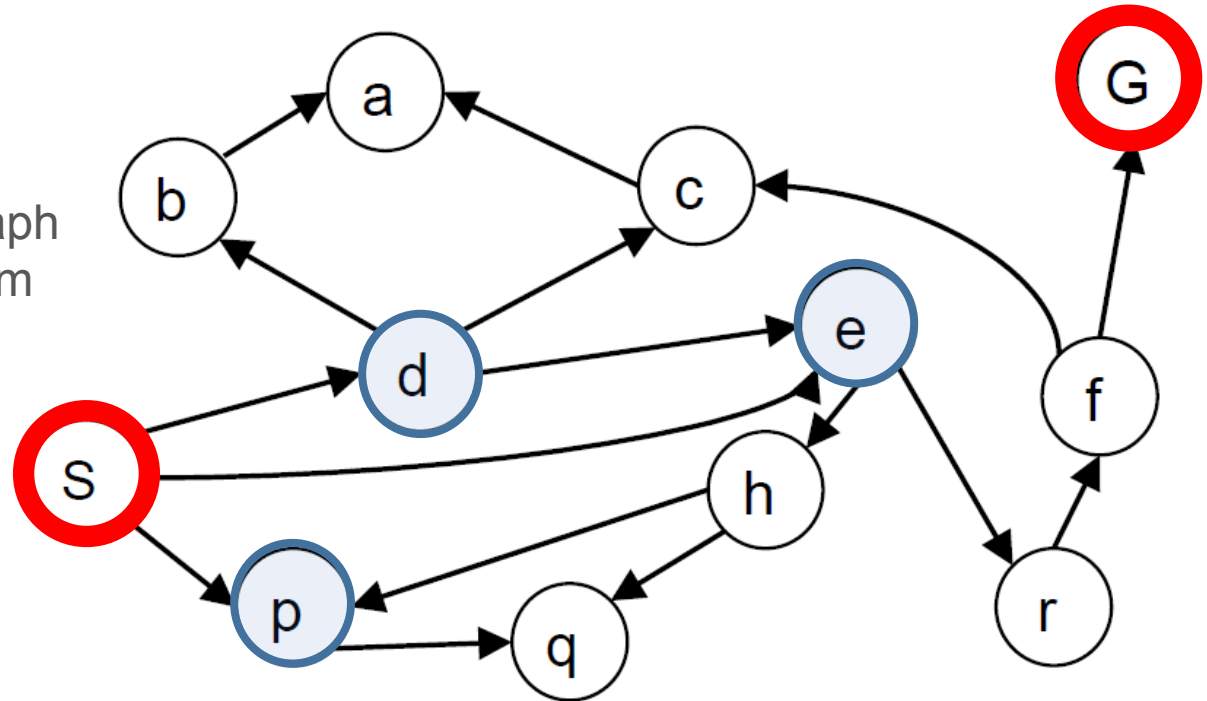


Breadth-First Search



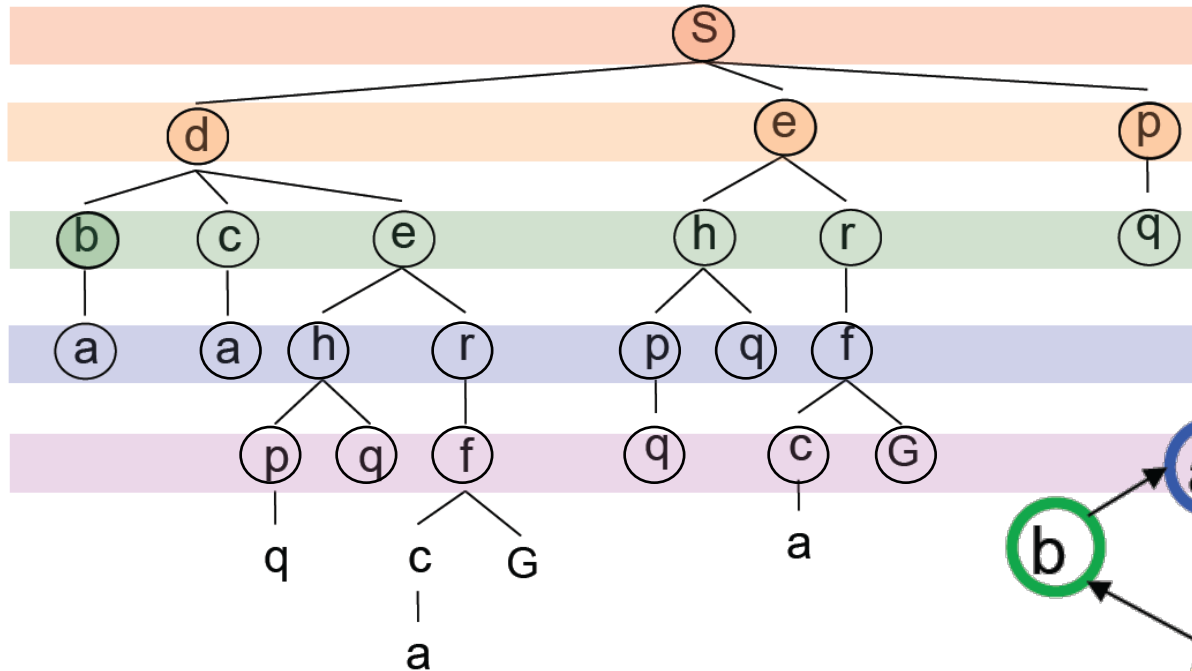
Breadth-first search (BFS)

Example state space graph
for a tiny search problem



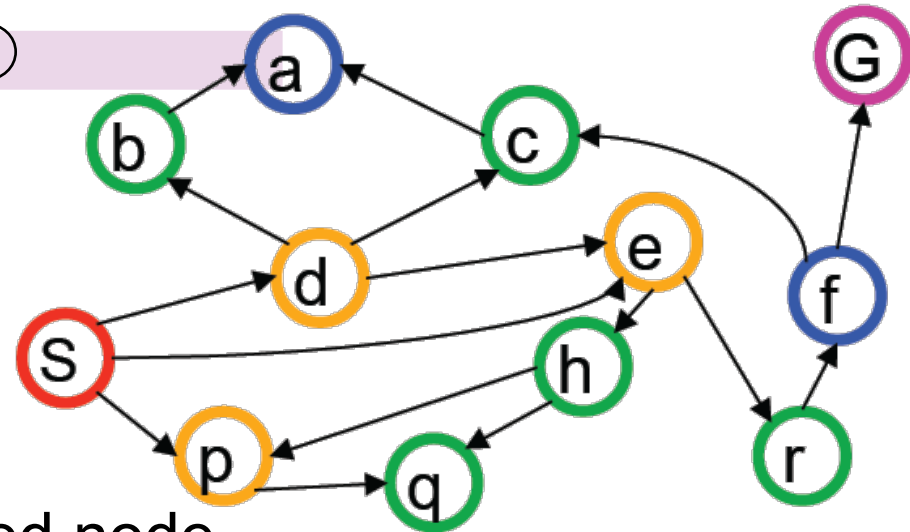
- The **root node** is **expanded first**, then all the successors of the root node are expanded next, then their successors, and so on.
- In general, all the nodes are expanded at a given depth in the search tree before any nodes at the next level are expanded.

Breadth-first search (BFS)



Expansion order:

(S, d, e, p, b, c, h, r, q, a, f, G)



- Expand shallowest unexpanded node
- Implementation: **frontier** is a FIFO queue

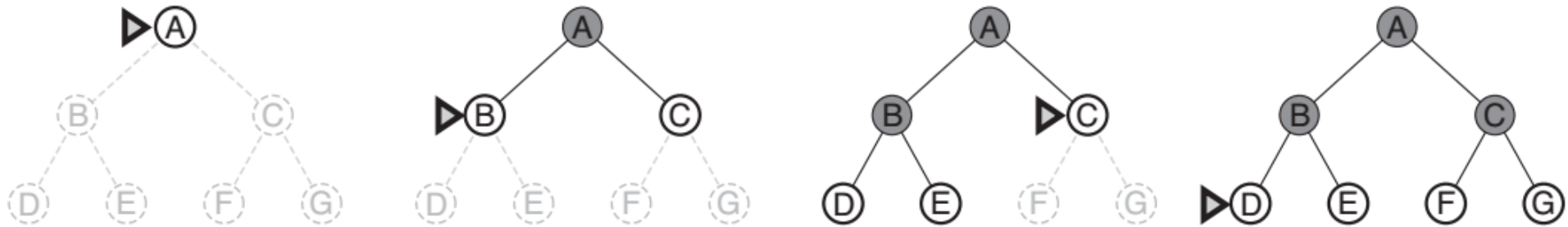
Breadth-first search (BFS)

- An instance of the general graph search algorithm
- The **shallowest unexpanded node** is chosen for expansion
- The **goal test** is applied to each node when it is **generated** rather than when it is selected for expansion
- **Discard** any new path to a state already in the **frontier** or in the **explored set**

Breadth-first search on a graph

```
function BREADTH-FIRST-SEARCH(problem) returns a solution, or failure
  node  $\leftarrow$  a node with STATE = problem.INITIAL-STATE, PATH-COST = 0
  if problem.GOAL-TEST(node.STATE) then return SOLUTION(node)
  frontier  $\leftarrow$  a FIFO queue with node as the only element
  explored  $\leftarrow$  an empty set
  loop do
    if EMPTY?(frontier) then return failure
    node  $\leftarrow$  POP(frontier) /* chooses the shallowest node in frontier */
    add node.STATE to explored
    for each action in problem.ACTIONS(node.STATE) do
      child  $\leftarrow$  CHILD-NODE(problem, node, action)
      if child.STATE is not in explored or frontier then
        if problem.GOAL-TEST(child.STATE) then return SOLUTION(child)
        frontier  $\leftarrow$  INSERT(child, frontier)
```

Breadth-first search on a graph

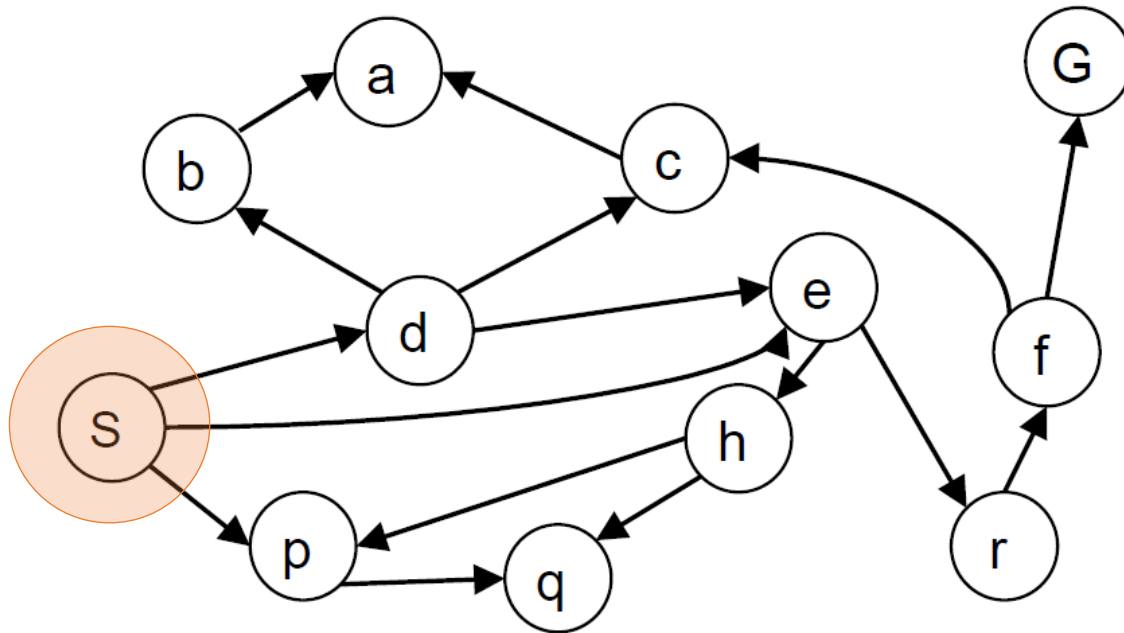


Breadth-first search on a simple binary tree.

At each stage, the node to be expanded next is indicated by a marker

Breadth-first search: An example

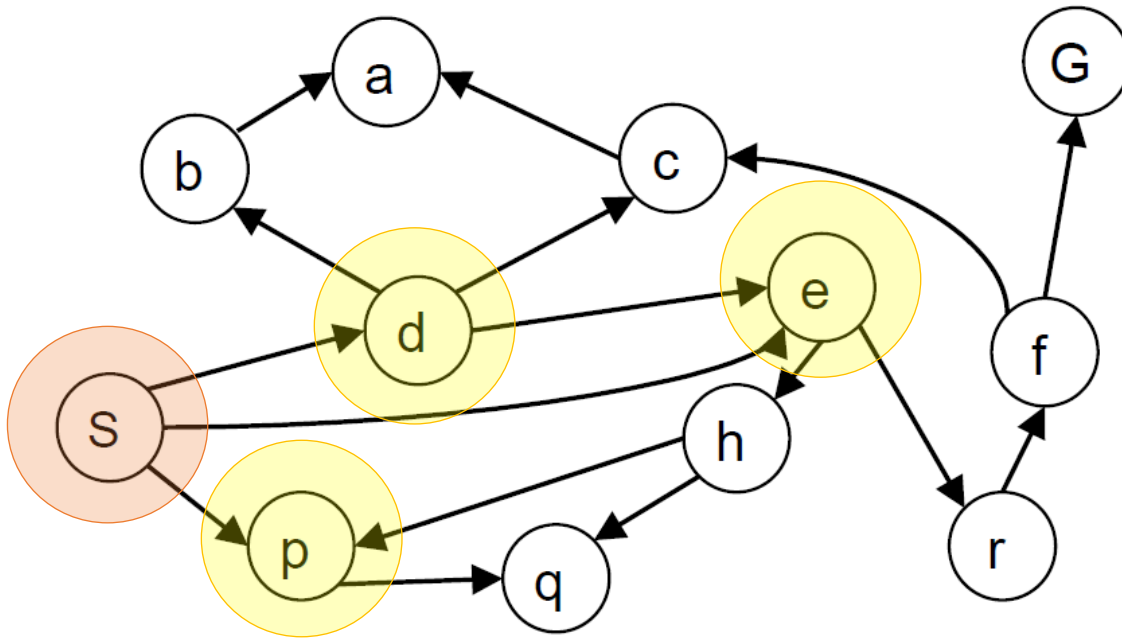
S



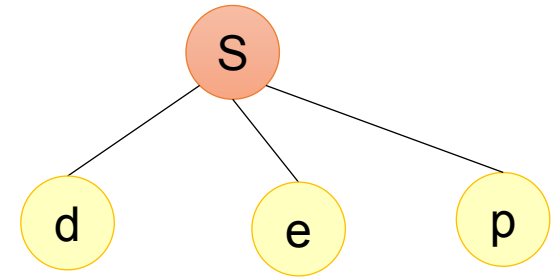
$d = 0$

Search Tree

Breadth-first search: An example

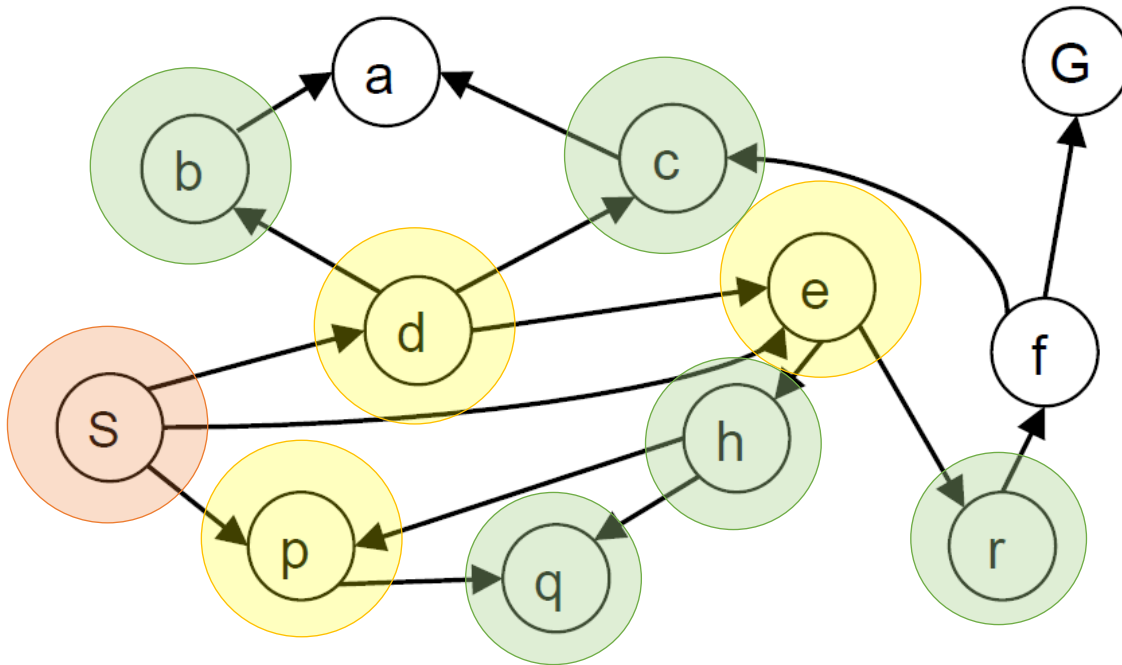


$d = 1$

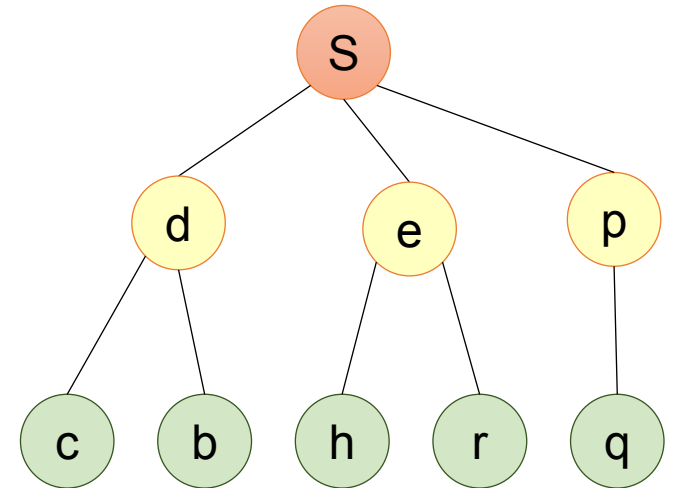


Search Tree

Breadth-first search: An example

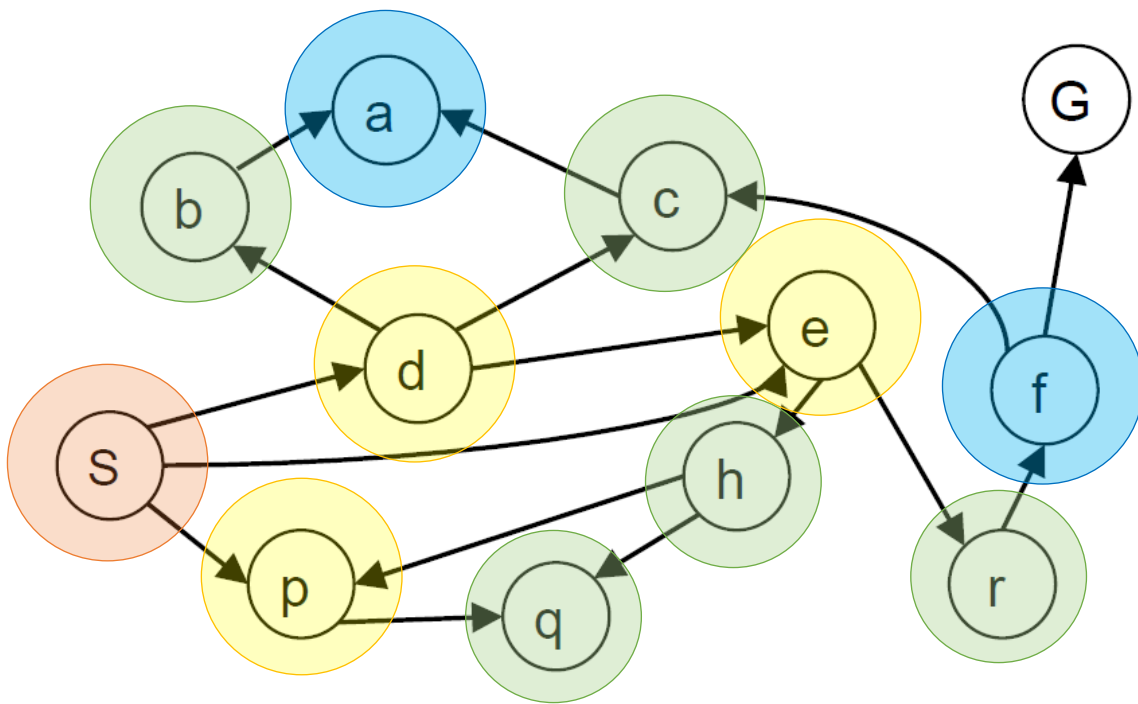


$d = 2$

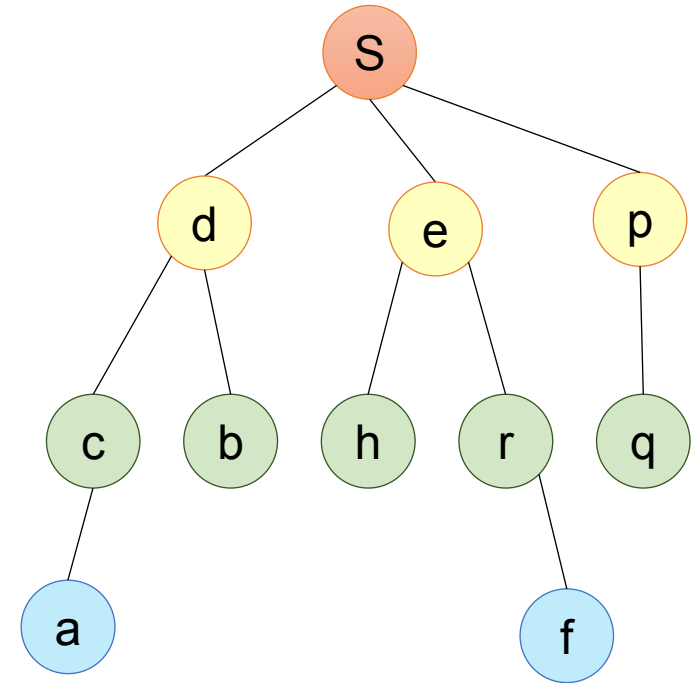


Search Tree

Breadth-first search: An example

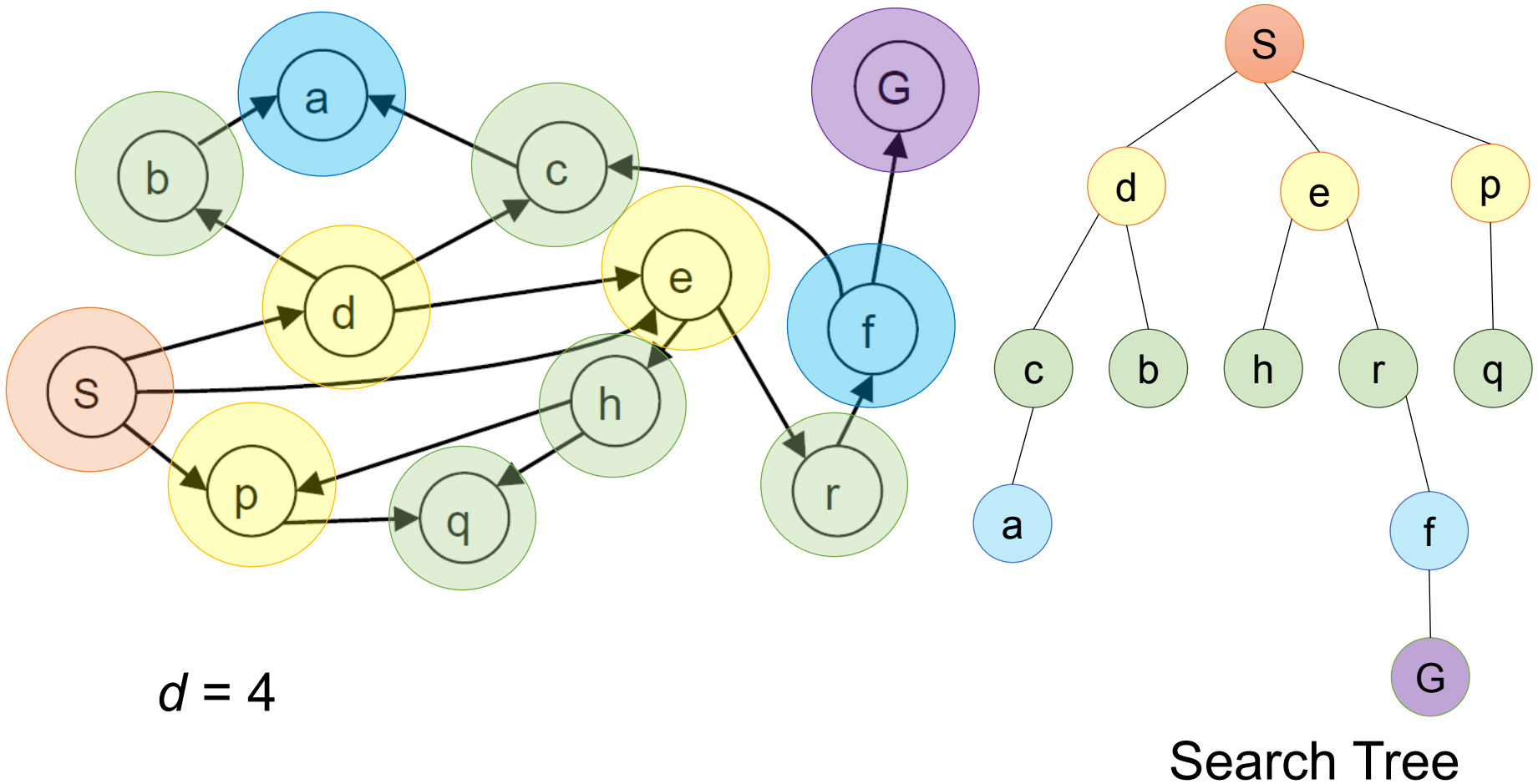


$d = 3$

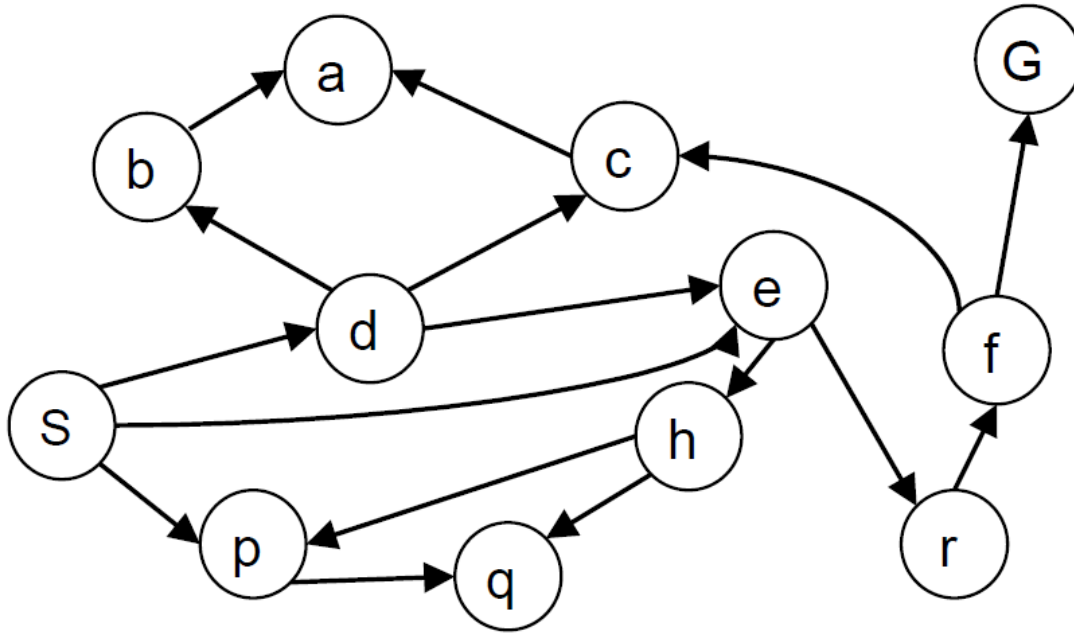


Search Tree

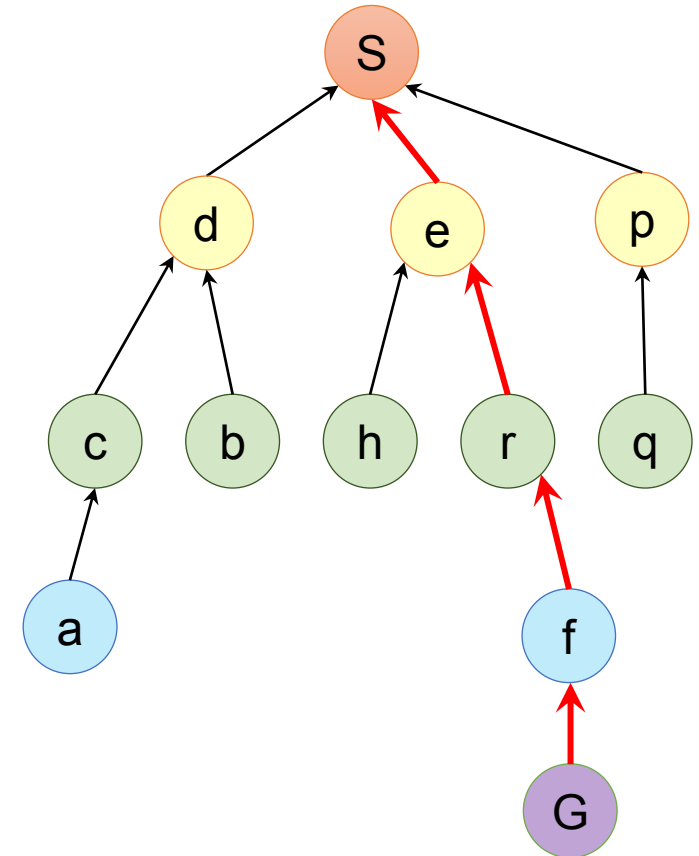
Breadth-first search: An example



Breadth-first search: An example



Search path: $S \rightarrow e \rightarrow r \rightarrow f \rightarrow G$

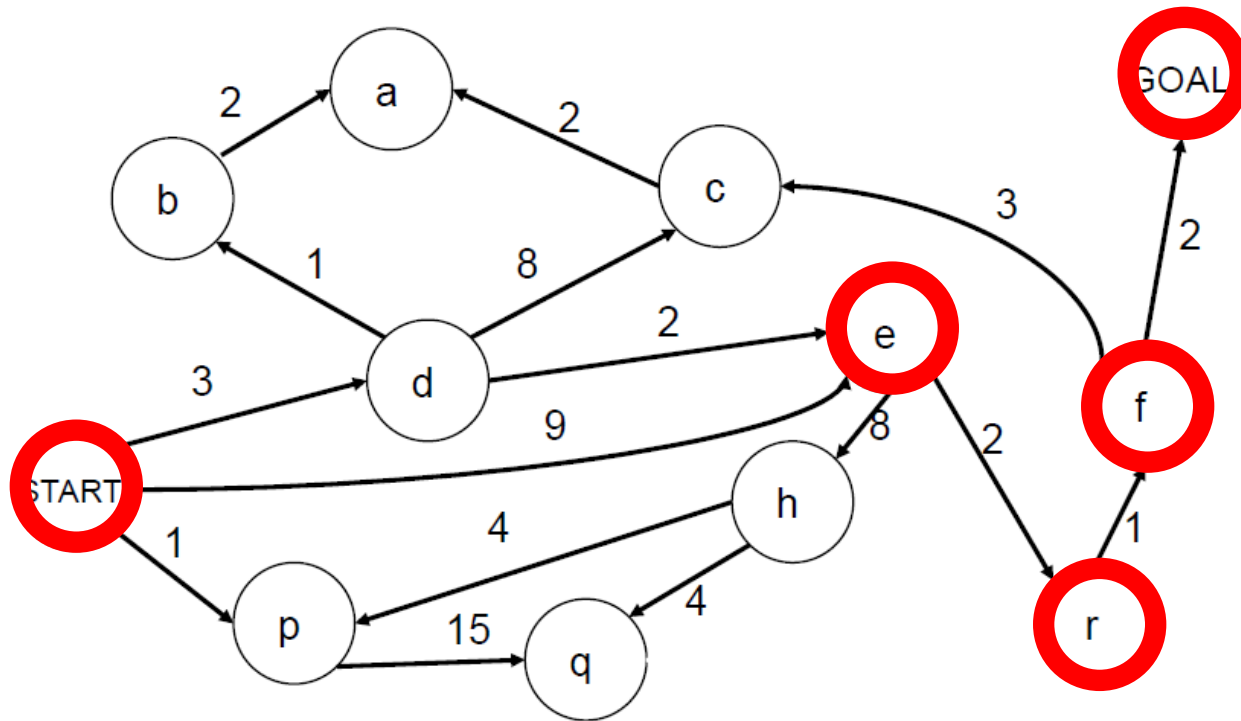


Search Tree

Uniform-Cost Search



Search with varying step costs



- BFS finds the path with the fewest steps but does not always find the cheapest path.
- *Find an algorithm that is optimal with any step-cost function?*

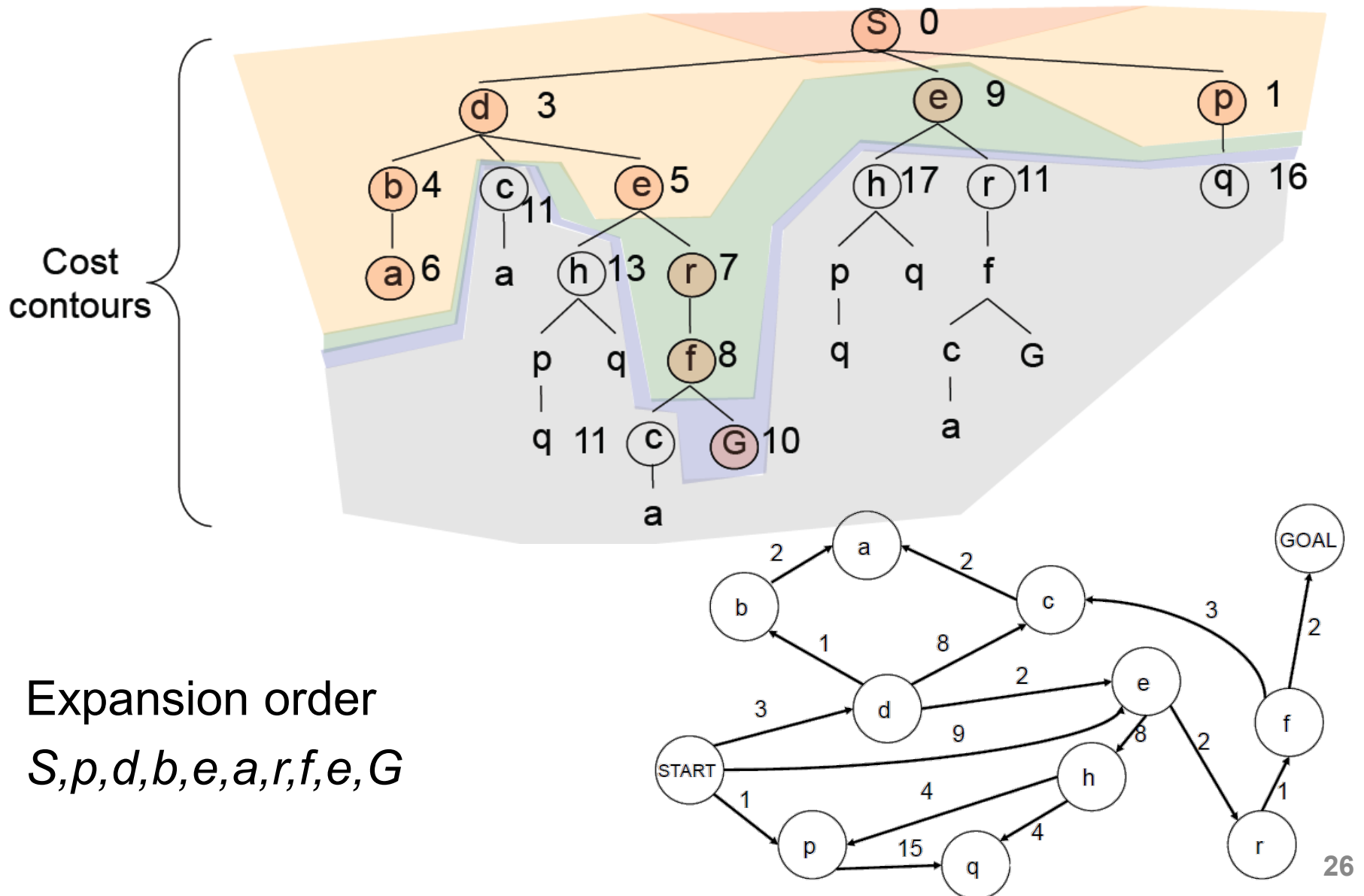
Uniform-cost search (UCS)

- UCS expands the node n with the **lowest path cost** $g(n)$
- Implementation: frontier is a **priority queue** ordered by g
 - Equivalent to breadth-first search if step costs all equal
 - Equivalent to Dijkstra's algorithm in general
- The **goal test** is applied to a node when it is **selected for expansion**
- A test is added in case a **better path** is found to a **node currently on the frontier**.

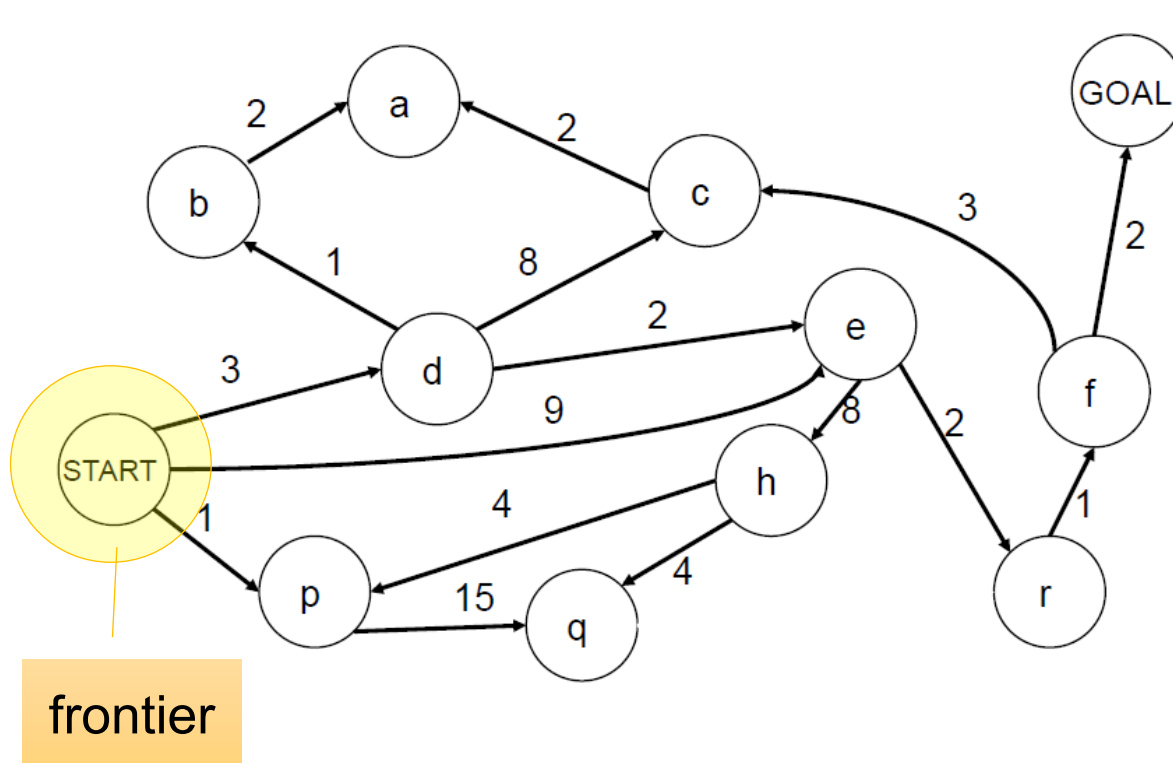
Uniform-cost search (UCS)

```
function UNIFORM-COST-SEARCH(problem) returns a solution, or failure
  node  $\leftarrow$  a node with STATE = problem.INITIAL-STATE, PATH-COST = 0
  frontier  $\leftarrow$  a priority queue ordered by PATH-COST, with node as the element
  explored  $\leftarrow$  an empty set
  loop do
    if EMPTY?(frontier) then return failure
    node  $\leftarrow$  POP(frontier) /* chooses the lowest-cost node in frontier */
    if problem.GOAL-TEST(node.STATE) then return SOLUTION(node)
    add node.STATE to explored
    for each action in problem.ACTIONS(node.STATE) do
      child  $\leftarrow$  CHILD-NODE(problem, node, action)
      if child.STATE is not in explored or frontier then
        frontier  $\leftarrow$  INSERT(child, frontier)
      else if child.STATE is in frontier with higher PATH-COST then
        replace that frontier node with child
```

Uniform-cost search



Uniform-cost search: An example

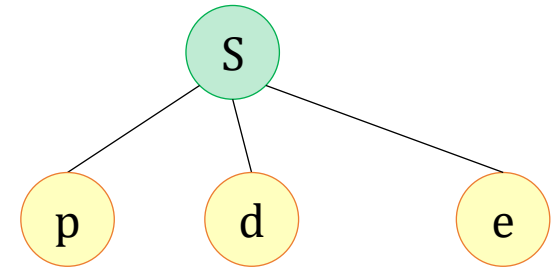
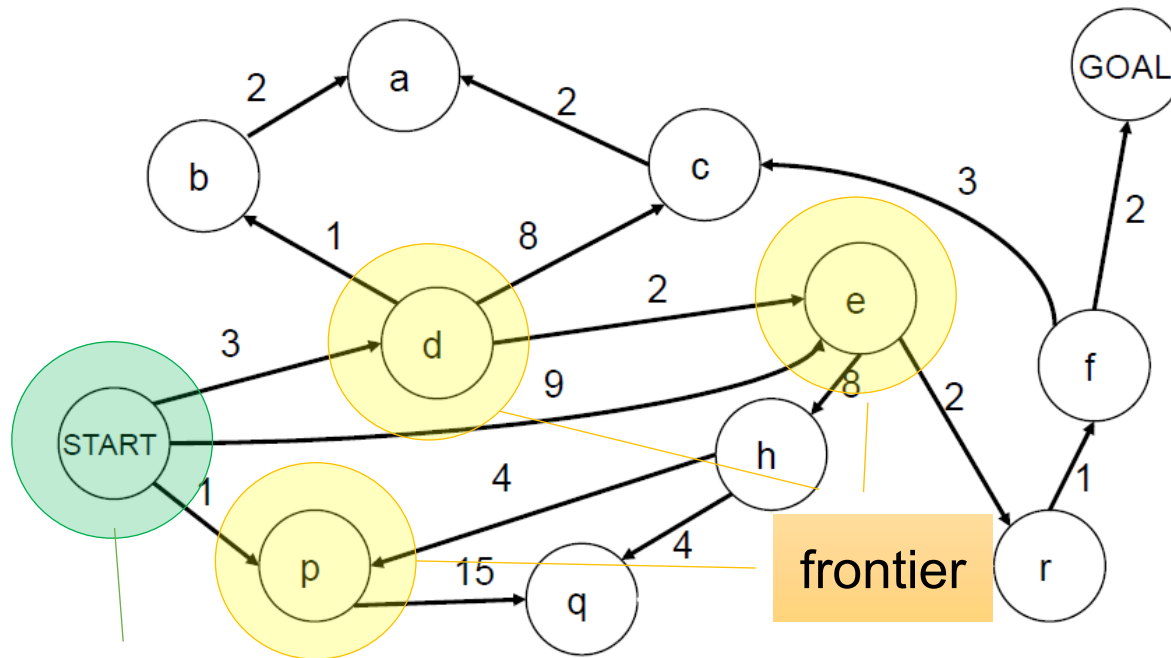


PQ = { (S:0) }

S

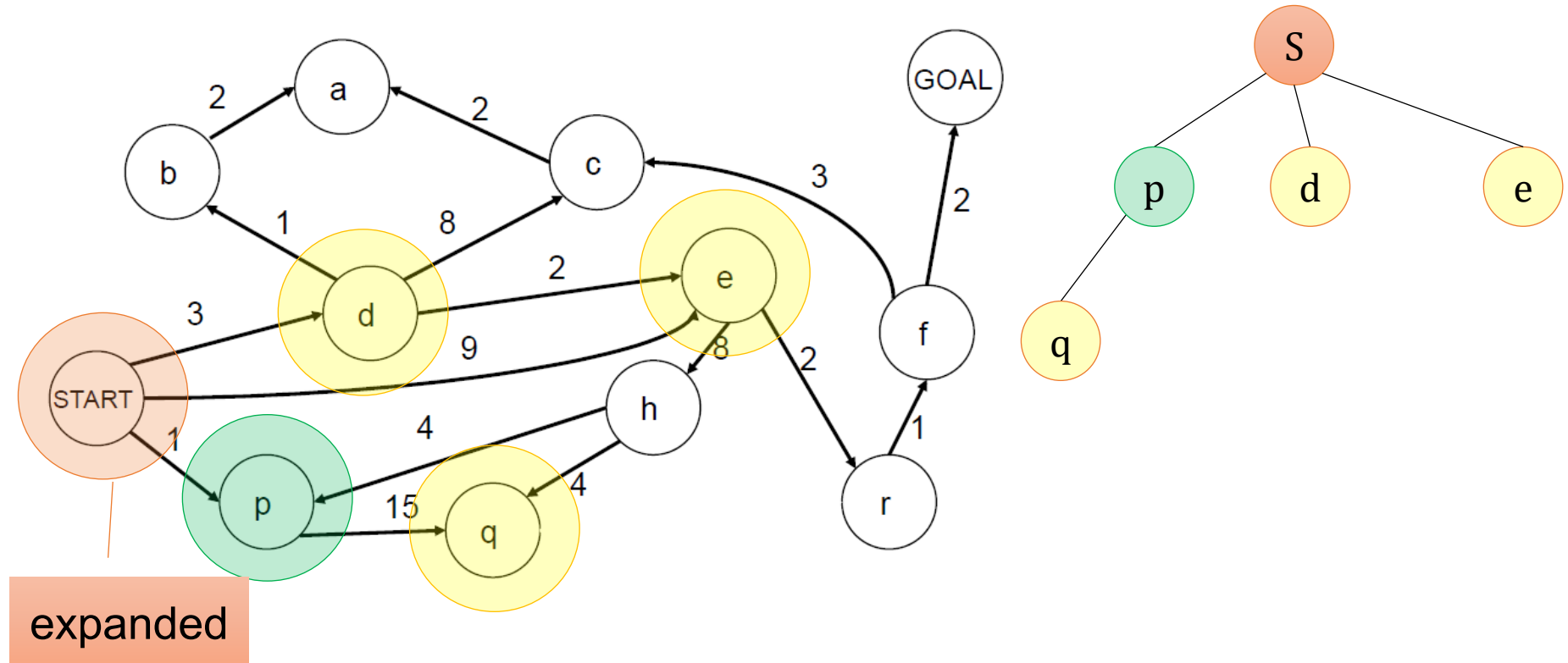
Search Tree

Uniform-cost search: An example



Search Tree

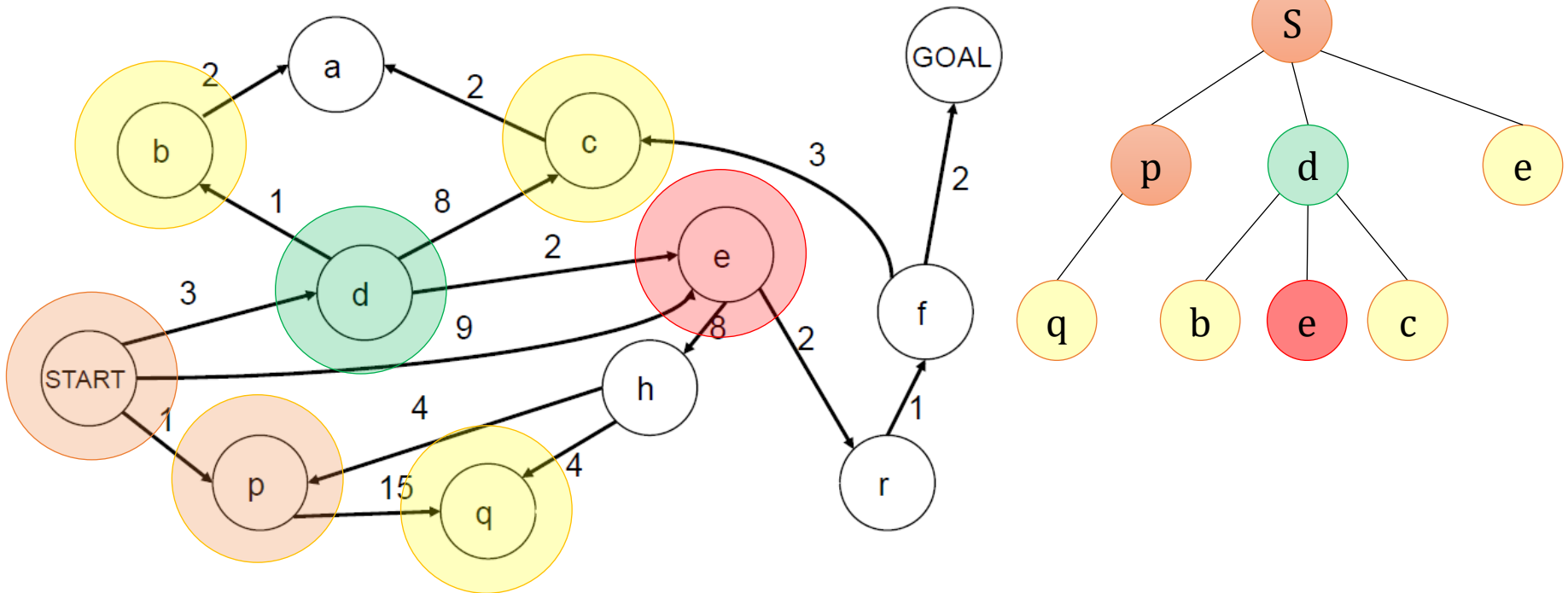
Uniform-cost search: An example



PQ = { (d:3), (e:9), (q:16) }

Search Tree

Uniform-cost search: An example

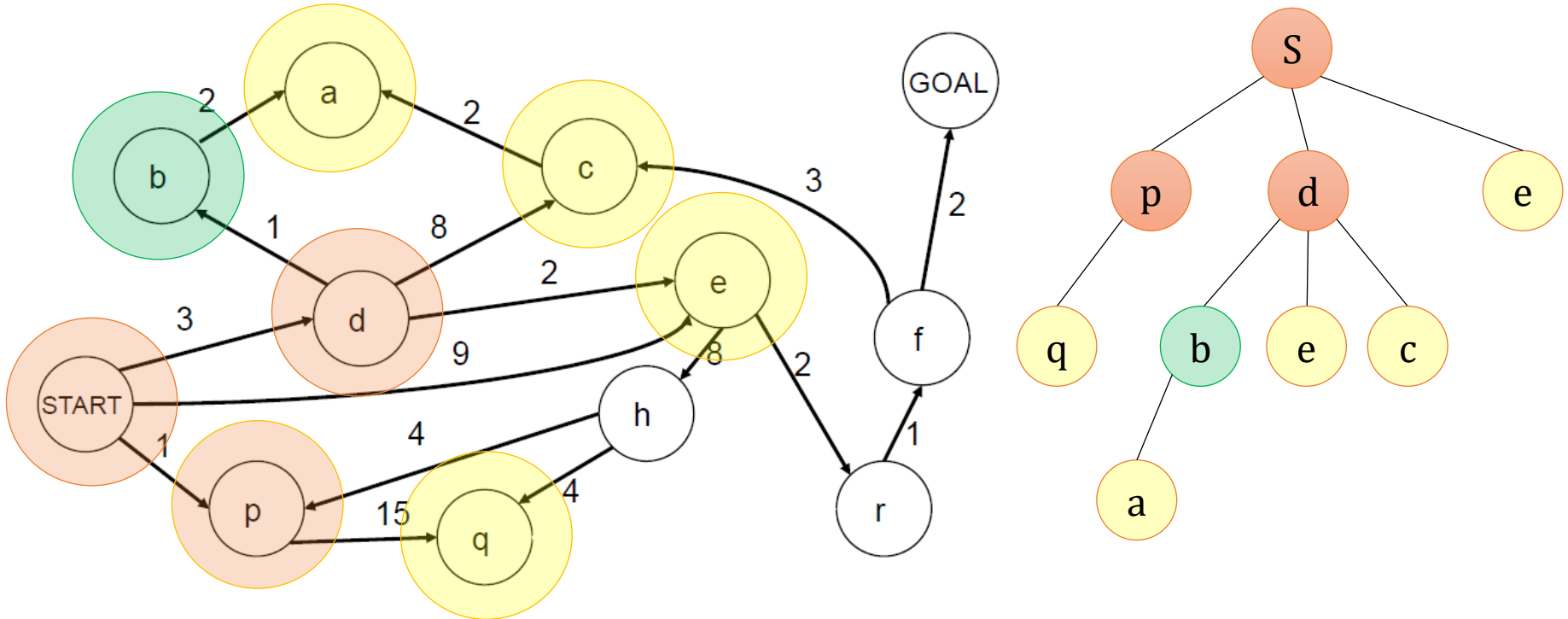


PQ = { (b:4), (e:5), (c:11), (q:16) }

Update path cost of e

Search Tree

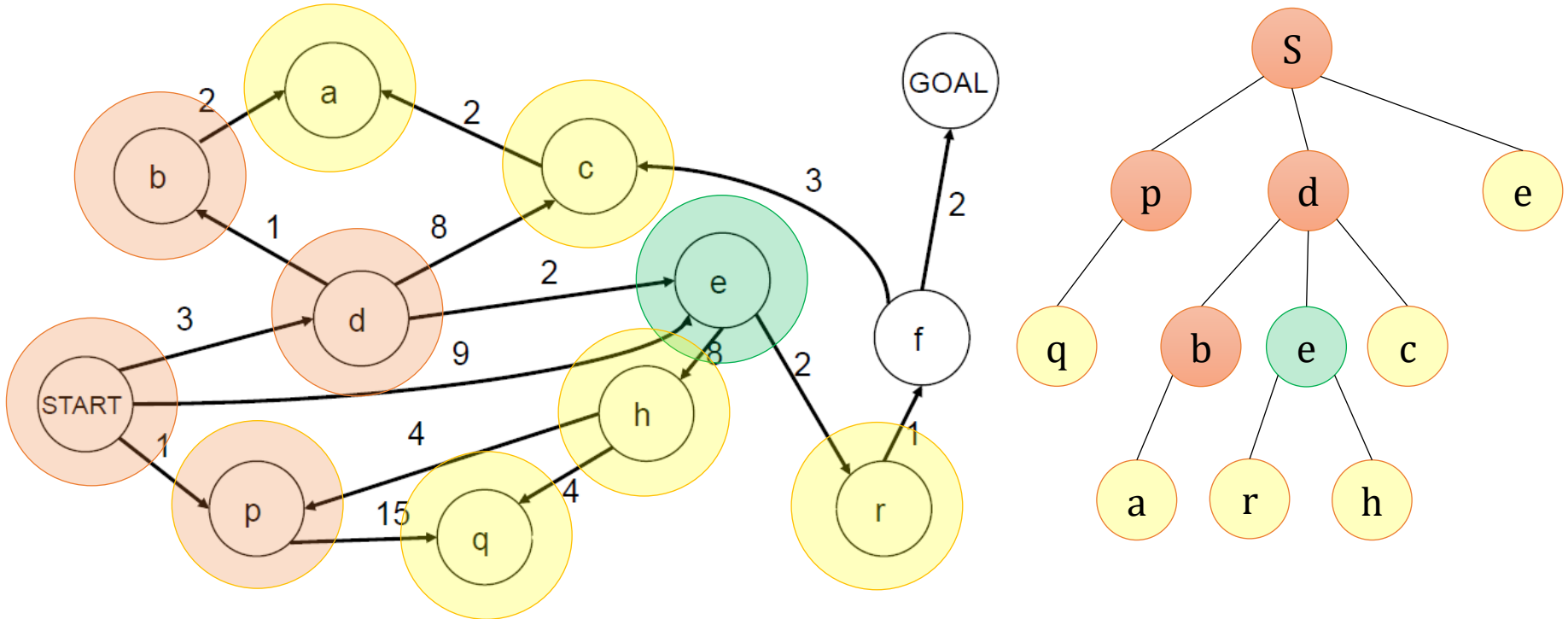
Uniform-cost search: An example



PQ = { (e:5), (a:6), (c:11), (q:16) }

Search Tree

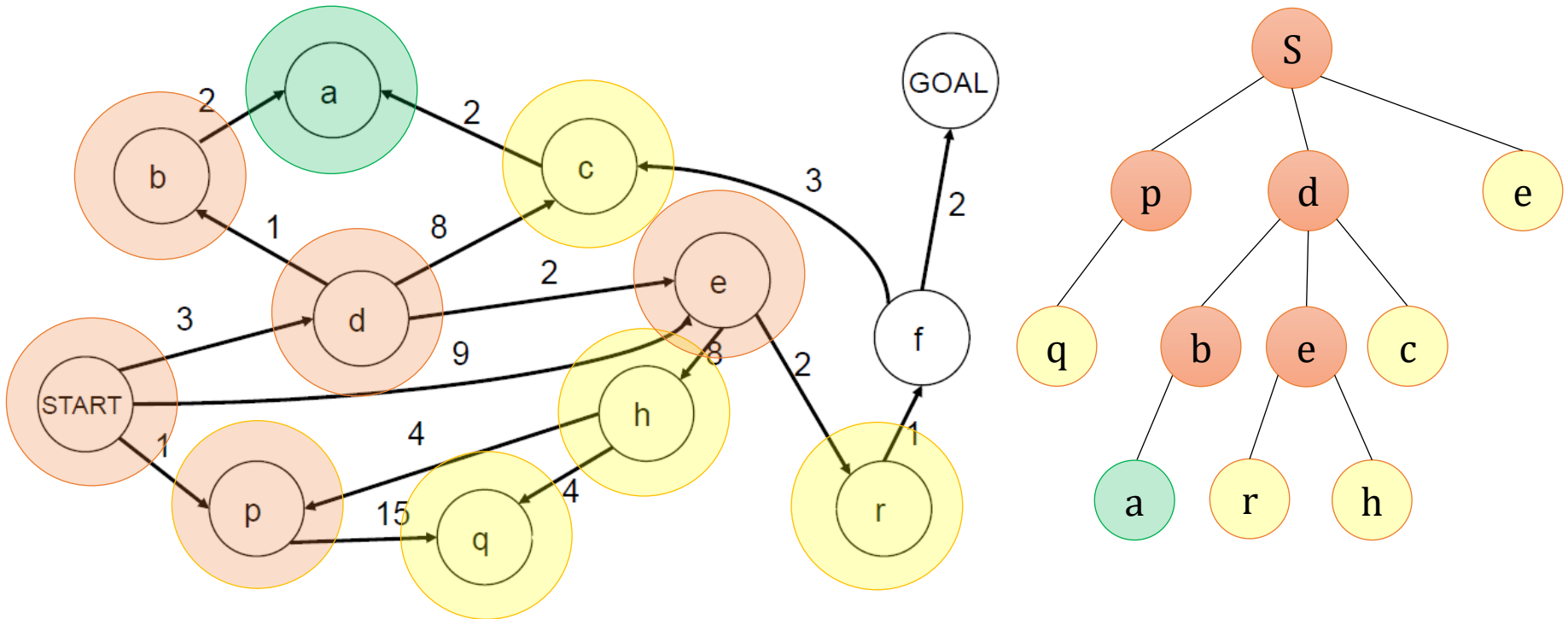
Uniform-cost search: An example



PQ = { (a:6), (r:7), (c:11), (h:13), (q:16) }

Search Tree

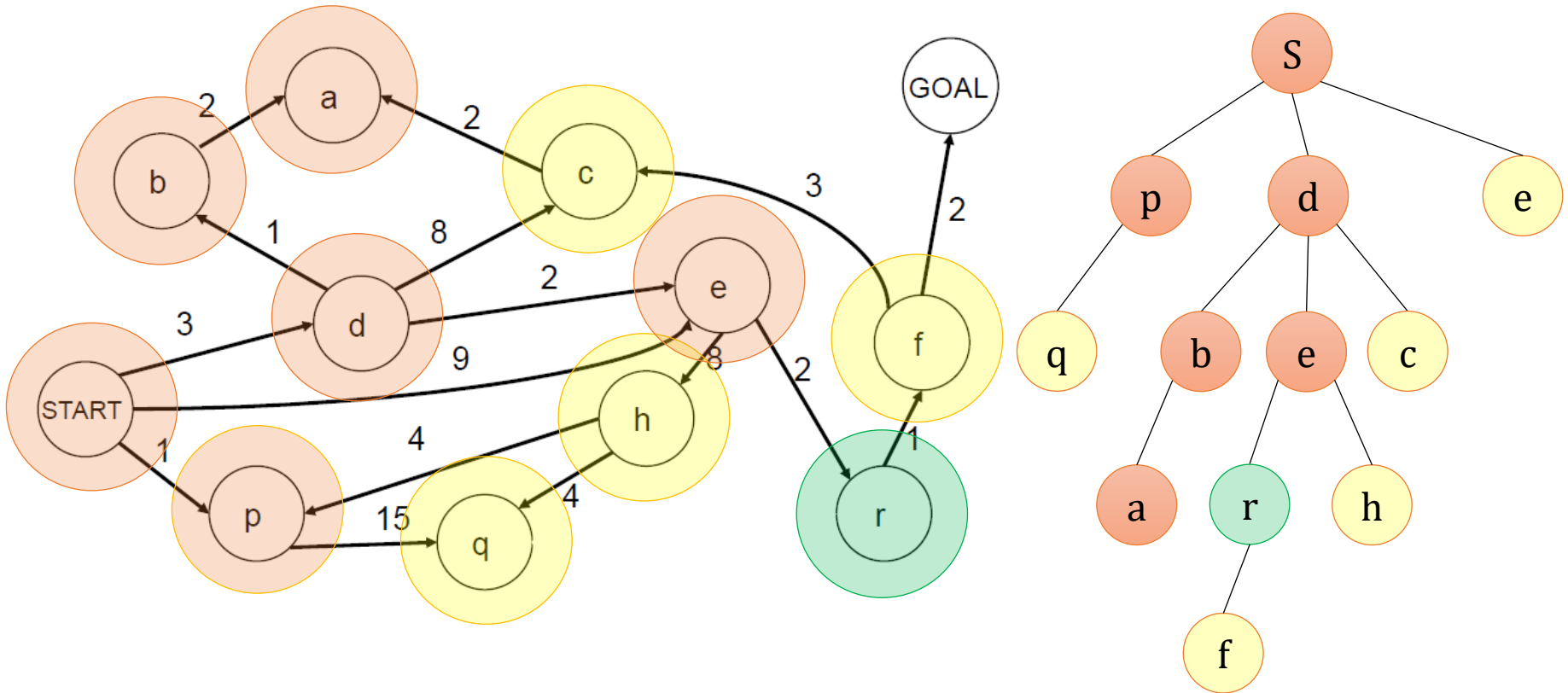
Uniform-cost search: An example



$PQ = \{ (r:7), (c:11), (h:13), (q:16) \}$

Search Tree

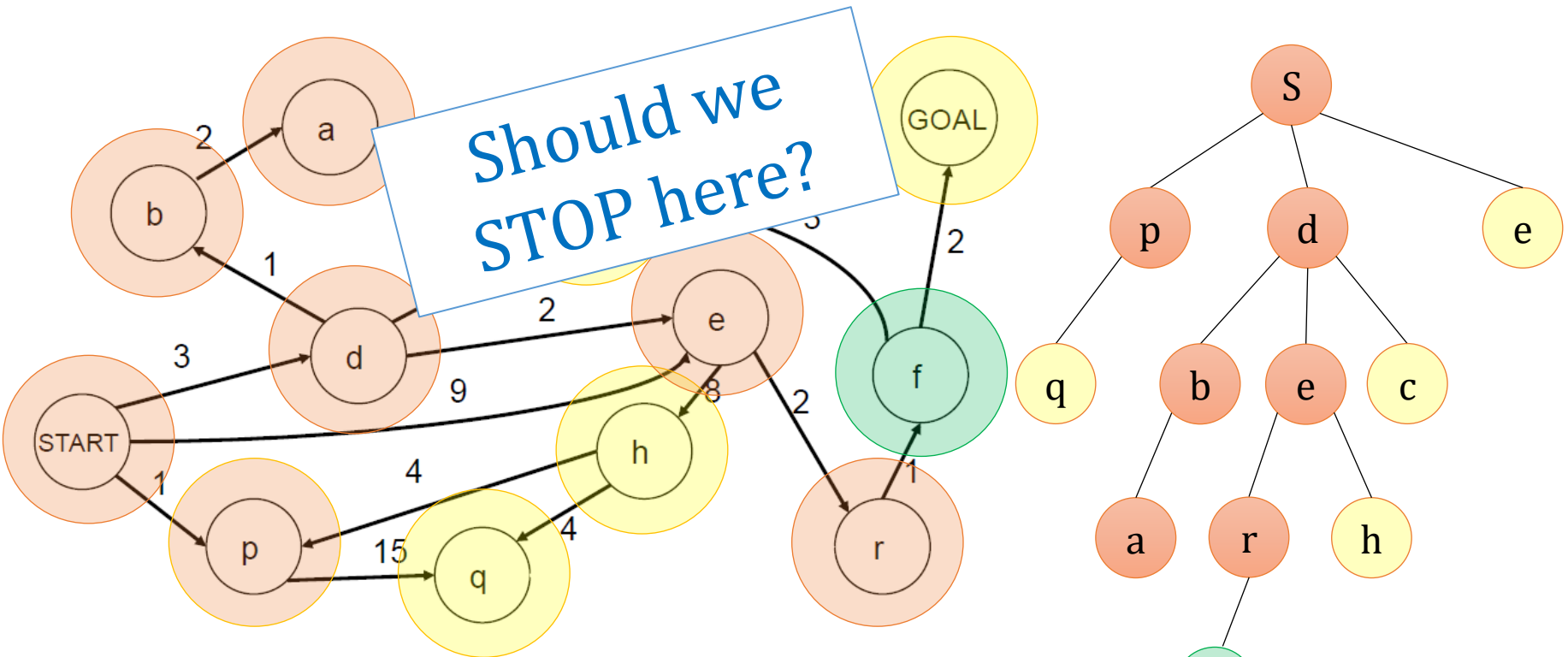
Uniform-cost search: An example



PQ = { (f:8), (c:11), (h:13), (q:16) }

Search Tree

Uniform-cost search: An example

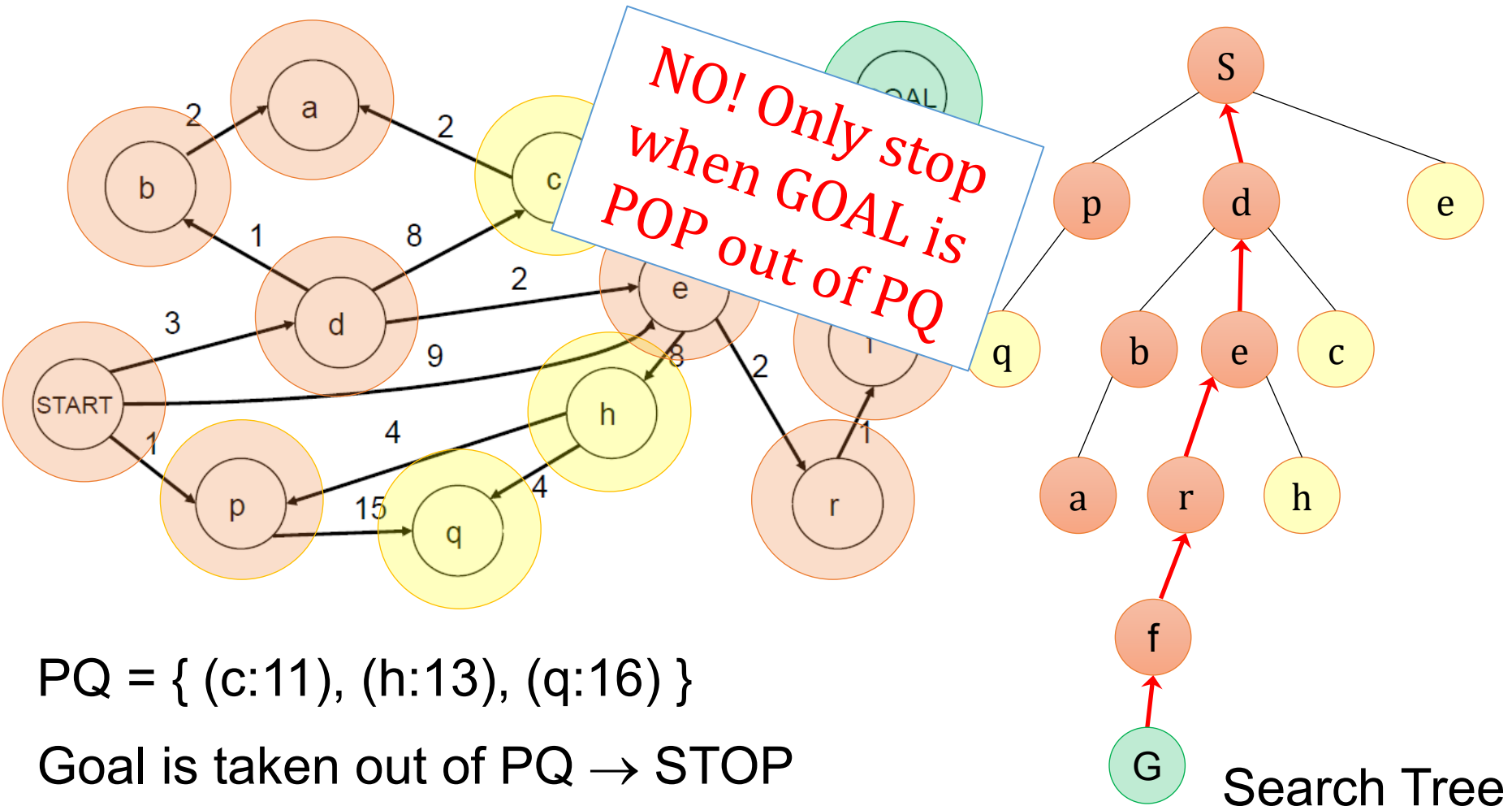


PQ = { (G:10), (c:11), (h:13), (q:16) }

Not update path cost of c

Search Tree

Uniform-cost search: An example

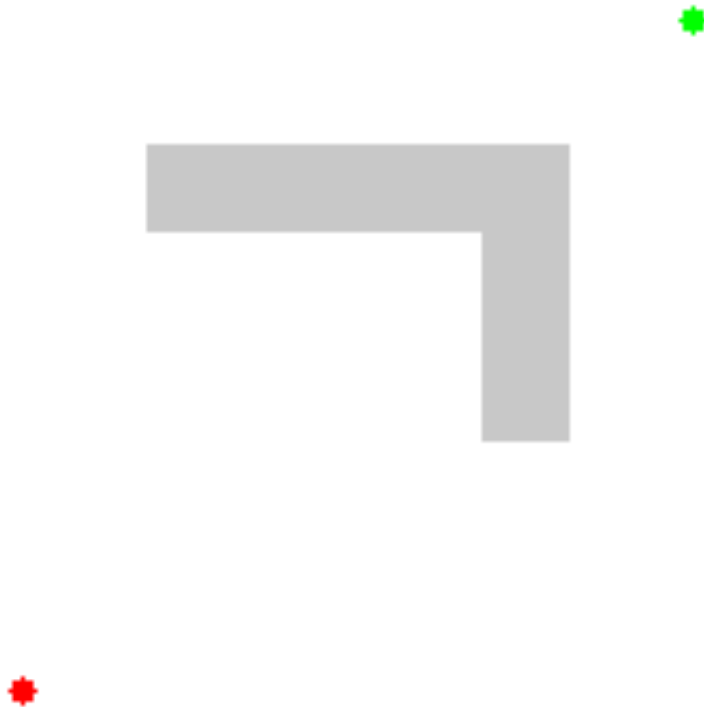


PQ = { (c:11), (h:13), (q:16) }

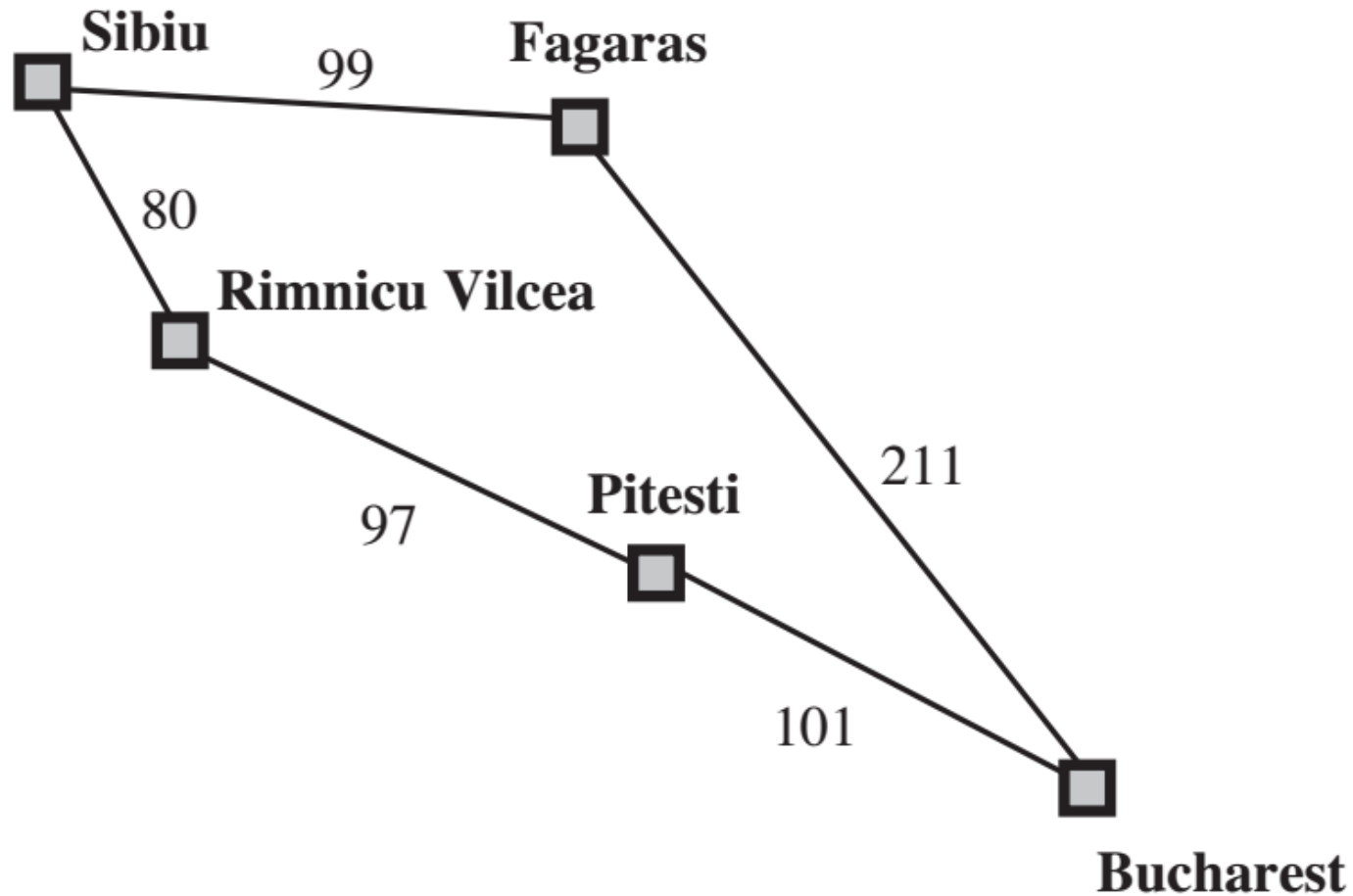
Goal is taken out of PQ → STOP

Search path: S → d → e → r → f → G, cost = 10

Uniform-cost search: An example



Uniform-cost search: Suboptimal path

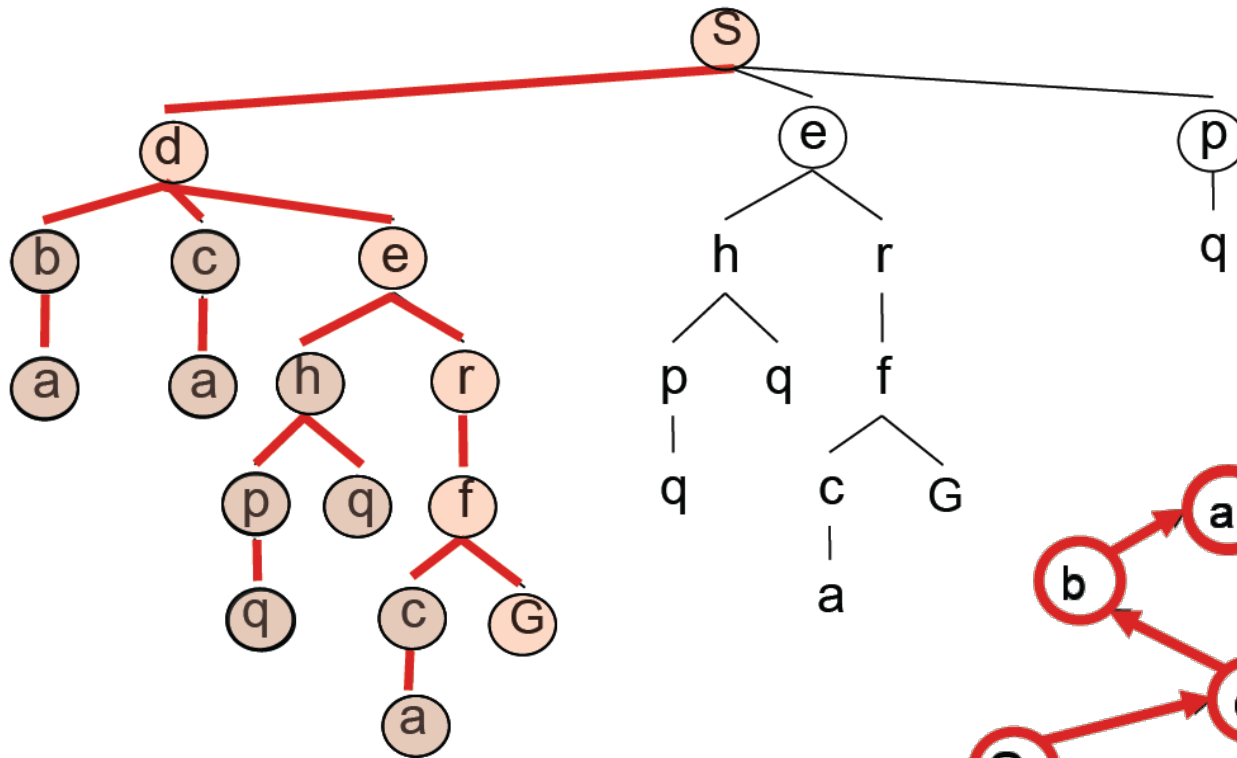


Depth-First Search



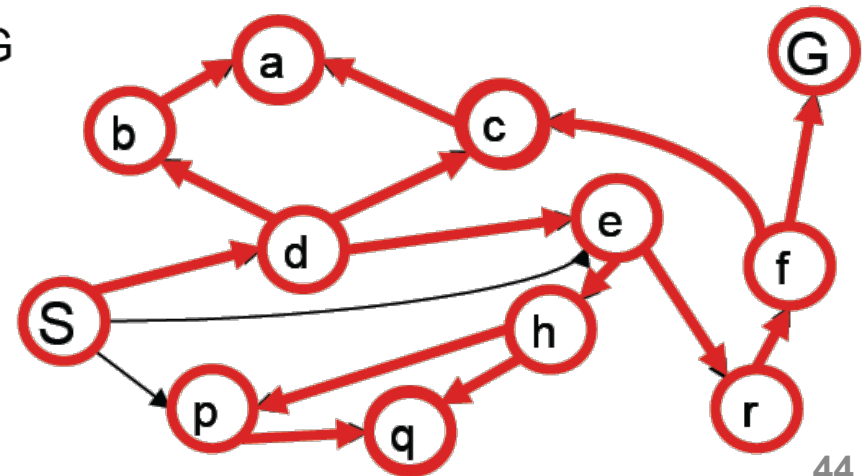
Depth-first search (DFS)

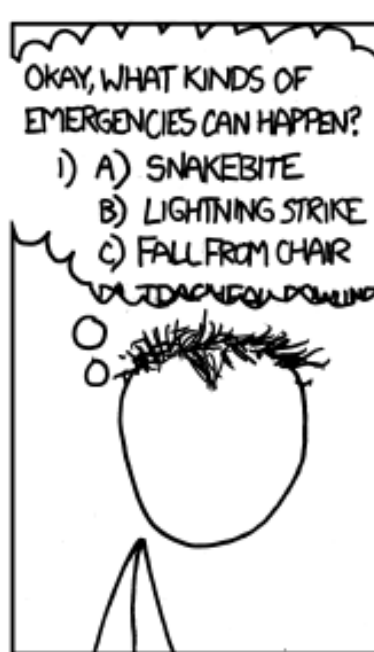
- Expand deepest unexpanded node
- Implementation: *frontier* is a **LIFO Stack**



Expansion order:

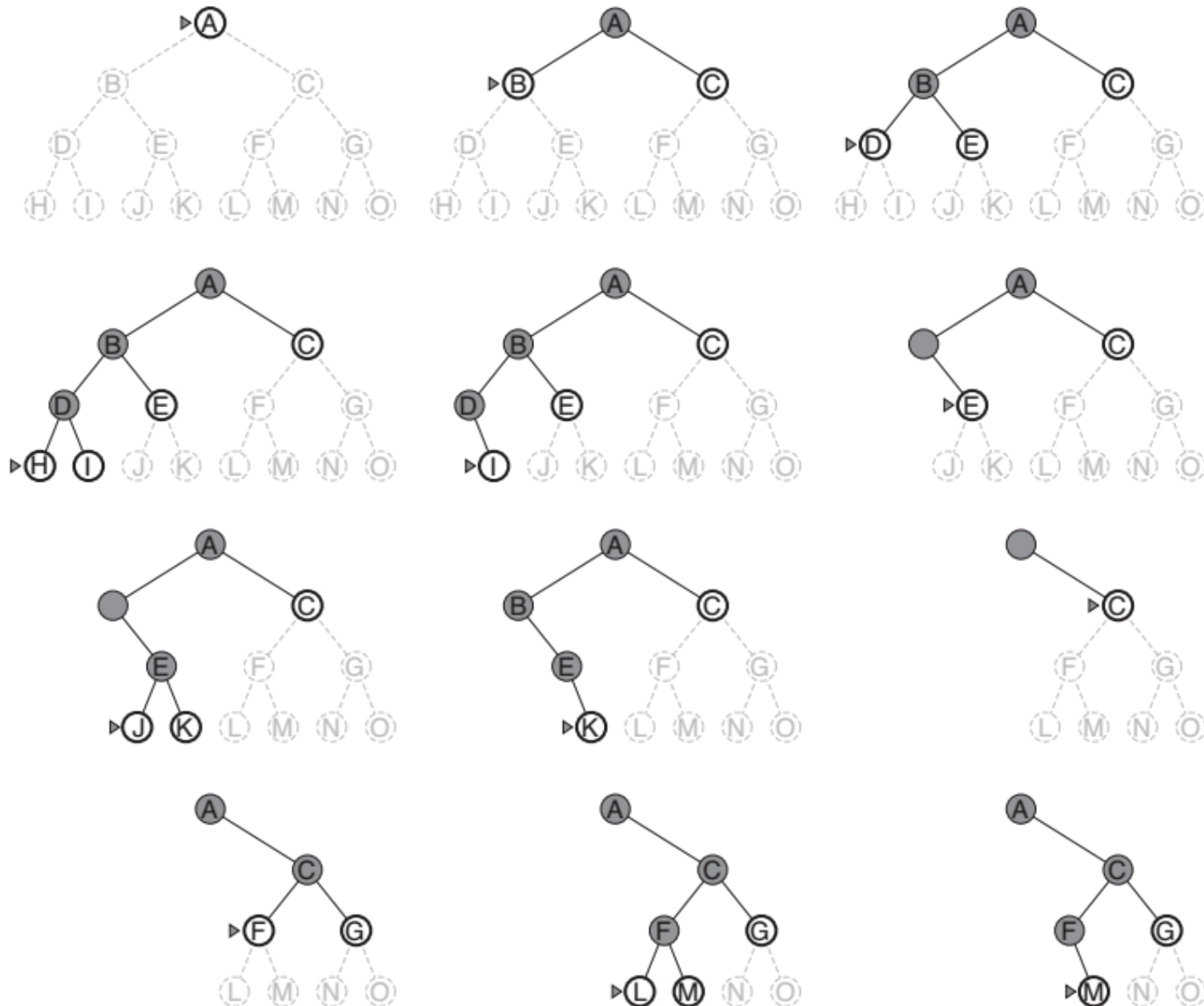
$S, d, b, a, c, a, e, h, p, q, q, r, f, c, a, G$





I REALLY NEED TO STOP USING DEPTH-FIRST SEARCHES.

Depth-first search: An example



Depth-Limited Search



Depth-limited Search (DLS)

- Standard DFS with a **predetermined depth limit l** , i.e., nodes at depth l are treated as if they have no successors.
 - infinite problems solved
- Depth limits can be based on knowledge of the problem.
 - Diameter of state-space, typically unknown ahead of time in practice
 - E.g., 20 cities in the Romania map → $l = 19$, but any city is reached from any other city in at most 9 steps → $l = 9$ is better

Depth-limited Search (DLS)

```
function DEPTH-LIMITED-SEARCH(problem, limit) returns a solution, or  
failure/cutoff  
return RECURSIVE-DLS(MAKE-NODE(problem.INITIAL-STATE),  
                        problem, limit)
```

```
function RECURSIVE-DLS(node, problem, limit) returns a solution, or  
failure/cutoff
```

```
  if problem.GOAL-TEST(node.STATE) then return SOLUTION(node)
```

```
  else if limit = 0 then return cutoff
```

```
  else cutoff_occurred? ← false
```

```
  for each action in problem.ACTIONS(node.STATE) do
```

```
    child ← CHILD-NODE(problem, node, action)
```

```
    result ← RECURSIVE-DLS(child, problem, limit - 1)
```

```
    if result = cutoff then cutoff_occurred? ← true
```

```
    else if result ≠ failure then return result
```

```
  if cutoff_occurred? then return cutoff else return failure
```

- Failure: no solution
- Cutoff: no solution within the depth limit

Iterative Deepening Search



Iterative deepening search (IDS)

- General strategy, often used in combination with **depth-first tree search** to find the best depth limit

```
function ITERATIVE-DEEPENING-SEARCH(problem) returns a solution, or failure
  for depth = 0 to  $\infty$  do
    result  $\leftarrow$  DEPTH-LIMITED-SEARCH(problem, depth)
    if result  $\neq$  cutoff then return result
```

- Gradually increase the limit until a goal is found.
 - The depth limit reaches the depth d of the **shallowest goal node**.

Iterative deepening search (IDS)

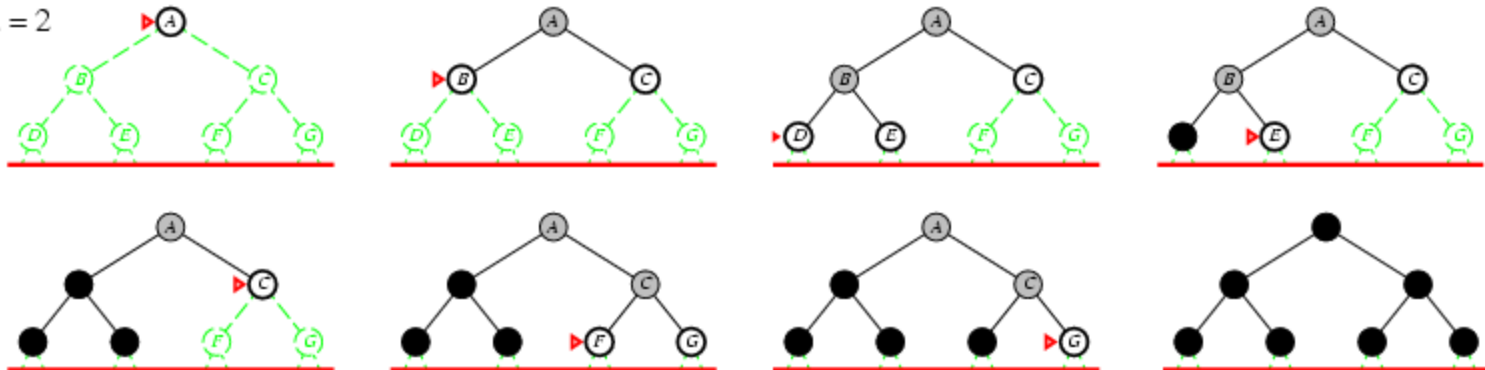
Limit = 0



Limit = 1

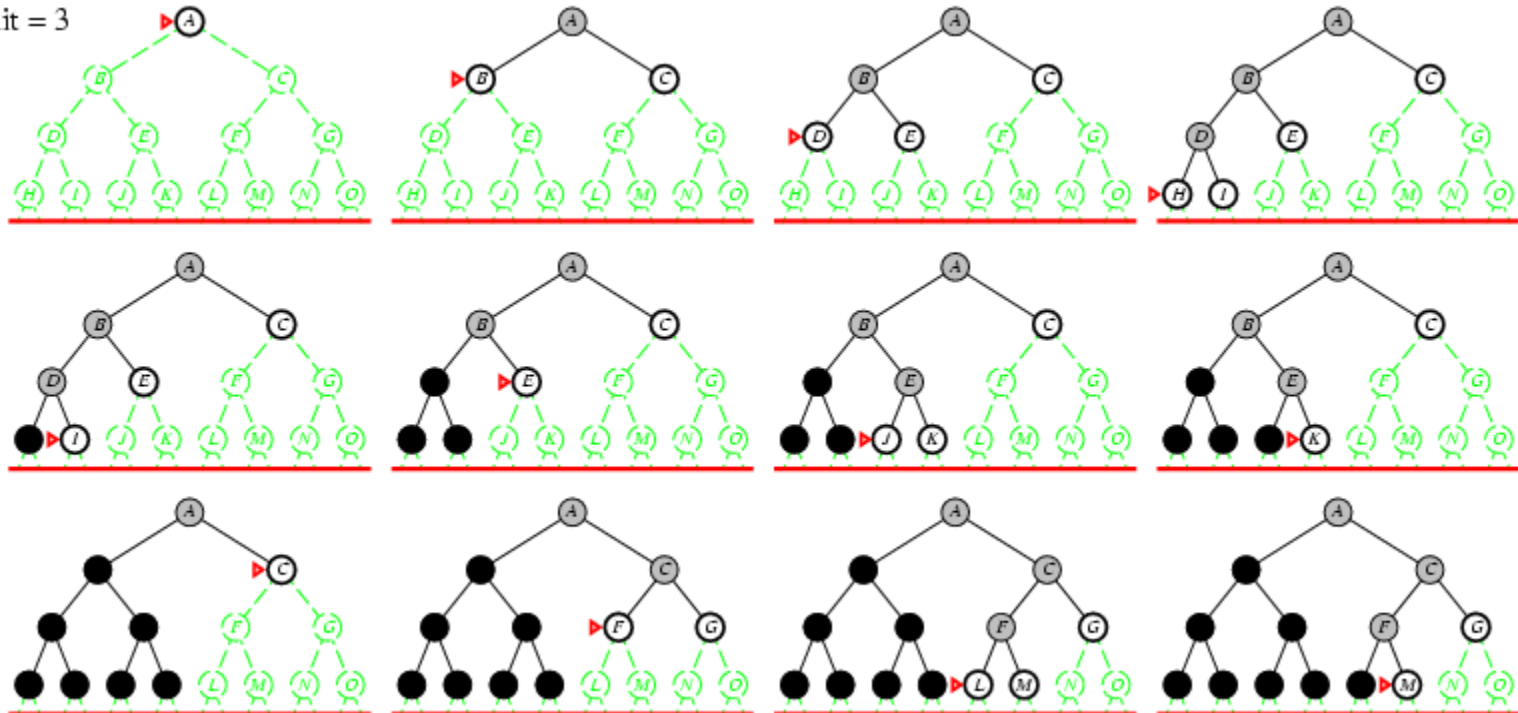


Limit = 2



Iterative deepening search (IDS)

Limit = 3

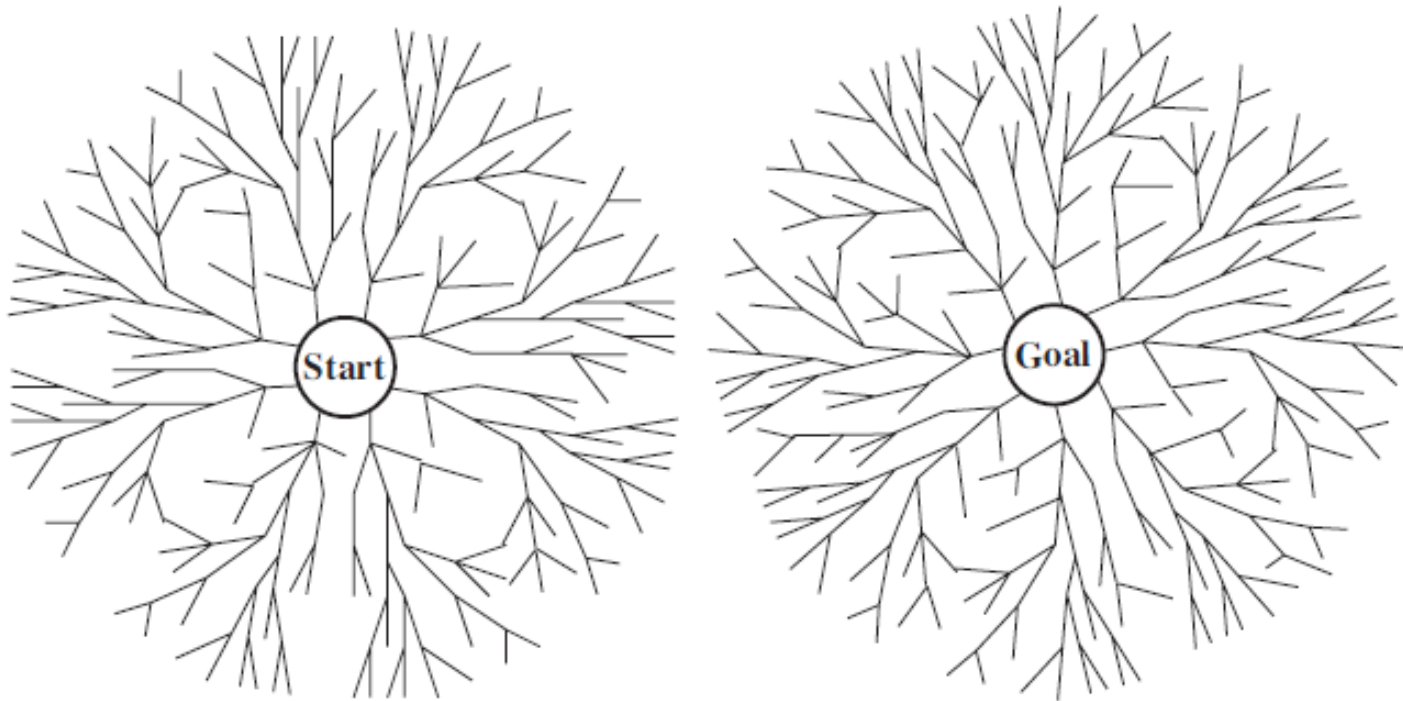


Bidirectional Search



Bidirectional search

- Two simultaneous searches: one from the **initial state towards**, and the other from the **goal state backwards**
- Hoping that two searches **meet** in the middle



A summary of uninformed search

- Comparison of uninformed algorithms (tree-search versions)

Criterion	Breadth-First	Uniform-Cost	Depth-First	Depth-Limited	Iterative Deepening	Bidirectional (if applicable)
Complete?	Yes ^a	Yes ^{a,b}	No	No	Yes ^a	Yes ^{a,d}
Time	$O(b^d)$	$O(b^{1+\lceil C^*/\epsilon \rceil})$	$O(b^m)$	$O(b^\ell)$	$O(b^d)$	$O(b^{d/2})$
Space	$O(b^d)$	$O(b^{1+\lceil C^*/\epsilon \rceil})$	$O(bm)$	$O(b\ell)$	$O(bd)$	$O(b^{d/2})$
Optimal?	Yes ^c	Yes	No	No	Yes ^c	Yes ^{c,d}

Figure 3.21 Evaluation of tree-search strategies. b is the branching factor; d is the depth of the shallowest solution; m is the maximum depth of the search tree; ℓ is the depth limit. Superscript caveats are as follows: ^a complete if b is finite; ^b complete if step costs $\geq \epsilon$ for positive ϵ ; ^c optimal if step costs are all identical; ^d if both directions use breadth-first search.