

Advanced Artificial Intelligence

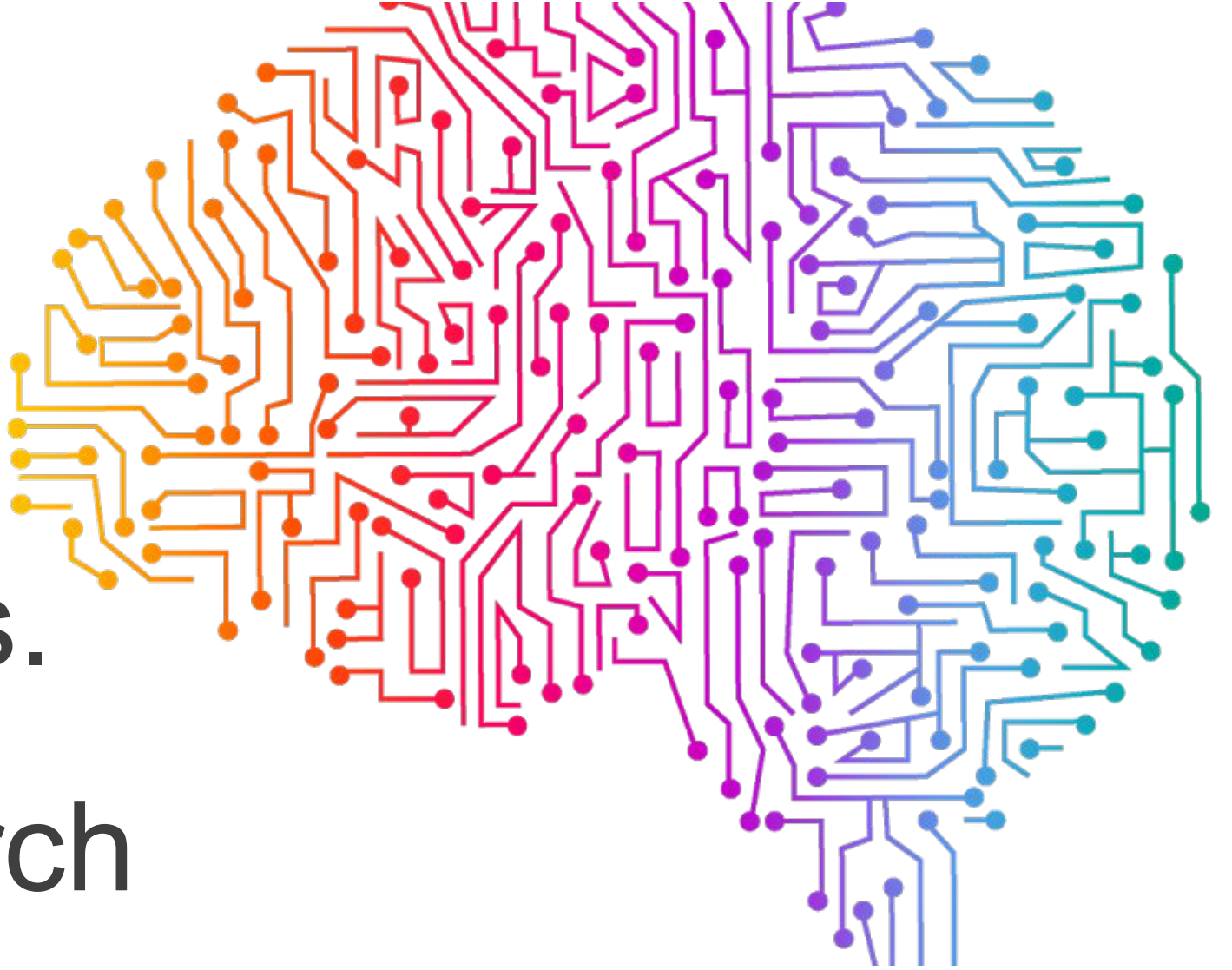
Week #2-2

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Learning Objective of this Topic

- Uninformed vs. Informed Search
- Uninformed Searching Algorithms
 - Breadth First Search (BFS)
 - Depth First Search (DFS)
 - Uninformed Cost Search (UCS)
 - Difference between BFS and DFS
 - When to use BFS? Real-Life Applications
 - When to use DFS? Real-Life Applications



Uninformed vs.
Informed Search



Uninformed vs. Informed Search



Uninformed

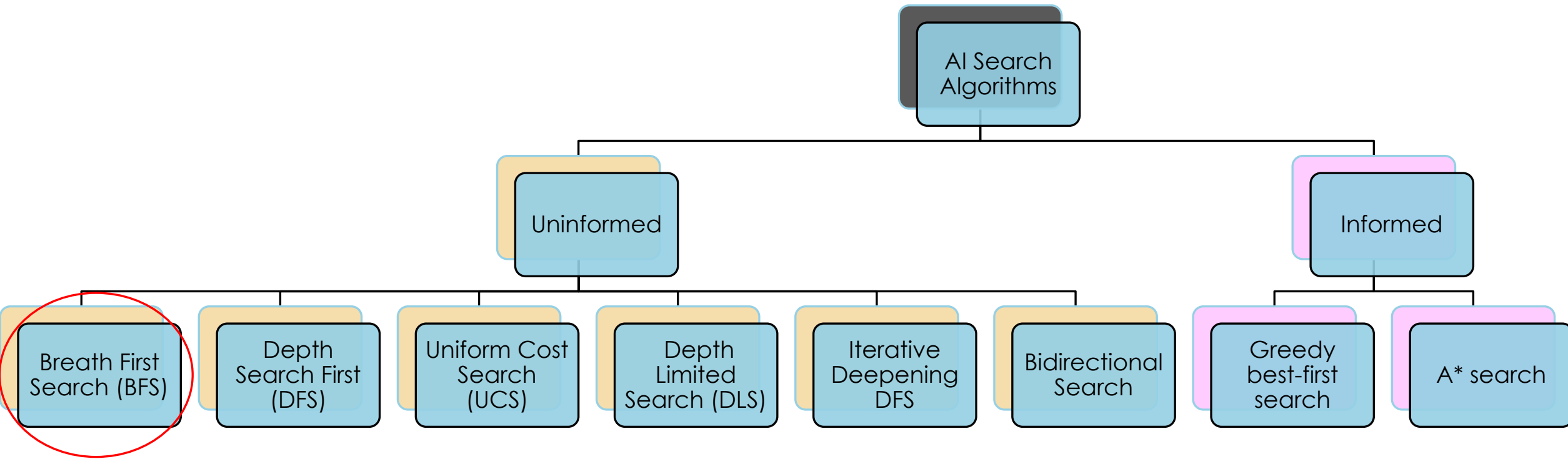
- ❑ Also known as Blind search.
- ❑ Do not require information to perform a search.
- ❑ May be time-consuming.
- ❑ Comparatively high in cost.
- ❑ The AI does not get any suggestions regarding the solution and where to find it.

Informed

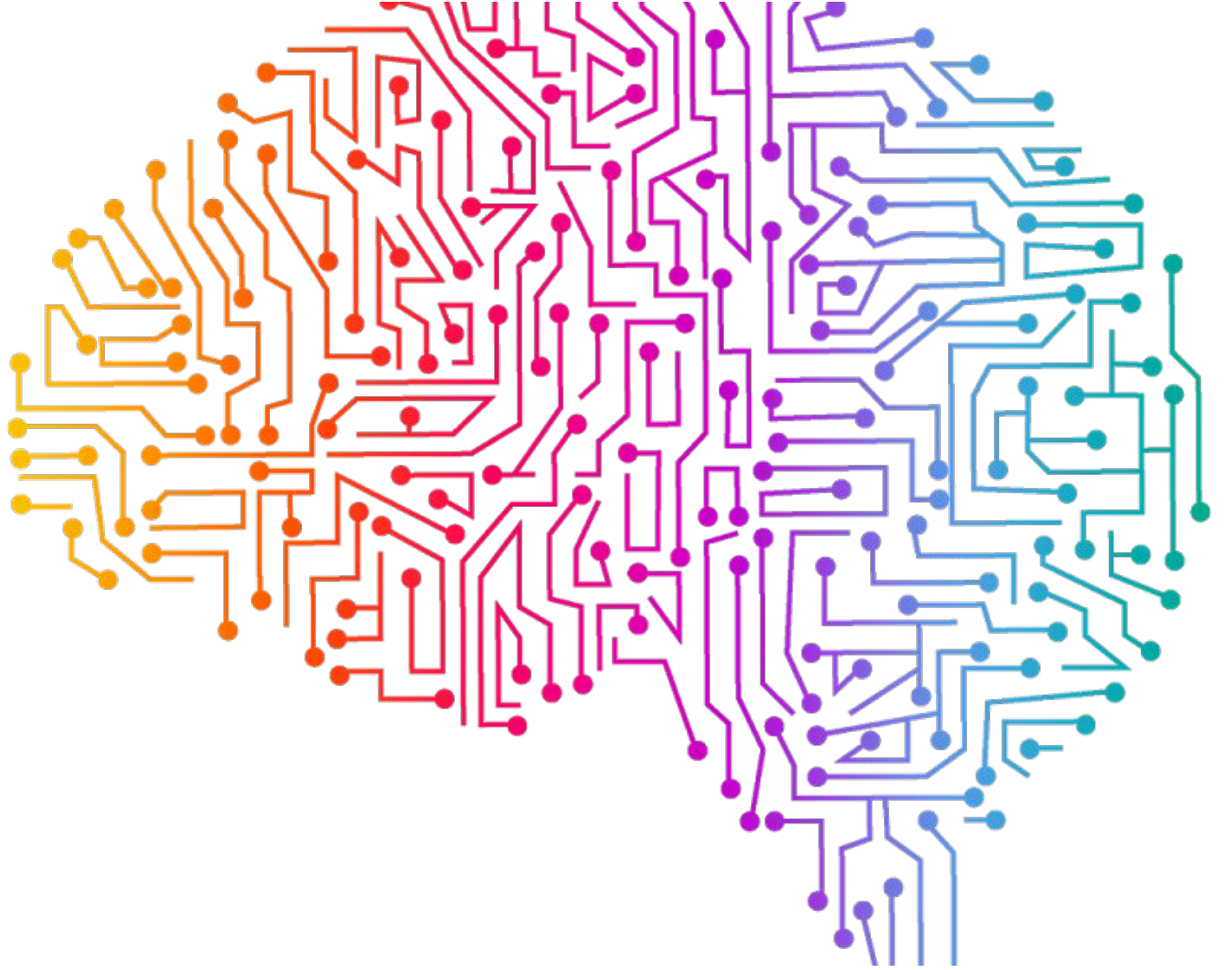
- ❑ Also known as Heuristic search.
- ❑ Requires information to perform search Quick solution to the problem.
- ❑ Cost is low.
- ❑ The AI gets suggestions regarding how and where to find a solution to any problem.



UNINFORMED SEARCH ALGORITHM

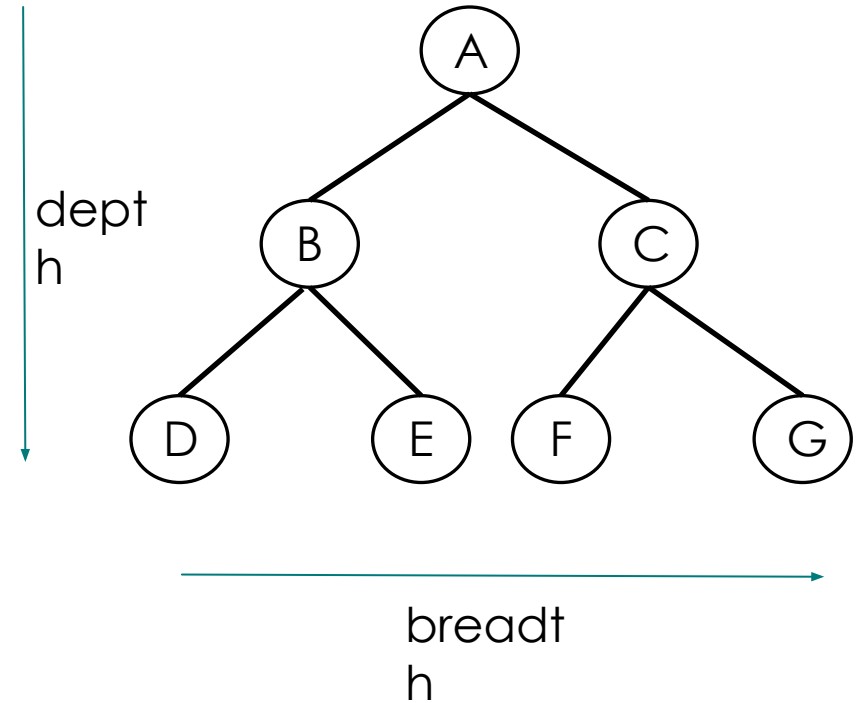


Breadth First Search (BFS)



Breadth First Search

- Expand Shallowest Node First (Level First Search)
- Queue: nodes in the queue to be explored
- explored: Nodes that are already explored
- Queue is a first-in-first-out (FIFO) queue, i.e., new successors go at the end of the queue.



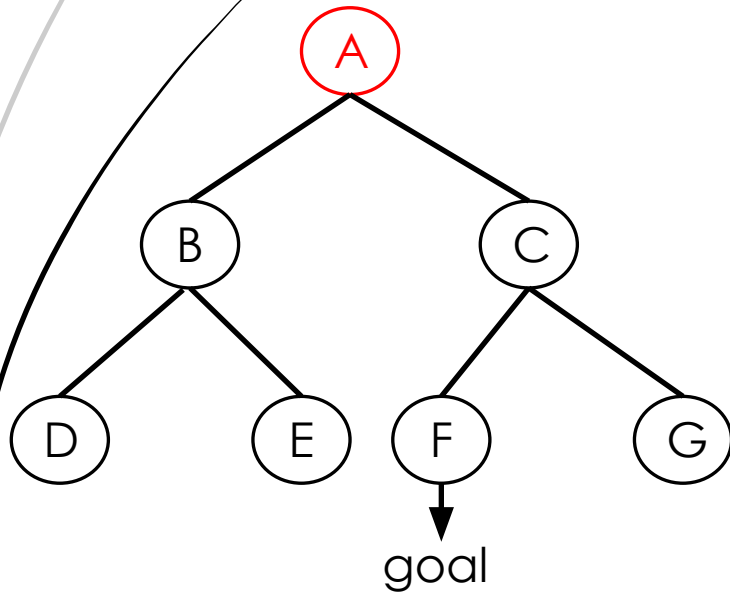
Breadth First Search

- Expand Shallowest Node First (Level First Search)
- Queue: nodes in the queue to be explored
- explored: Nodes that are already explored
- Queue is a first-in-first-out (FIFO) queue, i.e., new successors go at the end of the queue.

```
function BREADTH-FIRST-SEARCH(problem) returns a solution, or failure
  Queue ← a FIFO queue with source node as the only element
  explored ← an empty set
  if source node == goal then return SOLUTION
  loop do
    if EMPTY?( Queue ) then return failure
    node ← POP( Queue ) /* chooses the shallowest node in Queue */
    add node to explored
    for each node do
      adjacent ← ADJACENT-NODE( node )
      if adjacent is not in explored or Queue then
        Queue ← INSERT( adjacent )
        if adjacent == goal then return SOLUTION
```

Breadth First Search

Queue = [A]
Explored = []
Is A a goal state?



function BREADTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Queue \leftarrow a FIFO queue with *source node* as the only element

explored \leftarrow an empty set

if *source node* == *goal* **then return** SOLUTION

loop do

if EMPTY?(*Queue*) **then return** failure

node \leftarrow POP(*Queue*) /* chooses the shallowest node in *Queue* */

add *node* to *explored*

for each *node* **do**

adjacent \leftarrow ADJACENT-NODE(*node*)

if *adjacent* is not in *explored* or *Queue* **then**

Queue \leftarrow INSERT(*adjacent*)

if *adjacent* == *goal* **then return** SOLUTION

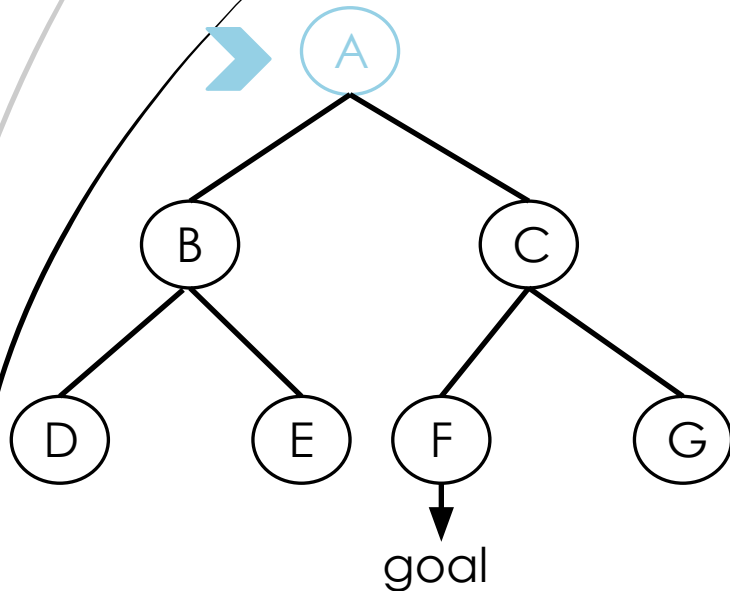
Breadth First Search

Queue = [A]

Explored = []

Queue = []

Explored = [A]



function BREADTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Queue \leftarrow a FIFO queue with *source node* as the only element

explored \leftarrow an empty set

if *source node* == *goal* **then return** SOLUTION

loop do

if EMPTY?(*Queue*) **then return** failure

node \leftarrow POP(*Queue*) /* chooses the shallowest node in *Queue* */

add *node* **to** *explored*

for each *node* **do**

adjacent \leftarrow ADJACENT-NODE(*node*)

if *adjacent* is not in *explored* or *Queue* **then**

Queue \leftarrow INSERT(*adjacent*)

if *adjacent* == *goal* **then return** SOLUTION

➤ Node

➤ Child

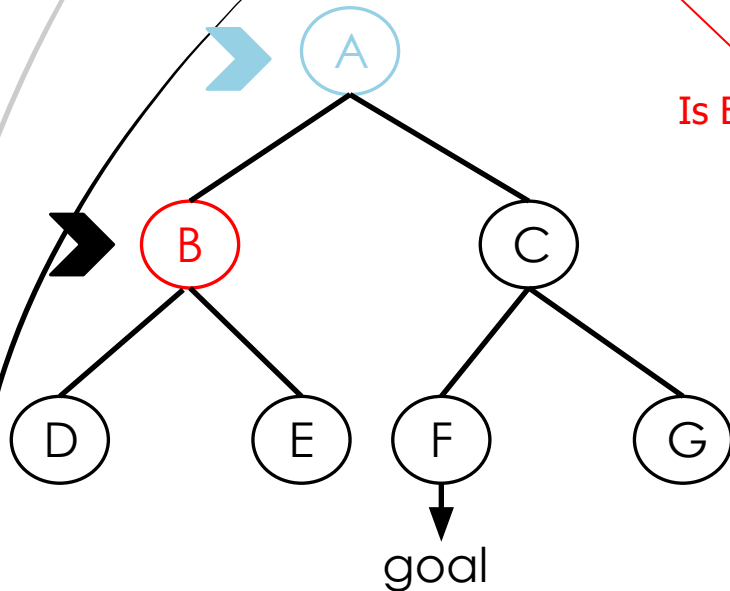
Breadth First Search

Queue = []

Explored = [A]

Queue = [B]

Explored = [A]



Is B a goal state?

function BREADTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Queue \leftarrow a FIFO queue with *source node* as the only element

explored \leftarrow an empty set

if *source node* == *goal* **then return** SOLUTION

loop do

if EMPTY?(*Queue*) **then return** failure

node \leftarrow POP(*Queue*) /* chooses the shallowest node in *Queue* */

add *node* **to** *explored*

for each *node* **do**

adjacent \leftarrow ADJACENT-NODE(*node*)

if *adjacent* is not in *explored* or *Queue* **then**

Queue \leftarrow INSERT(*adjacent*)

if *adjacent* == *goal* **then return** SOLUTION

Node

Child

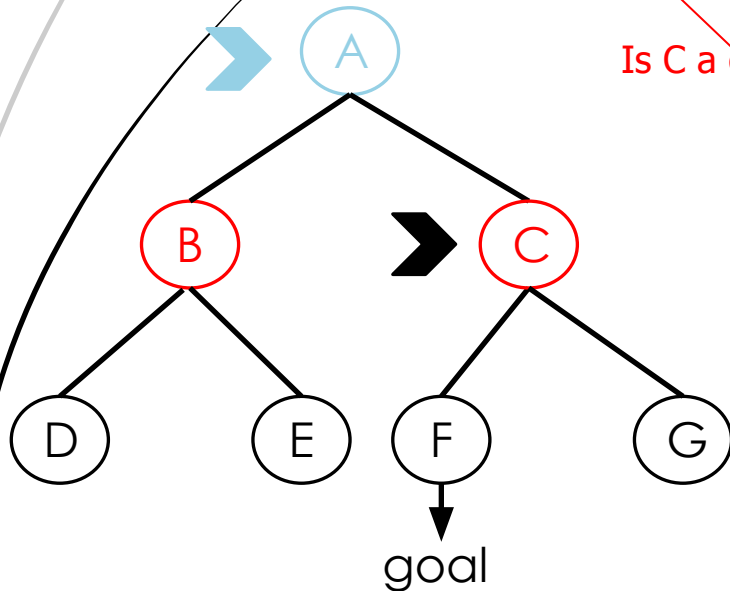
Breadth First Search

Queue = [B]

Explored = [A]

Queue = [B, C]

Explored = [A]



Is C a goal state?

function BREADTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Queue \leftarrow a FIFO queue with *source node* as the only element

explored \leftarrow an empty set

if *source node* == *goal* **then return** SOLUTION

loop do

if EMPTY?(*Queue*) **then return** failure

node \leftarrow POP(*Queue*) /* chooses the shallowest node in *Queue* */

add *node* **to** *explored*

for each *node* **do**

adjacent \leftarrow ADJACENT-NODE(*node*)

if *adjacent* is not in *explored* or *Queue* **then**

Queue \leftarrow INSERT(*adjacent*)

if *adjacent* == *goal* **then return** SOLUTION

Node

Child

Breadth First Search

Queue = [B, C]

Explored = [A]

Queue = [C]

Explored = [A, B]

function BREADTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Queue ← a FIFO queue with *source node* as the only element

explored ← an empty set

if *source node* == *goal* **then return** SOLUTION

loop do

if EMPTY?(*Queue*) **then return** failure

node ← POP(*Queue*) /* chooses the shallowest node in *Queue* */

add *node* to *explored*

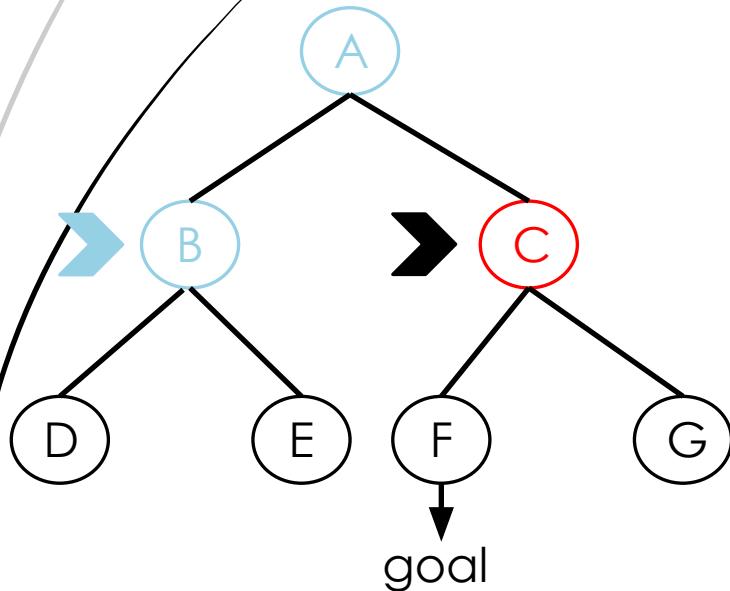
for each *node* **do**

adjacent ← ADJACENT-NODE(*node*)

if *adjacent* is not in *explored* or *Queue* **then**

Queue ← INSERT(*adjacent*)

if *adjacent* == *goal* **then return** SOLUTION



Breadth First Search

Queue = [C]

Explored = [A, B]

Queue = [C, D]

Explored = [A, B]

function BREADTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Queue \leftarrow a FIFO queue with *source node* as the only element

explored \leftarrow an empty set

if *source node* == *goal* **then return** SOLUTION

loop do

if EMPTY?(*Queue*) **then return** failure

node \leftarrow POP(*Queue*) /* chooses the shallowest node in *Queue* */

add *node* **to** *explored*

for each *node* **do**

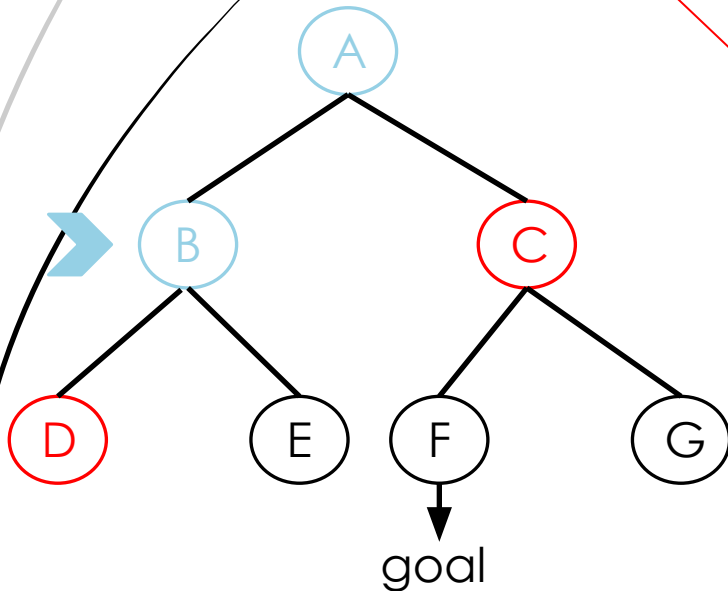
adjacent \leftarrow ADJACENT-NODE(*node*)

if *adjacent* is not in *explored* or *Queue* **then**

Queue \leftarrow INSERT(*adjacent*)

if *adjacent* == *goal* **then return** SOLUTION

Is D a goal state?



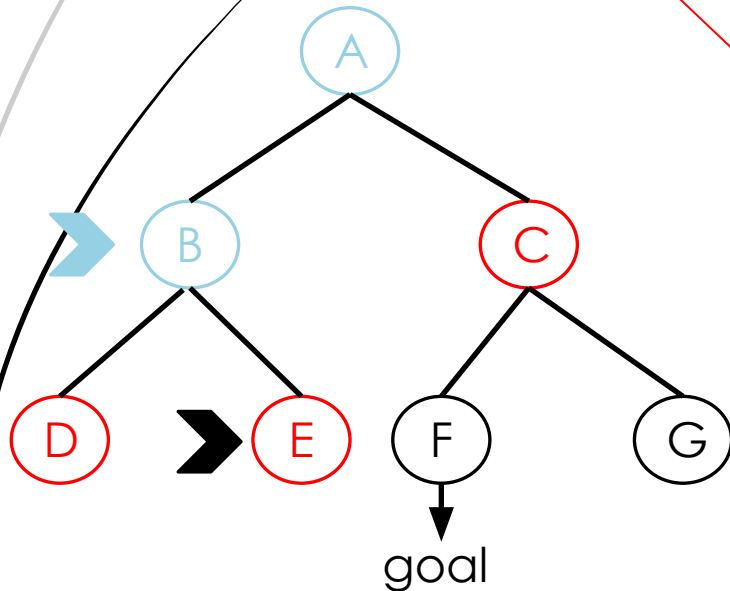
Node

Child

Breadth First Search

Queue = [C, D]
Explored = [A, B]

Queue = [C, D, E]
Explored = [A, B]



function BREADTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Queue \leftarrow a FIFO queue with *source node* as the only element

explored \leftarrow an empty set

if *source node* == *goal* **then return** SOLUTION

loop do

if EMPTY?(*Queue*) **then return** failure

node \leftarrow POP(*Queue*) /* chooses the shallowest node in *Queue* */

add *node* **to** *explored*

for each *node* **do**

adjacent \leftarrow ADJACENT-NODE(*node*)

if *adjacent* is not in *explored* or *Queue* **then**

Queue \leftarrow INSERT(*adjacent*)

if *adjacent* == *goal* **then return** SOLUTION

Is E a goal state?

➡ Nod
➡ e
➡ Chil
d

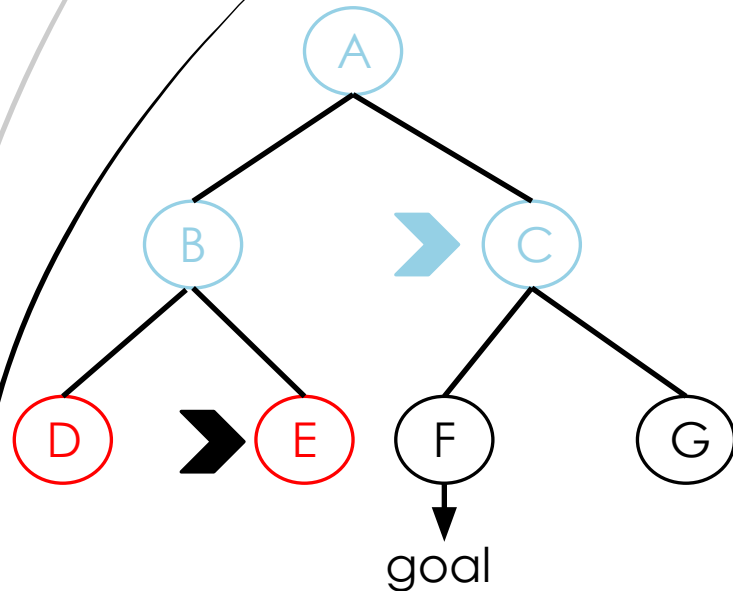
Breadth First Search

Queue = [C, D, E]

Explored = [A, B]

Queue = [D, E]

Explored = [A, B, C]



function BREADTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Queue ← a FIFO queue with *source node* as the only element

explored ← an empty set

if *source node* == *goal* **then return** SOLUTION

loop do

if EMPTY?(*Queue*) **then return** failure

node ← POP(*Queue*) /* chooses the shallowest node in *Queue* */

add *node* **to** *explored*

for each *node* **do**

adjacent ← ADJACENT-NODE(*node*)

if *adjacent* is not in *explored* or *Queue* **then**

Queue ← INSERT(*adjacent*)

if *adjacent* == *goal* **then return** SOLUTION

➤ Node

➤ Child

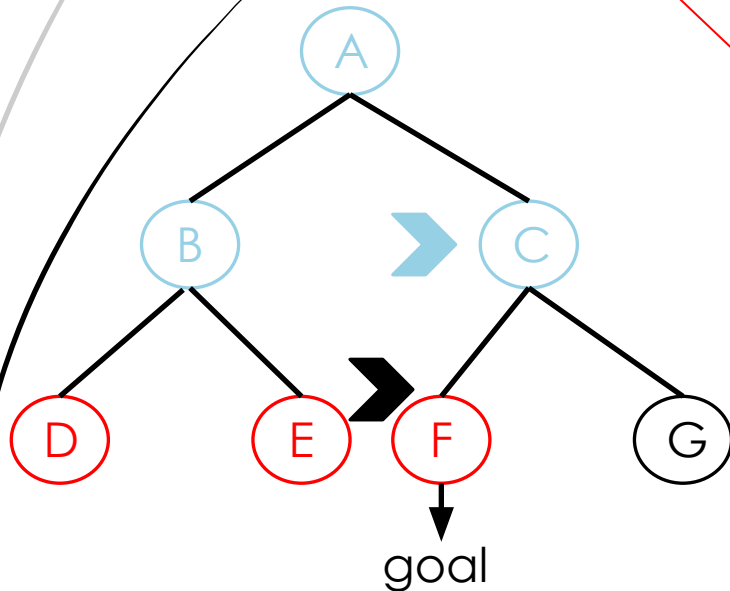
Breadth First Search

Queue = [D, E]

Explored = [A, B, C]

Queue = [D, E, F]

Explored = [A, B, C]



function BREADTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Queue ← a FIFO queue with *source node* as the only element

explored ← an empty set

if *source node* == *goal* **then** **return** SOLUTION

loop do

if EMPTY?(*Queue*) **then** **return** failure

node ← POP(*Queue*) /* chooses the shallowest node in *Queue* */

add *node* **to** *explored*

for each *node* **do**

adjacent ← ADJACENT-NODE(*node*)

if *adjacent* is not in *explored* or *Queue* **then**

Queue ← INSERT(*adjacent*)

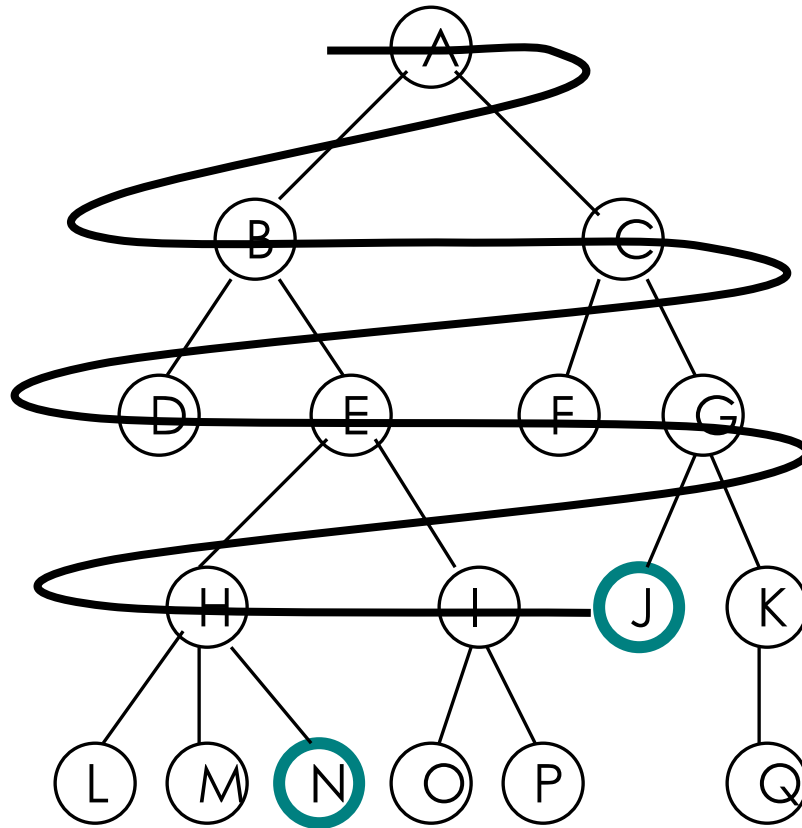
if *adjacent* == *goal* **then** **return** SOLUTION

Is F a goal state?

➤ Nod

➤ Chil
d

BFS: Summary





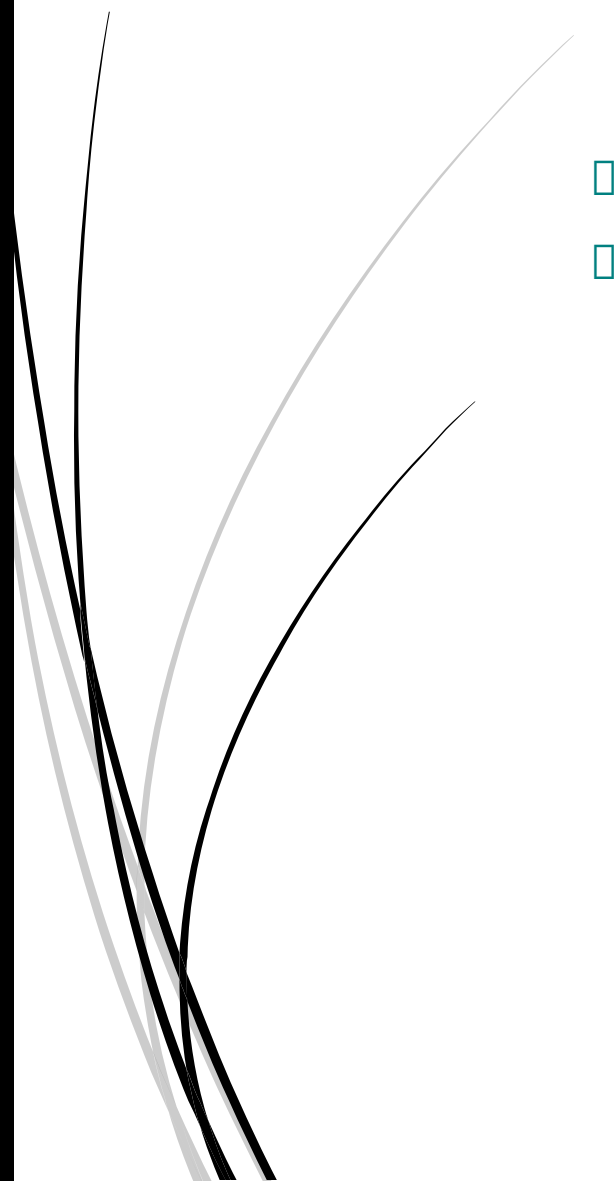
BFS: Completeness

- Completeness: Yes (guaranteed to find a solution if there exists one)
- if the shallowest goal node is at some **finite depth d** , breadth-first search will eventually find it after generating all shallower nodes (provided the branching factor **b is finite**) .

the branching factor is the number of children at each node, the outdegree.



BFS: Optimal?

- ❑ Not necessarily optimal
 - ❑ Only optimal if every action has same cost.
- 

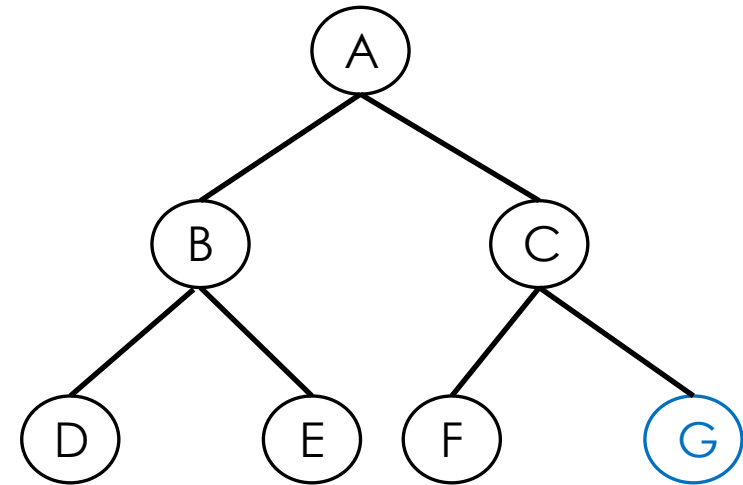
BFS: Time Complexity?

- ❑ Worst complexity is when G is a goal state.
- ❑ In this case, total number of nodes generated is

$$b + b^2 + b^3 + \dots + b^d = O(b^d)$$

(The d^{th} layer contains nodes much larger than all the nodes in previous layers combined!)

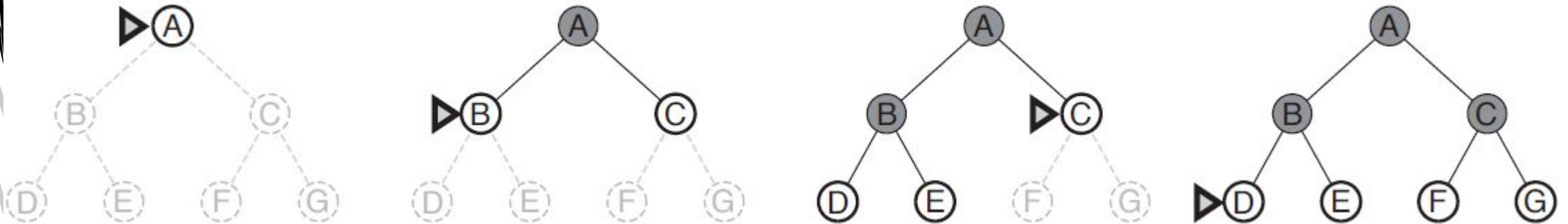
So the time complexity is $O(b^d)$

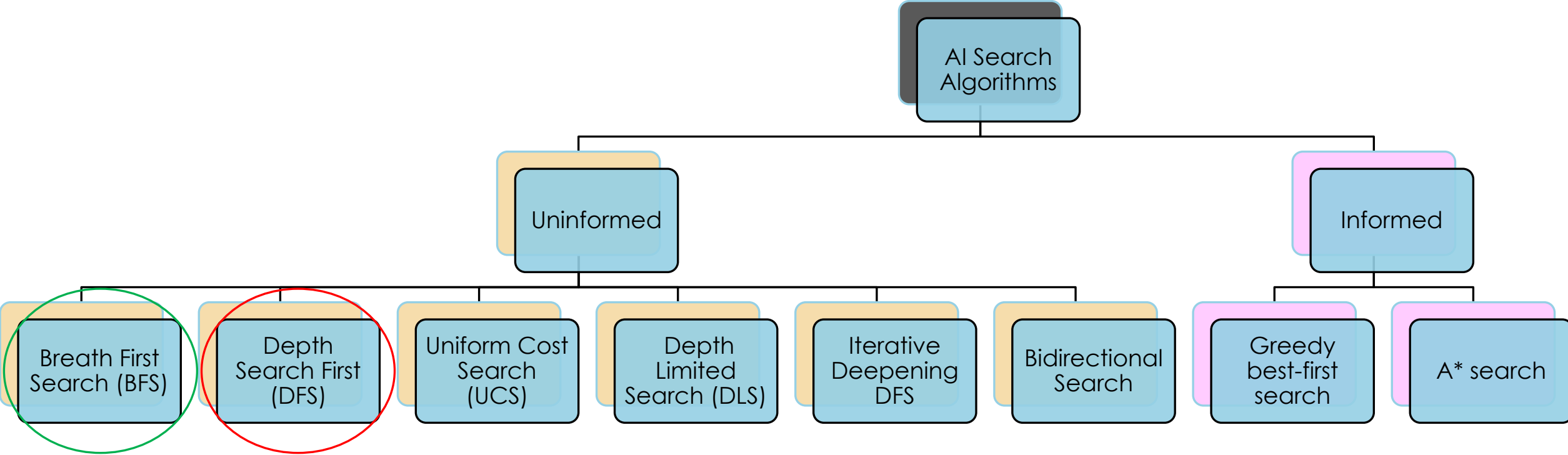


A binary tree, $b=2$,
 $d=2$

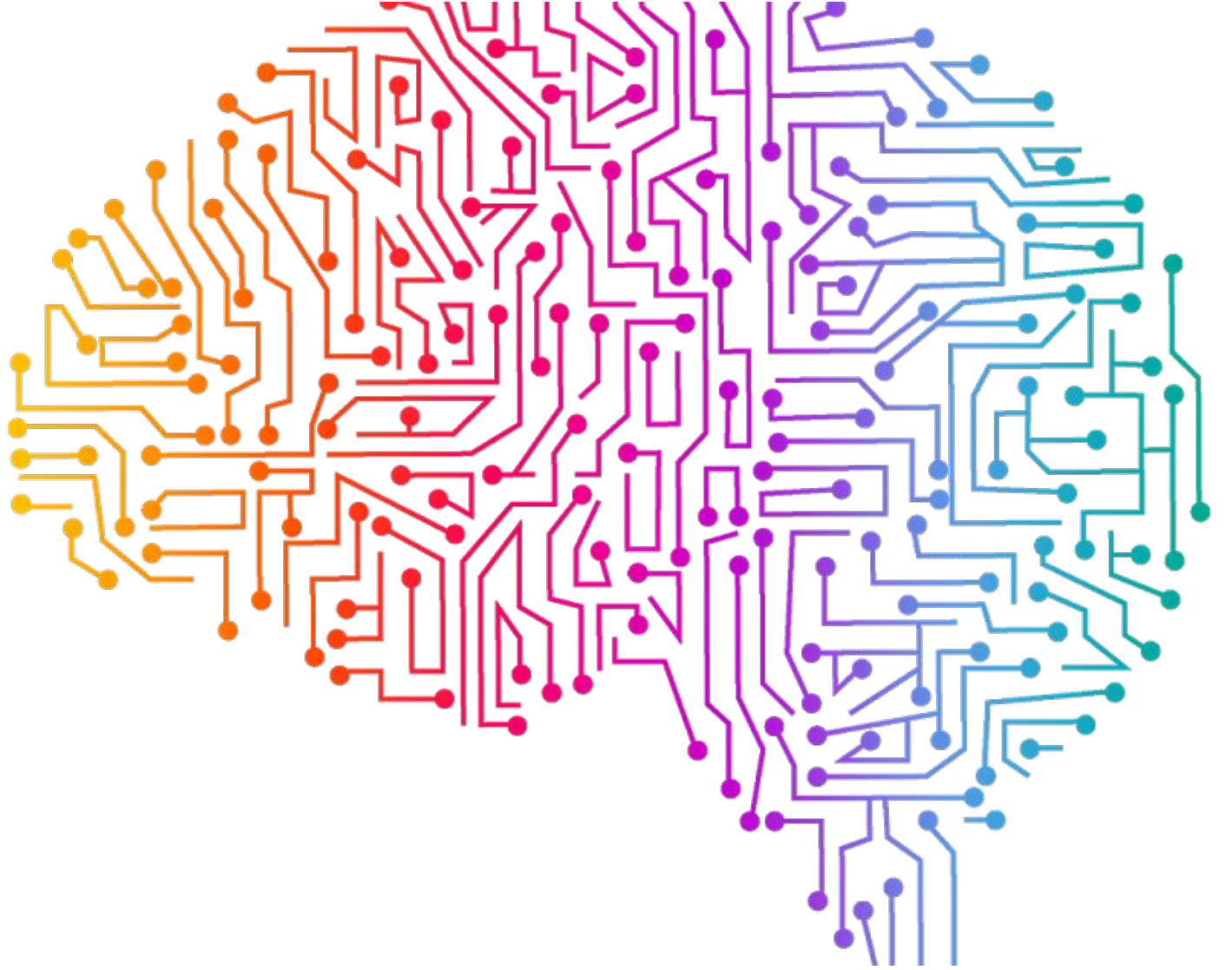
BFS: Space Complexity?

- There will be $O(b^{d-1})$ nodes in the explored set and $O(b^d)$ nodes in the queue.
- So the space complexity is $O(b^d)$, i.e., it is dominated by the size of the queue.
- Exponential time complexity can be accepted but exponential space complexity is BAD !





Depth First Search (DFS)

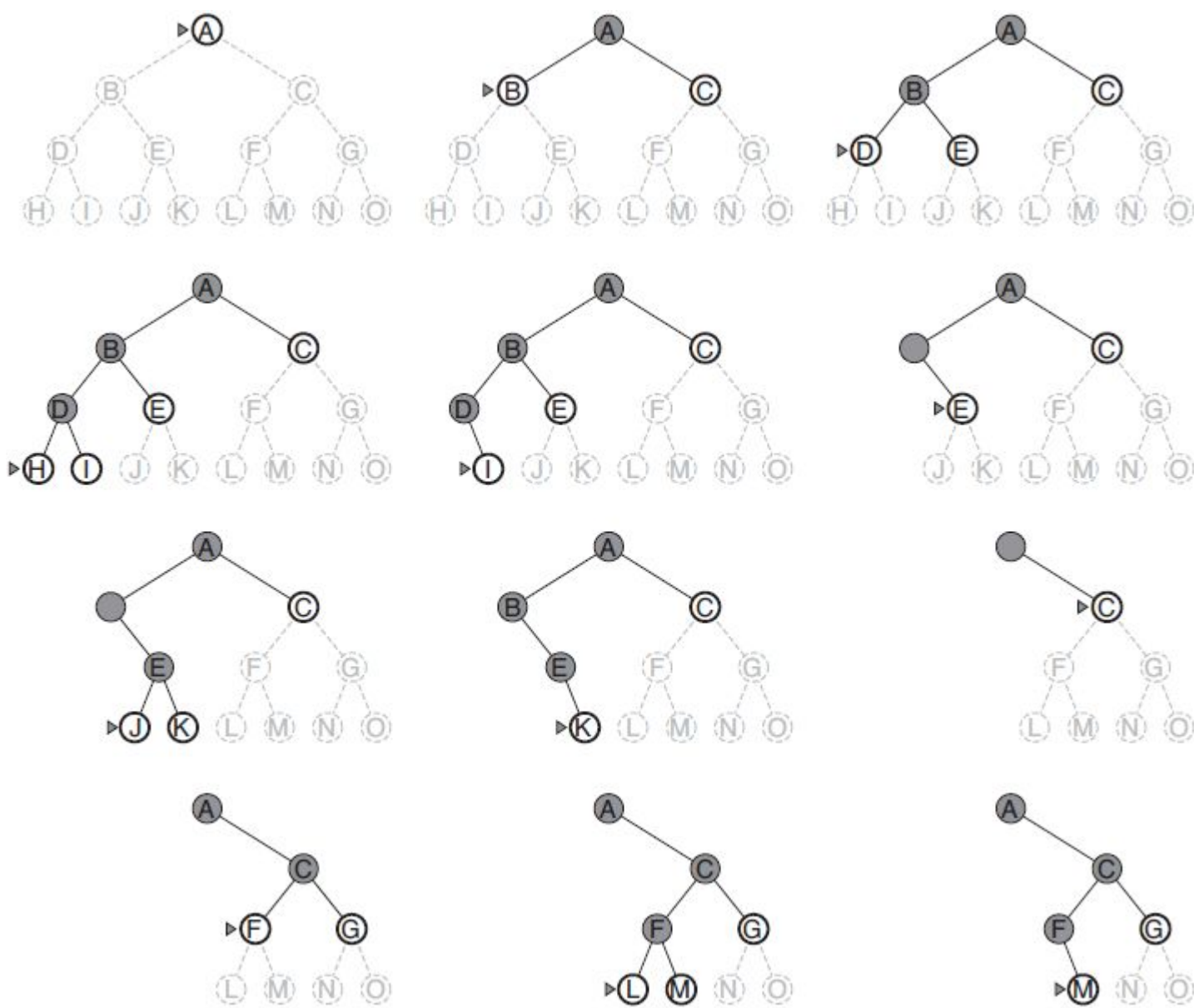




Depth First Search



- It works vertically.
- It doesn't generate a solution always.
- It involves exhaustive searches of all the nodes by going ahead, if possible, else by backtracking.
- Here, the word backtrack means that when you are moving forward and there are no more nodes along the current path, you move backward on the same path to find nodes to traverse.



M is the goal node

Depth First Search

- Expand Depth Node First
(Depth First Search)
- *Stack*: nodes in the stack to be explored
- *explored*: Nodes that are already explored
- *Stack* is a Last-in-first-out (LIFO) queue.

function DEPTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Stack \leftarrow a LIFO with *source node* as the only element

explored \leftarrow an empty set

loop do

if EMPTY?(*Stack*) **then return** failure

node \leftarrow POP(*Stack*) /* chooses the top node in *Stack* */

 add *node* to *explored*

if *node* == *goal* **then return** SOLUTION

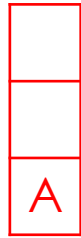
for all adjacent node (*n*) of *node*

if *n* is not in *explored* or *Stack* **then**

Stack \leftarrow INSERT(*n*)

Depth First Search

Stack =



Explored = []

function DEPTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Stack \leftarrow a LIFO with *source node* as the only element

explored \leftarrow an empty set

loop do

if EMPTY?(*Stack*) **then return** failure

node \leftarrow POP(*Stack*) /* chooses the top node in *Stack* */

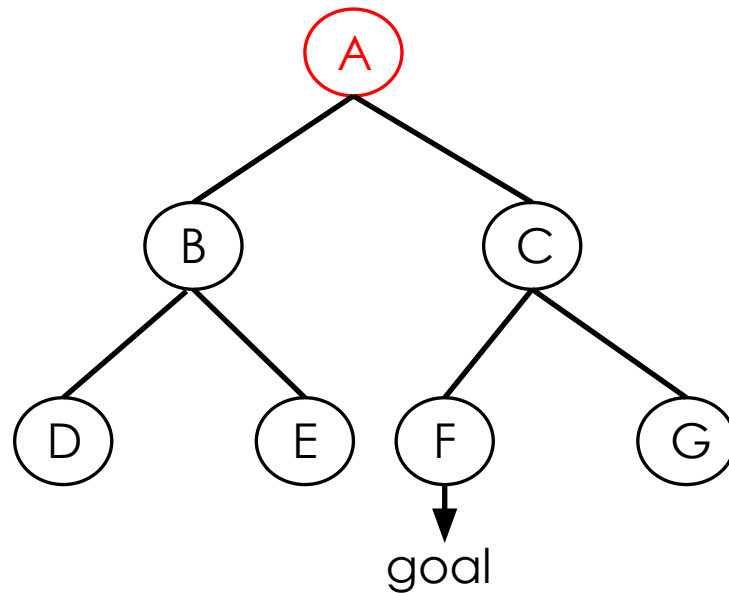
add *node* to *explored*


if *node* == *goal* **then return** SOLUTION

for all adjacent node (*n*) of *node*

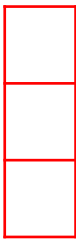
if *n* is not in *explored* or *Stack* **then**

Stack \leftarrow INSERT(*n*)



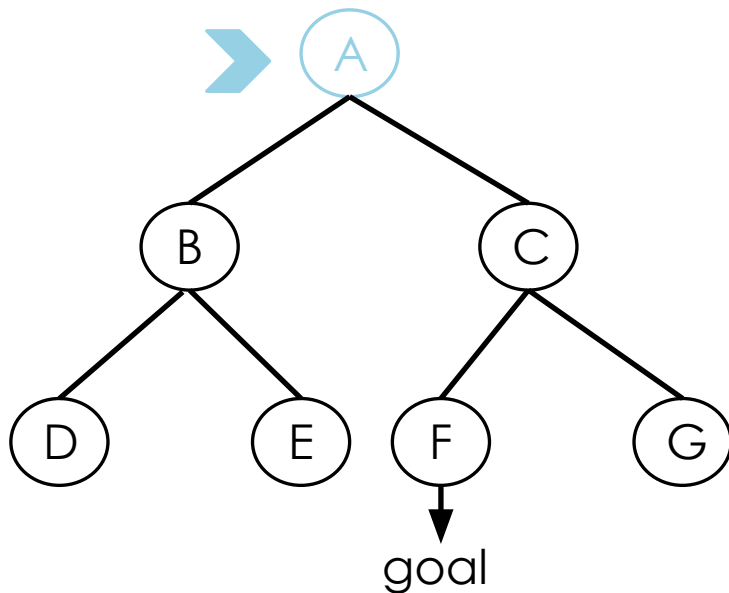
Stack = 

Explored = []

Stack = 

Is A a goal state?

Explored = [A]



function DEPTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Stack \leftarrow a LIFO with *source node* as the only element

explored \leftarrow an empty set

loop do

if EMPTY?(*Stack*) **then return** failure

node \leftarrow POP(*Stack*) /* chooses the top node in *Stack* */

add *node* to *explored*

if *node* == *goal* **then return** SOLUTION

for all adjacent node (*n*) of *node*


if *n* is not in *explored* or *Stack* **then**

Stack \leftarrow INSERT(*n*)

 Nod


 Chil
d

Stack =

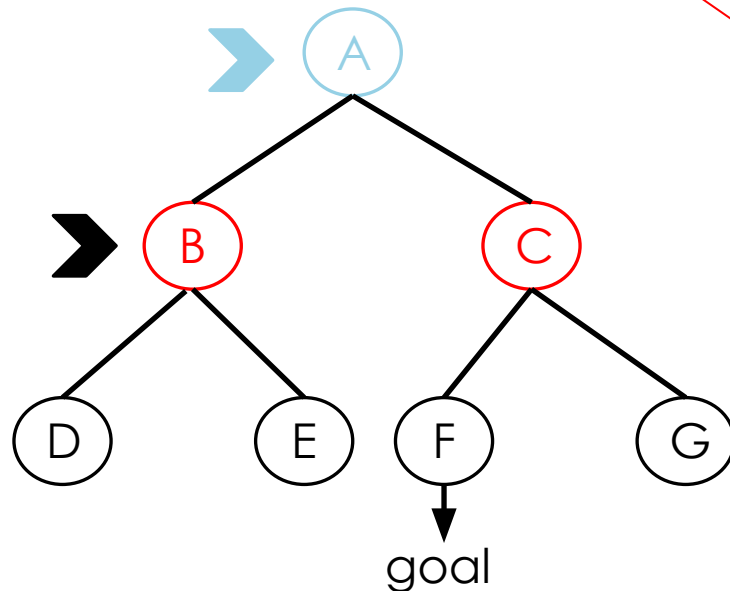


Explored = [A]

Stack =



Explored = [A]



function DEPTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Stack \leftarrow a LIFO with *source node* as the only element

explored \leftarrow an empty set

loop do

if EMPTY?(*Stack*) **then return** failure

node \leftarrow POP(*Stack*) /* chooses the top node in *Stack* */

 add *node* to *explored*

if *node* == *goal* **then return** SOLUTION

for all adjacent node (*n*) of *node*

if *n* is not in *explored* or *Stack* **then**

Stack \leftarrow INSERT(*n*)

➤ Nod

➤ e
Chil
d

Stack =

| |
|---|
| |
| B |
| C |

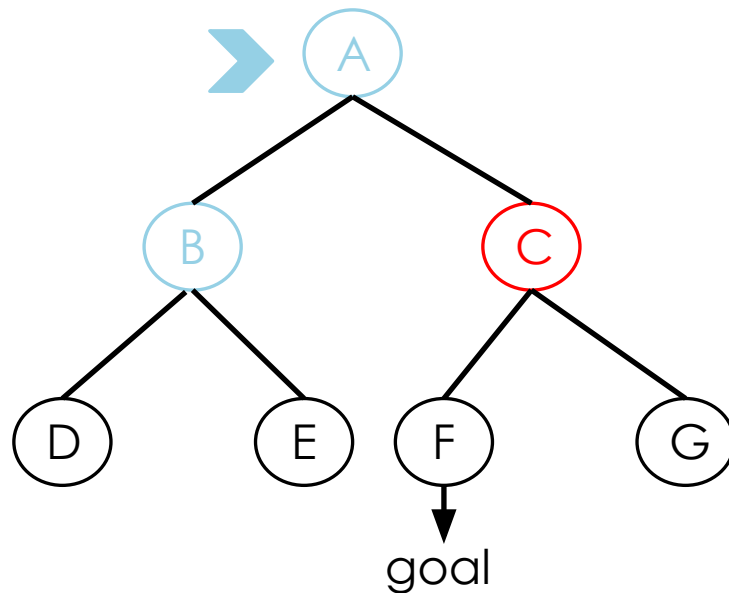
Explored = [A]

Stack =

| |
|---|
| |
| |
| C |

Is B a goal state?

Explored = [A, B]



function DEPTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Stack \leftarrow a LIFO with *source node* as the only element

explored \leftarrow an empty set

loop do

if EMPTY?(*Stack*) **then return** failure

node \leftarrow POP(*Stack*) /* chooses the top node in *Stack* */

add *node* to *explored*

if *node* == *goal* **then return** SOLUTION

for all adjacent node (*n*) of *node*

if *n* is not in *explored* or *Stack* **then**

Stack \leftarrow INSERT(*n*)

➤ Node

➤ Child

Stack =

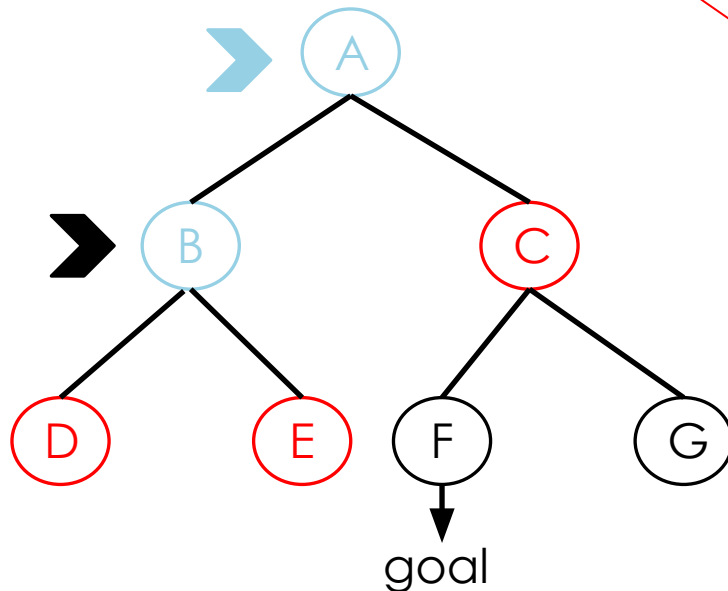
| |
|---|
| |
| |
| C |

Explored = [A, B]

Stack =

| |
|---|
| D |
| E |
| C |

Explored = [A, B]



function DEPTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Stack \leftarrow a LIFO with *source node* as the only element

explored \leftarrow an empty set

loop do

if EMPTY?(*Stack*) **then return** failure

node \leftarrow POP(*Stack*) /* chooses the top node in *Stack* */

 add *node* to *explored*

if *node* == *goal* **then return** SOLUTION

for all adjacent node (*n*) of *node*

if *n* is not in *explored* or *Stack* **then**

Stack \leftarrow INSERT(*n*)

Stack =

| |
|---|
| D |
| E |
| C |

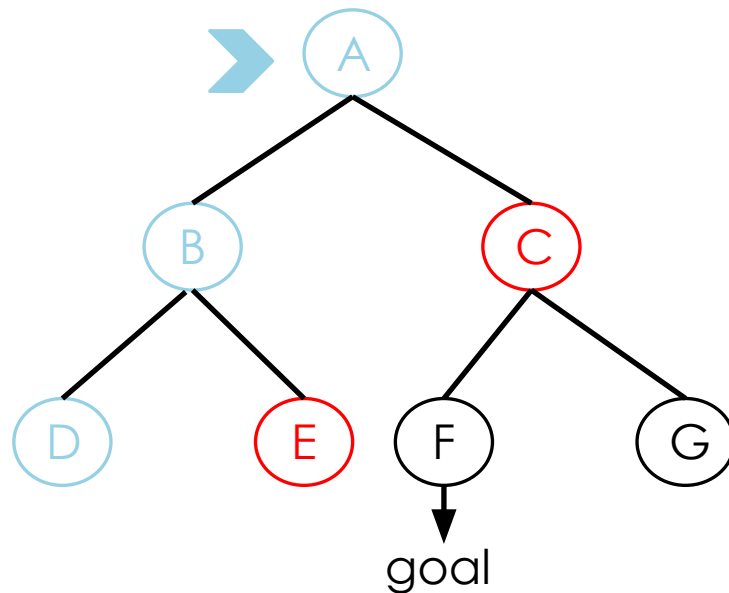
Explored = [A, B]

Stack =

| |
|---|
| |
| E |
| C |

Is D a goal state?

Explored = [A, B, D]



function DEPTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Stack \leftarrow a LIFO with *source node* as the only element

explored \leftarrow an empty set

loop do

if EMPTY?(*Stack*) **then return** failure

node \leftarrow POP(*Stack*) /* chooses the top node in *Stack* */

add *node* to *explored*

if *node* == *goal* **then return** SOLUTION

for all adjacent node (*n*) of *node*

if *n* is not in *explored* or *Stack* **then**

Stack \leftarrow INSERT(*n*)

➡ Node

➡ Child

Stack =

| |
|---|
| |
| E |
| C |

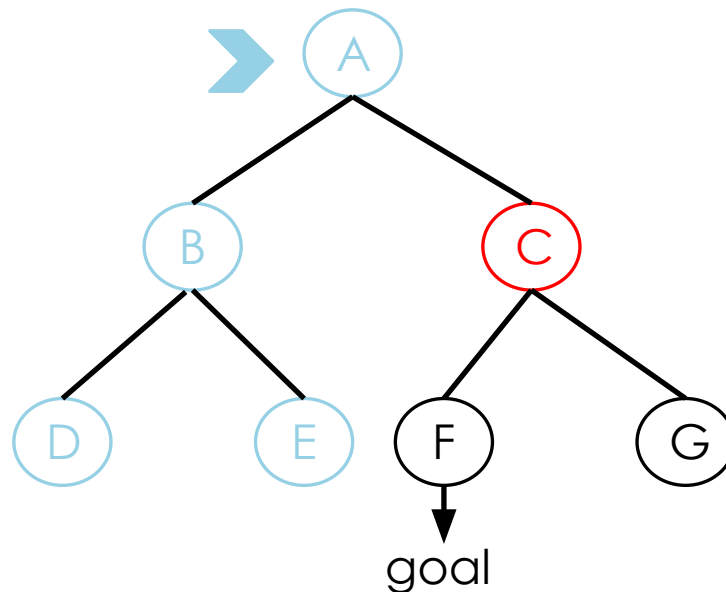
Explored = [A, B, D]

Stack =

| |
|---|
| |
| |
| C |

Is E a goal state?

Explored = [A, B, D, E]



function DEPTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Stack ← a LIFO with *source node* as the only element

explored ← an empty set

loop do

if EMPTY?(*Stack*) **then return** failure

node ← POP(*Stack*) /* chooses the top node in *Stack* */

add *node* **to** *explored*

if *node* == *goal* **then return** SOLUTION


for all adjacent node (*n*) of *node*

if *n* is not in *explored* or *Stack* **then**


Stack ← INSERT(*n*)

➤ Nod

➤^e Chil
d

Stack = 

Explored = [A, B, D, E]

Stack = 

Is C a goal state?

Explored = [A, B, D, E, C]

function DEPTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Stack \leftarrow a LIFO with *source node* as the only element

explored \leftarrow an empty set

loop do

if EMPTY?(*Stack*) **then return** failure

node \leftarrow POP(*Stack*) /* chooses the top node in *Stack* */

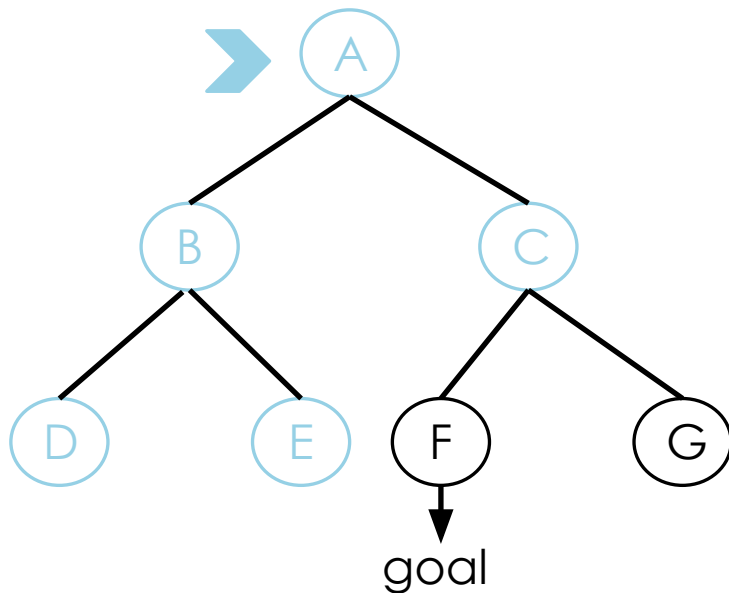
add *node* to *explored*

if *node* == *goal* **then return** SOLUTION

for all adjacent node (*n*) of *node*


if *n* is not in *explored* or *Stack* **then**

Stack \leftarrow INSERT(*n*)




 Nod
 Chil
d

Stack =

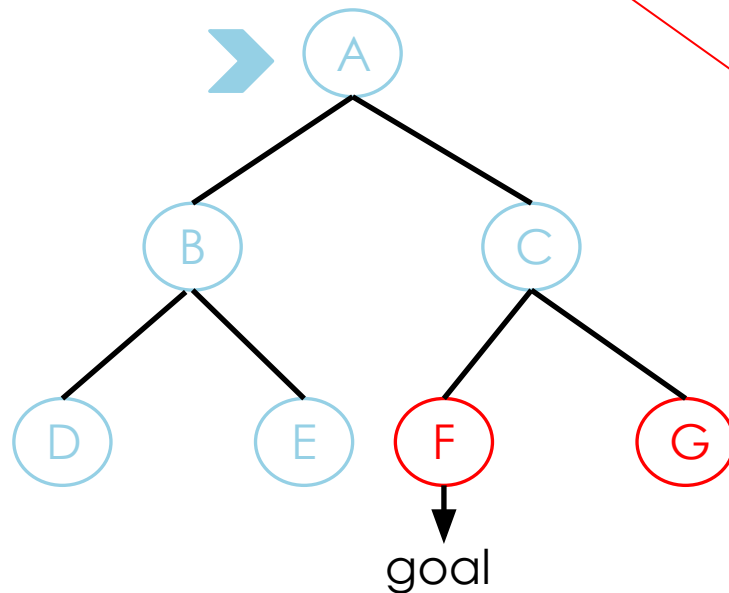


Explored = [A, B, D, E, C]

Stack =



Explored = [A, B, D, E, C]



function DEPTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Stack \leftarrow a LIFO with *source node* as the only element

explored \leftarrow an empty set

loop do

if EMPTY?(*Stack*) **then return** failure

node \leftarrow POP(*Stack*) /* chooses the top node in *Stack* */

add *node* to *explored*

if *node* == *goal* **then return** SOLUTION

for all adjacent node (*n*) of *node*

if *n* is not in *explored* or *Stack* **then**

Stack \leftarrow INSERT(*n*)

➤ Nod

➤^e Chil
d

Stack =

| |
|---|
| |
| F |
| G |

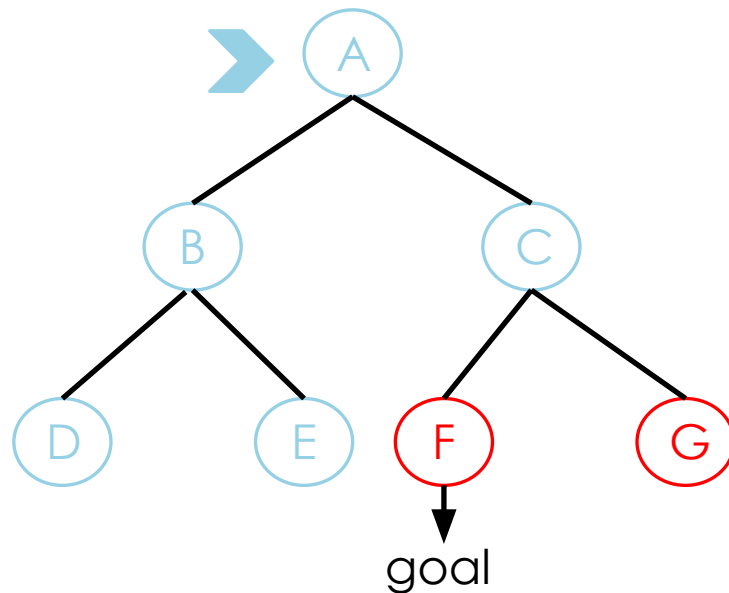
Explored = [A, B, D, E, C]

Stack =

| |
|---|
| |
| |
| G |

Is F a goal state?

Explored = [A, B, D, E, C, F]



function DEPTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

Stack \leftarrow a LIFO with *source node* as the only element

explored \leftarrow an empty set

loop do

if EMPTY?(*Stack*) **then return** failure

node \leftarrow POP(*Stack*) /* chooses the top node in *Stack* */

add *node* to *explored*

if *node* == *goal* **then return** SOLUTION

for all adjacent node (*n*) of *node*

if *n* is not in *explored* or *Stack* **then**

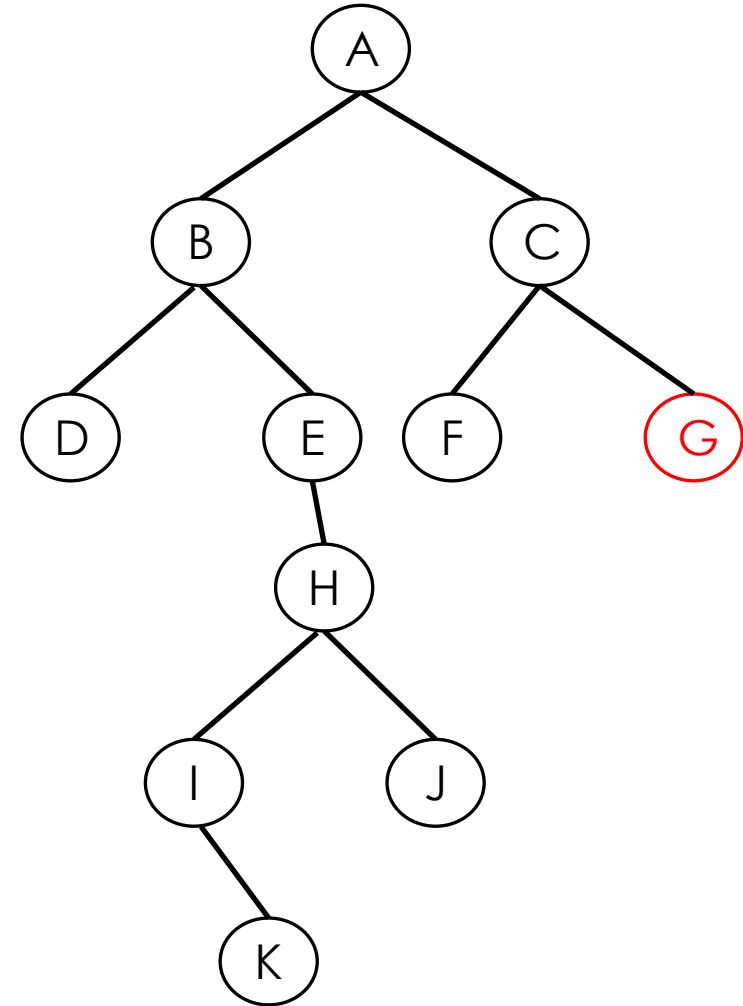
Stack \leftarrow INSERT(*n*)

➤ Nod

➤^e Chil
d

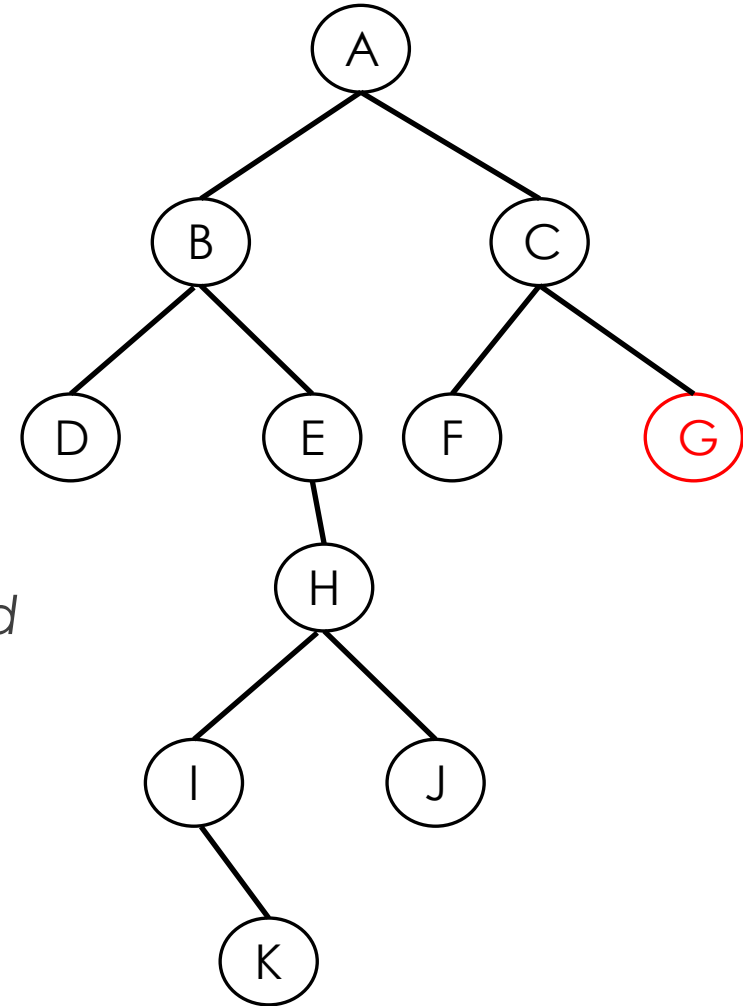
Completeness?

- Goal, G is at depth, $d=2$
- Max depth of tree, $m = 5$
- DFS is complete ONLY if m is finite



Time Complexity

- Number of nodes visited? $O(b^m)$
- For BFS, remember it was $O(b^d)$
- DFS is terrible if m is much larger than d
 - but if solutions are dense (goal is at K instead of G), DFS is faster than BFS.

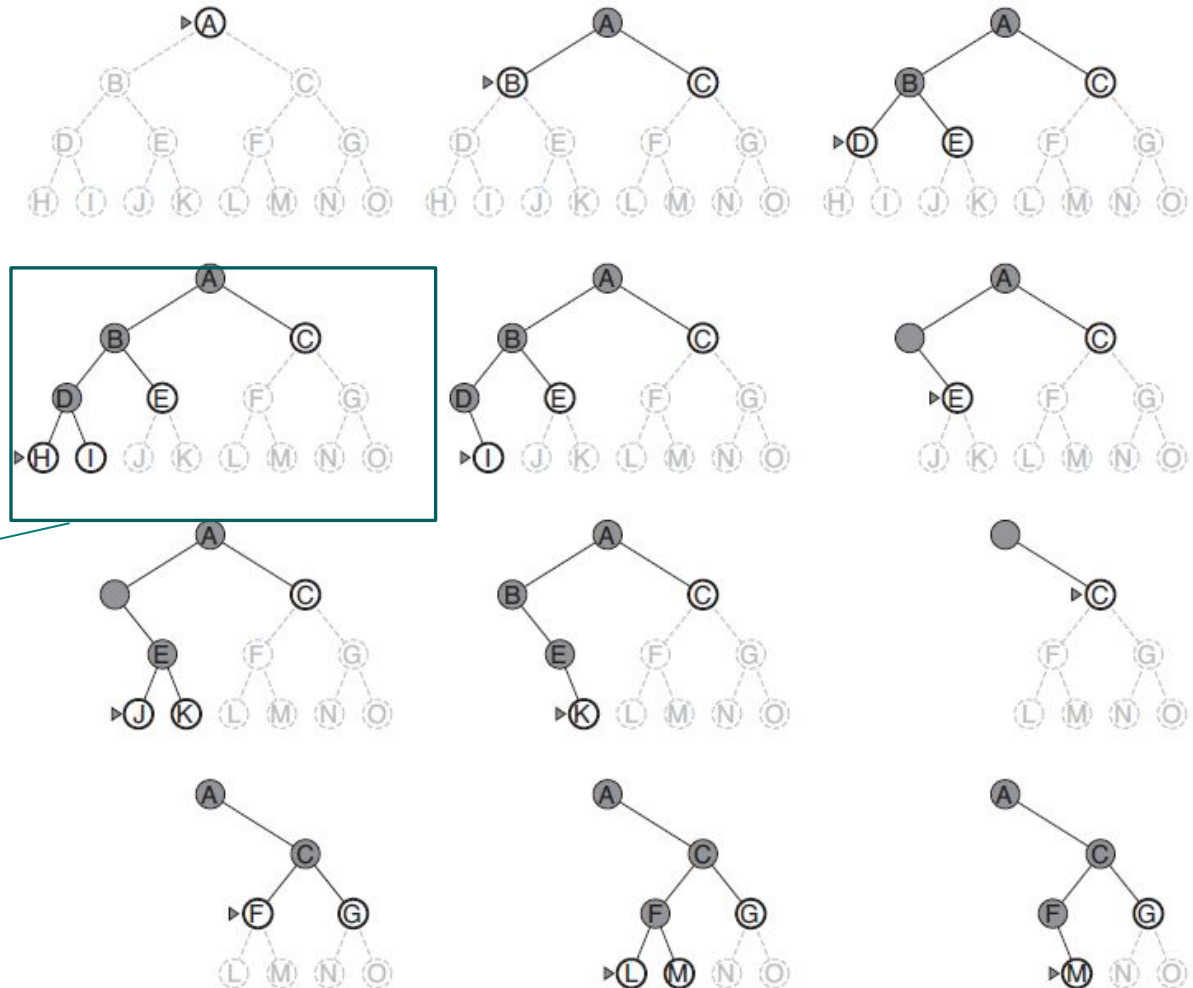


Space Complexity?

□ $O(bm)$, i.e., linear space!

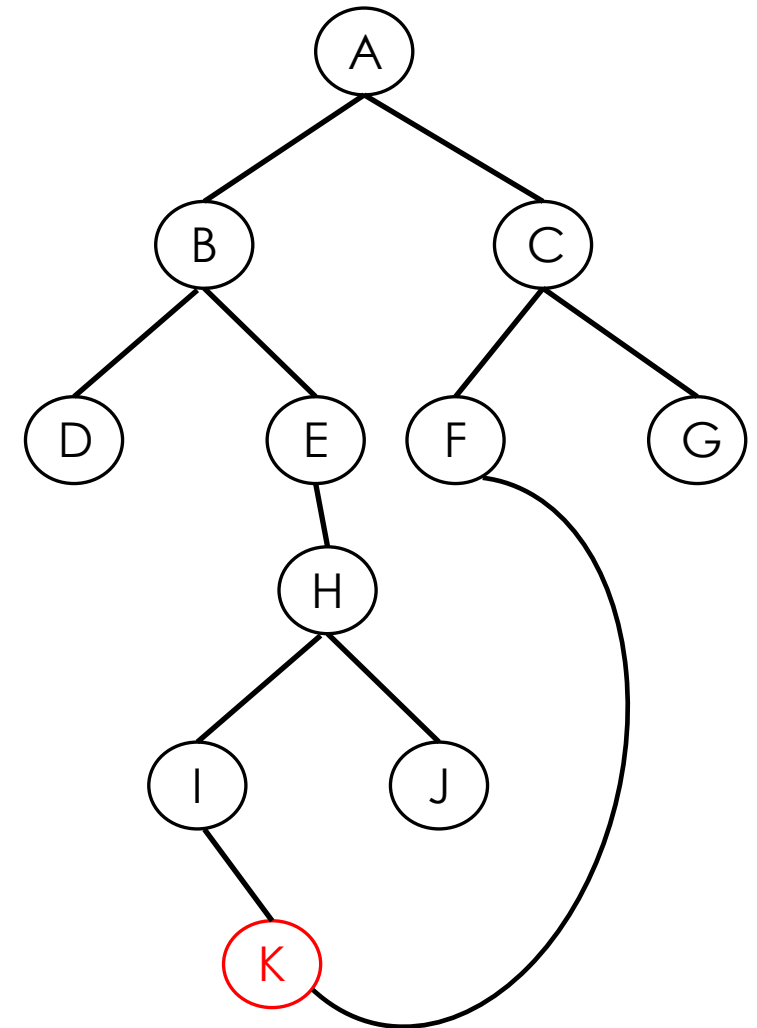
(we only need to remember a single path + expanded unexplored nodes)

□ $O(bm)$? E.g. $m=3$, $b=2$ (we need to save max of $3*2=6$ nodes in memory)



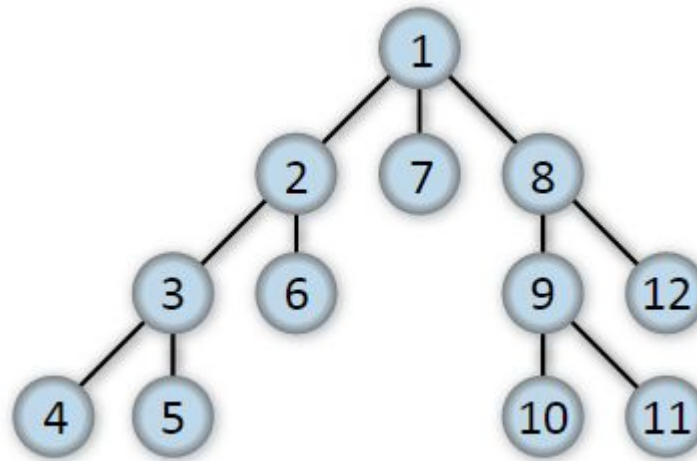
Optimal?

- Remember BFS was optimal if each step has same cost.
- Even if this is the case, DFS is not guaranteed to find the optimum path to the goal.
- For the graph on the right, BFS will return optimal path but DFS won't (assuming each step has same cost)



Class Activity

- Find the Goal Node 9 with the help of DFS using Stack.





Difference between BFS and DFS

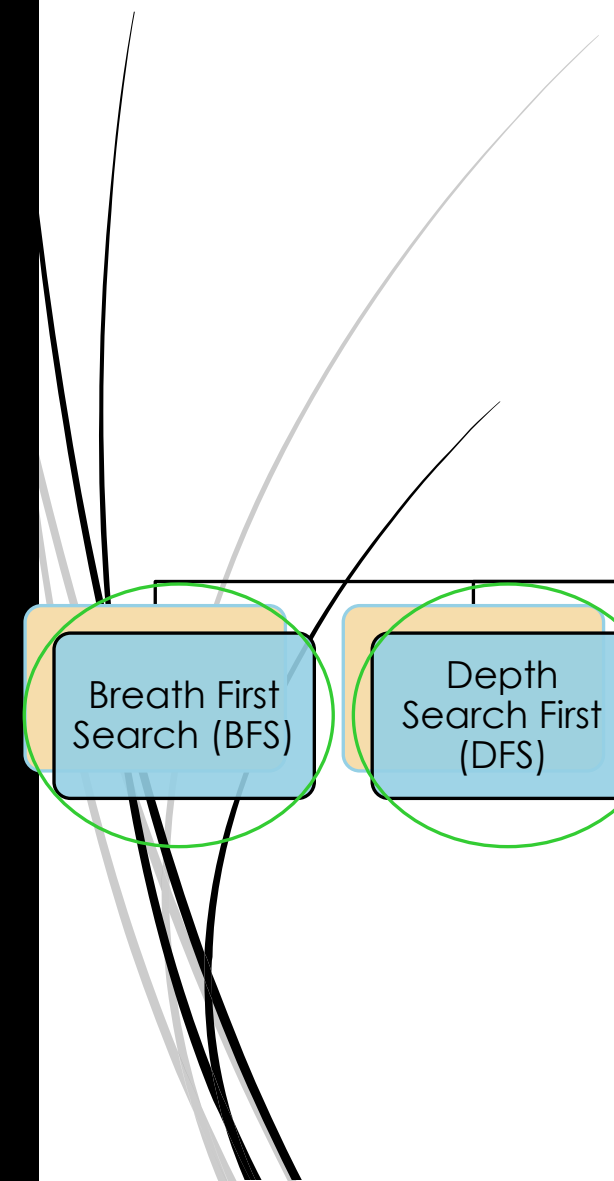


BFS

- ❑ Visit nodes level by level.
- ❑ Uses Queue data structure.
- ❑ May give an optimal solution.
- ❑ Slower, need more memory.

DFS

- ❑ Visit nodes graph depth-wise.
- ❑ Uses Stack data structure.
- ❑ Do not guarantee an optimal solution.
- ❑ Faster, need less memory.



AI Search Algorithms

Uninformed

Informed

Breath First Search (BFS)

Depth Search First (DFS)

Uniform Cost Search (UCS)

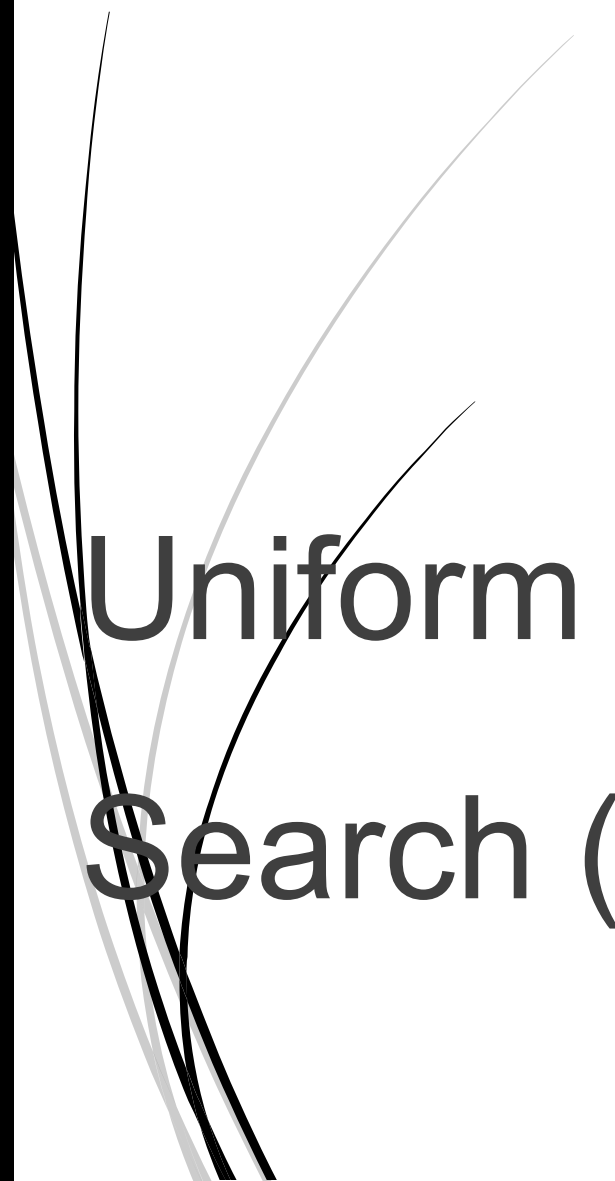

Depth Limited Search (DLS)

Iterative Deepening DFS

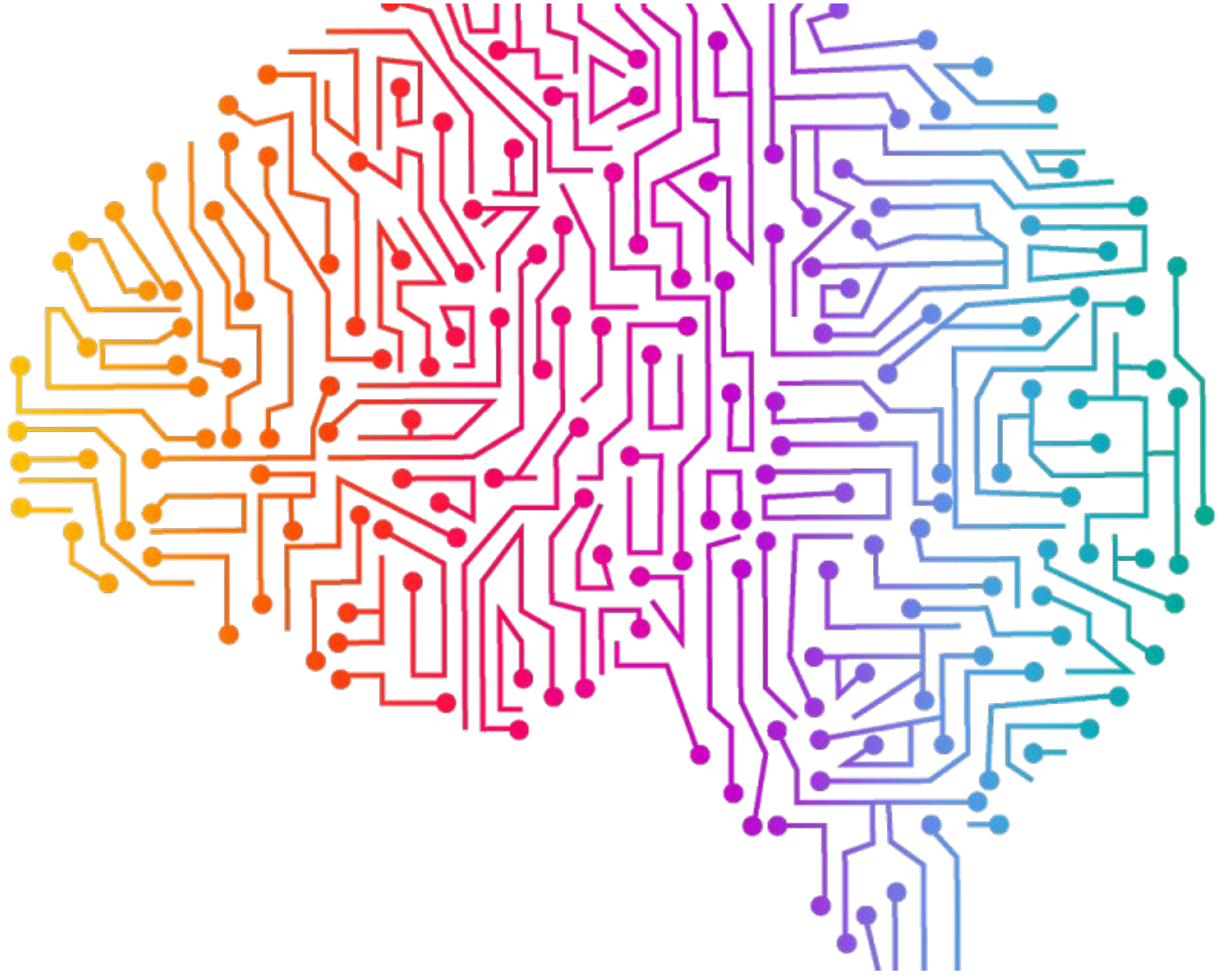
Bidirectional Search

Greedy best-first search

A* search



Uniform Cost Search (UCS)



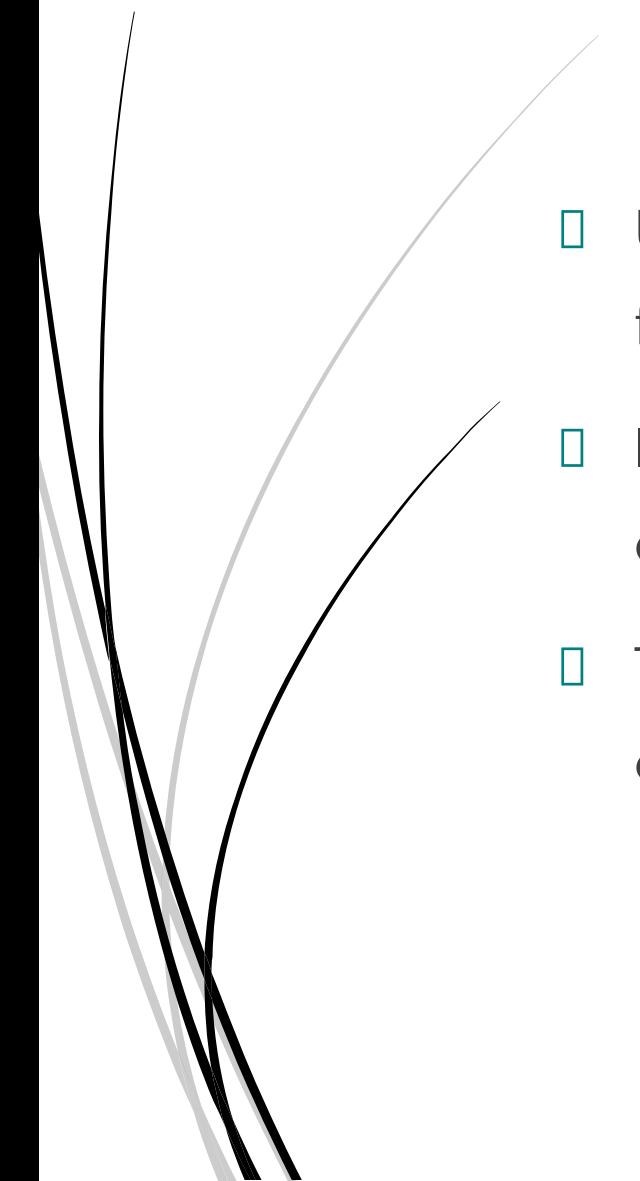


Uniform Cost Search (UCS) --- How it is different from BFS and DFS

- ❑ In contrast to BFS and DFS algorithms that don't take into consideration either the cost between two nodes, the UCS algorithm uses the path's cost from the initial node to the current node as the extension criterion.
- ❑ Starting from the initial state (starting node), the UCS algorithm, in each step chooses the node that is closer to the initial node.
- ❑ When the algorithm finds the solution, returns the path from the initial state to the final state.
- ❑ The UCS algorithm is characterized as complete, as it always returns a solution if exists.
- ❑ Moreover, the UCS algorithm guarantees the optimum solution.

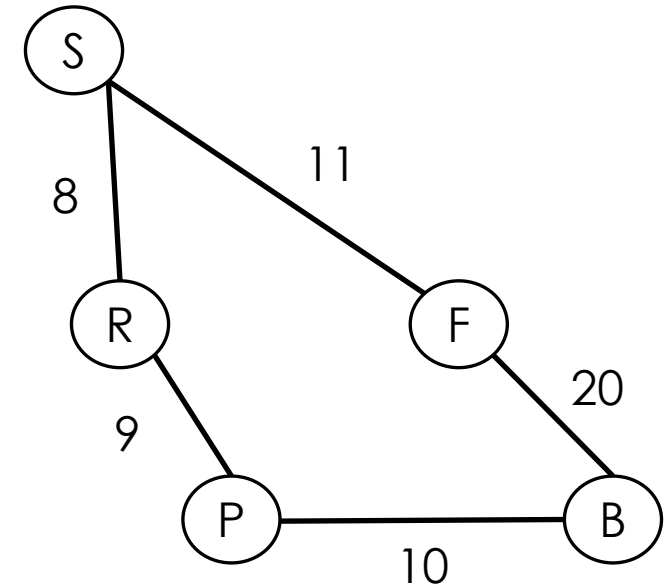


Uniform Cost Search (UCS)

- Uniform cost search modifies BFS such that it works with any cost function.
 - Instead of expanding the shallowest node, uniform-cost search expands the node n with the lowest path cost.
 - This is done by storing the opened list as a priority queue ordered by cost.
- 

Uniform Cost Search (UCS)

- Expand Node with lowest path cost
- *Opened*: a *priority queue* ordered by path cost
- *explored*: Nodes that are already explored

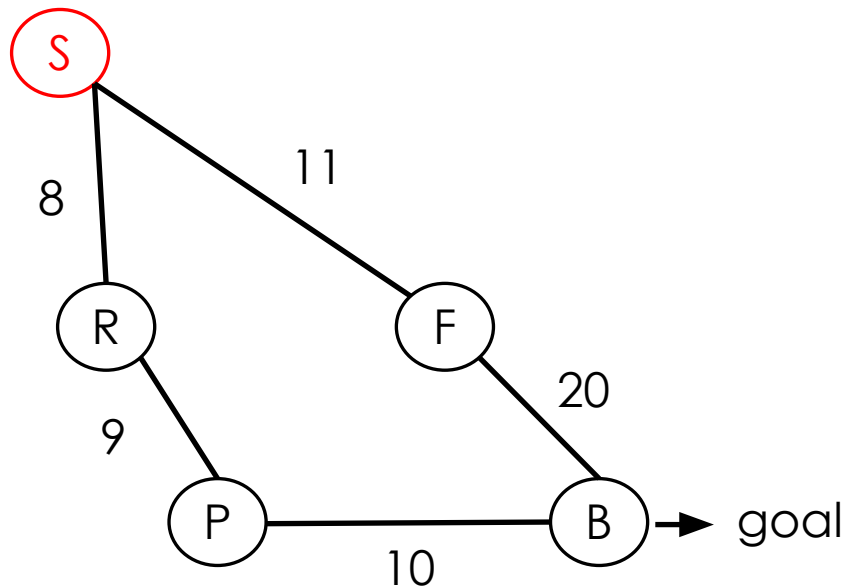


Uniform Cost Search (UCS)

| Opened | Explored |
|---------|----------|
| {(S,0)} | {-} |

```
function UNIFORM-COST-SEARCH(problem) returns a solution, or failure
  opened ← a priority queue ordered by PATH-COST, with node as the only element
  explored ← an empty set
```

```
  loop do
    if EMPTY?( opened ) then return failure
    node ← POP(opened) /* chooses the lowest-cost node in opened */
    if node == goal then return SOLUTION
    add node to explored
    for each adjacent node (n) of node do
      if n is not in explored or opened then
        opened ← INSERT(n)
      else if n is in opened with higher PATH-COST then
        replace that opened node with n
```



Uniform Cost Search (UCS)

| Opened | Explored |
|---------|----------|
| {(S,0)} | {-} |
| | {(S,0)} |

function UNIFORM-COST-SEARCH(*problem*) **returns** a solution, or failure
opened \leftarrow a priority queue ordered by PATH-COST, with *node* as the only element
explored \leftarrow an empty set

loop do

if EMPTY?(*opened*) **then return** failure

node \leftarrow POP(*opened*) /* chooses the lowest-cost node in *opened* */

if *node* == *goal* **then return** SOLUTION

 add *node* to *explored*

for each adjacent node (*n*) of *node* **do**

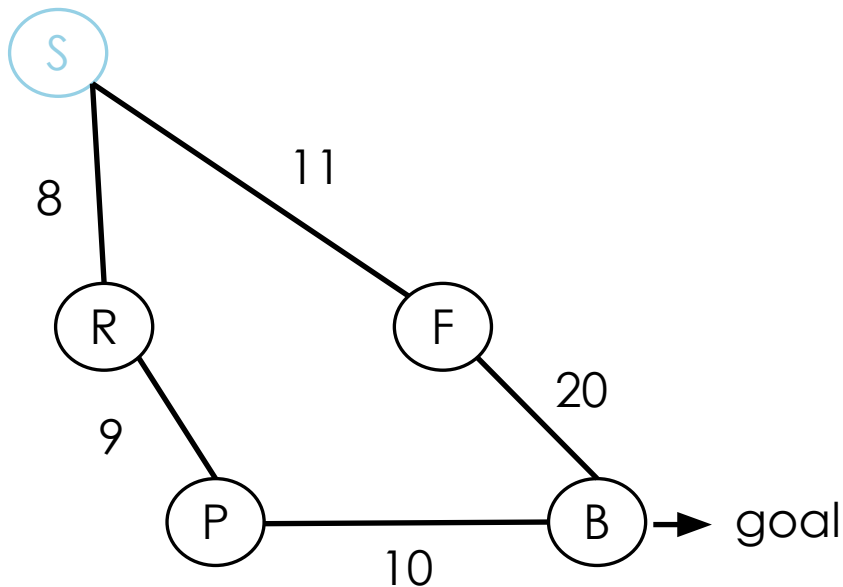
if *n* is not in *explored* or *opened* **then**

opened \leftarrow INSERT(*n*)

else if *n* is in *opened* with higher PATH-COST **then**

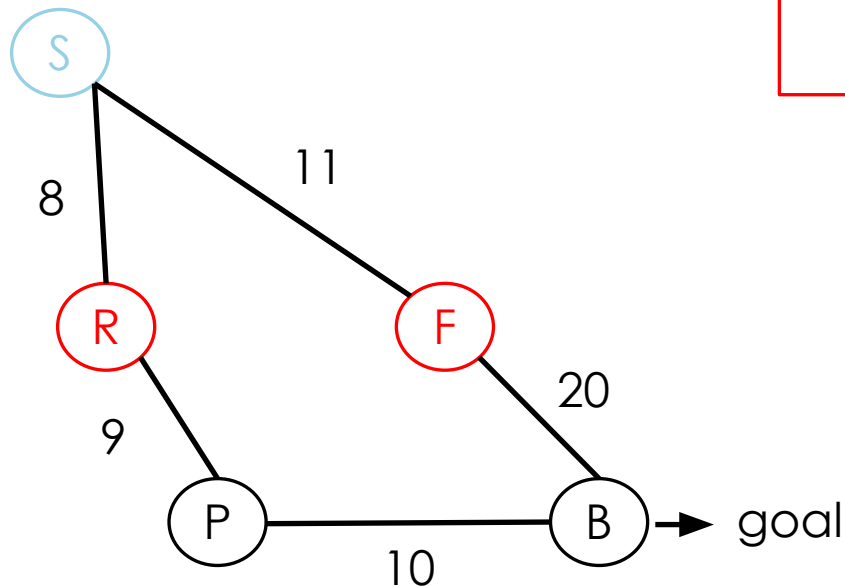
 replace that *opened* node with *n*

Is S a goal state?

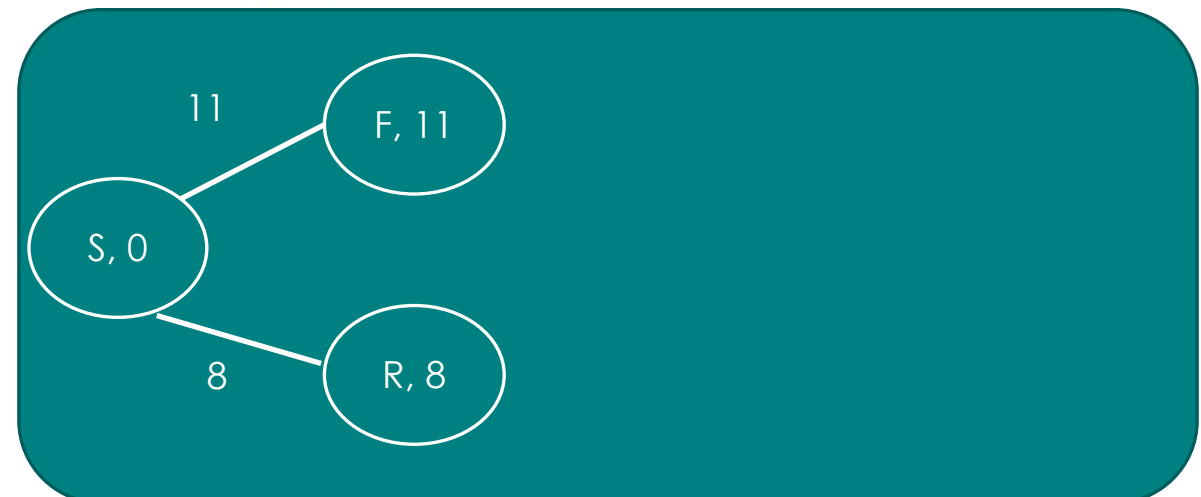


Uniform Cost Search (UCS)

| Opened | Explored |
|-------------------|----------|
| {(S,0)} | {-} |
| {(R, 8), (F, 11)} | {(S,0)} |



```
function UNIFORM-COST-SEARCH(problem) returns a solution, or failure
  opened  $\leftarrow$  a priority queue ordered by PATH-COST, with node as the only element
  explored  $\leftarrow$  an empty set
  loop do
    if EMPTY?(opened) then return failure
    node  $\leftarrow$  POP(opened) /* chooses the lowest-cost node in opened */
    if node == goal then return SOLUTION
    add node to explored
    for each adjacent node (n) of node do
      if n is not in explored or opened then
        opened  $\leftarrow$  INSERT(n)
      else if n is in opened with higher PATH-COST then
        replace that opened node with n
```



Uniform Cost Search (UCS)

| Opened | Explored |
|-------------------|----------------|
| {(S,0)} | {-} |
| {(R, 8), (F, 11)} | {(S,0)} |
| {(F, 11)} | {(S,0), (R,8)} |

function UNIFORM-COST-SEARCH(*problem*) **returns** a solution, or failure
opened \leftarrow a priority queue ordered by PATH-COST, with *node* as the only element
explored \leftarrow an empty set

loop do

if EMPTY?(*opened*) **then return** failure

node \leftarrow POP(*opened*) /* chooses the lowest-cost node in *opened* */

if *node* == *goal* **then return** SOLUTION

 add *node* to *explored*

for each adjacent node (*n*) of *node* **do**

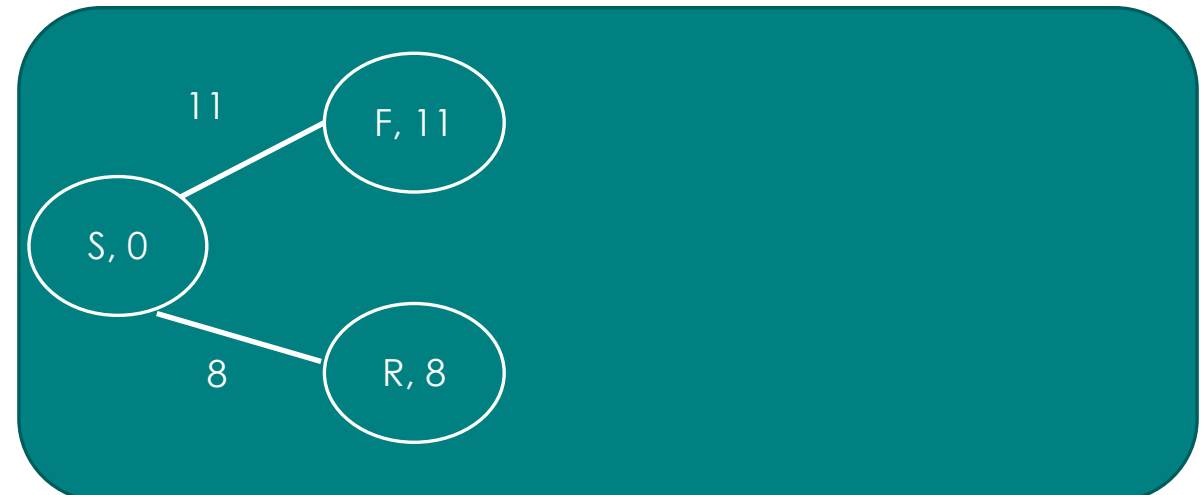
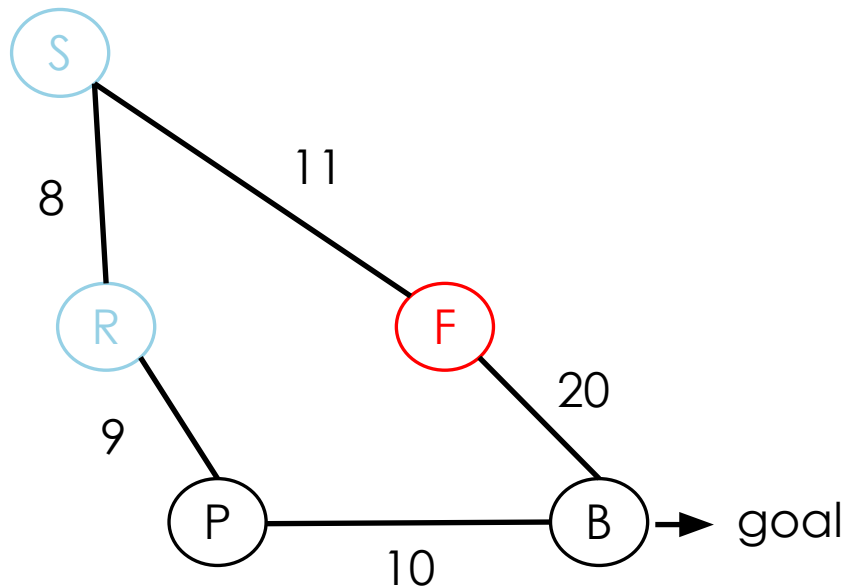
if *n* is not in *explored* or *opened* **then**

opened \leftarrow INSERT(*n*)

else if *n* is in *opened* with higher PATH-COST **then**

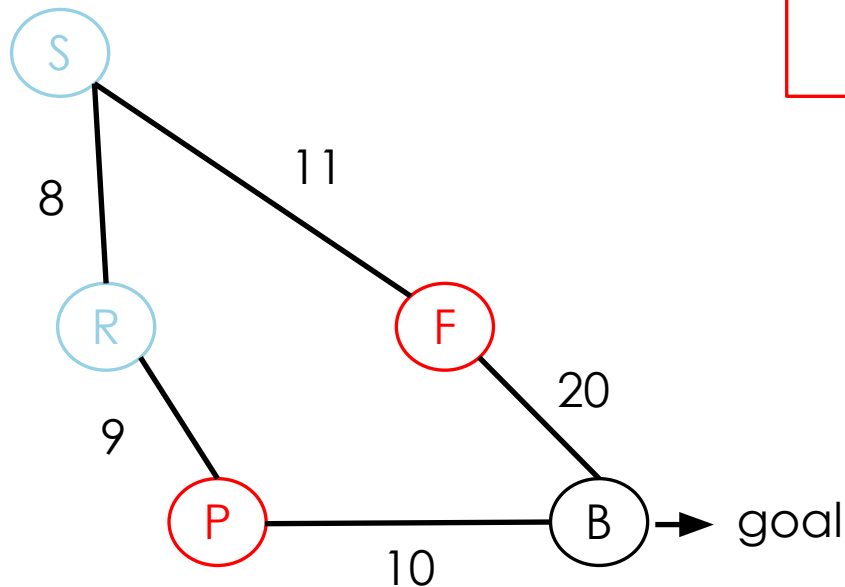
 replace that *opened* node with *n*

Is R a goal state?

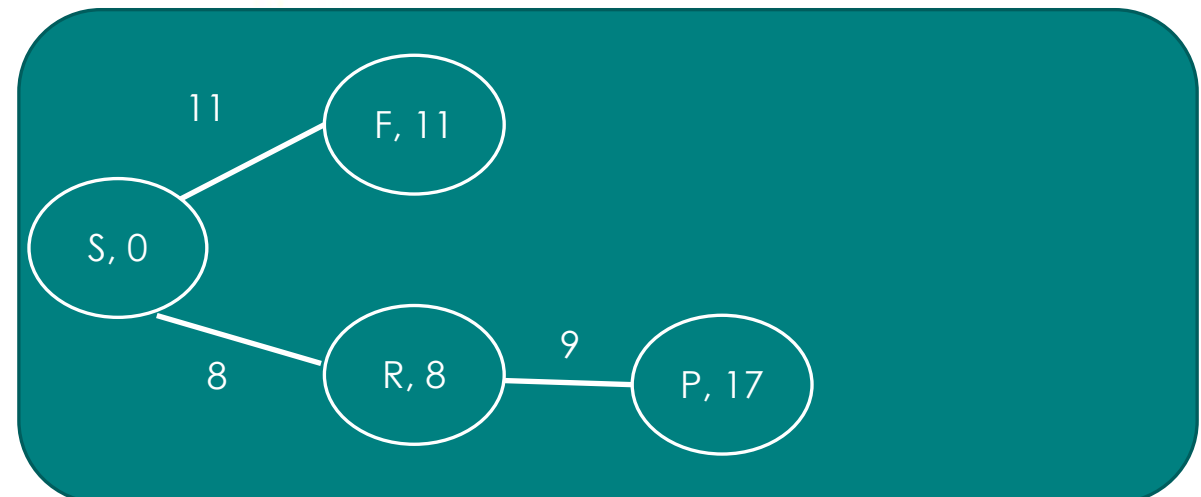


Uniform Cost Search (UCS)

| Opened | Explored |
|--------------------|----------------|
| {(S,0)} | {-} |
| {(R, 8), (F, 11)} | {(S,0)} |
| {(F, 11)} | {(S,0), (R,8)} |
| {(F, 11), (P, 17)} | {(S,0), (R,8)} |



```
function UNIFORM-COST-SEARCH(problem) returns a solution, or failure
  opened ← a priority queue ordered by PATH-COST, with node as the only element
  explored ← an empty set
  loop do
    if EMPTY?( opened ) then return failure
    node ← POP(opened) /* chooses the lowest-cost node in opened */
    if node == goal then return SOLUTION
    add node to explored
    for each adjacent node (n) of node do
      if n is not in explored or opened then
        opened ← INSERT(n)
      else if n is in opened with higher PATH-COST then
        replace that opened node with n
```



Uniform Cost Search (UCS)

| Opened | Explored |
|--------------------|-------------------------|
| {(S,0)} | {-} |
| {(R, 8), (F, 11)} | {(S,0)} |
| {(F, 11)} | {(S,0), (R,8)} |
| {(F, 11), (P, 17)} | {(S,0), (R,8)} |
| {(P, 17)} | {(S,0), (R,8), (F, 11)} |

function UNIFORM-COST-SEARCH(*problem*) **returns** a solution, or failure
opened \leftarrow a priority queue ordered by PATH-COST, with *node* as the only element
explored \leftarrow an empty set

loop do

if EMPTY?(*opened*) **then return** failure

node \leftarrow POP(*opened*) /* chooses the lowest-cost node in *opened* */

if *node* == *goal* **then return** SOLUTION

 add *node* to *explored*

for each adjacent node (*n*) of *node* **do**

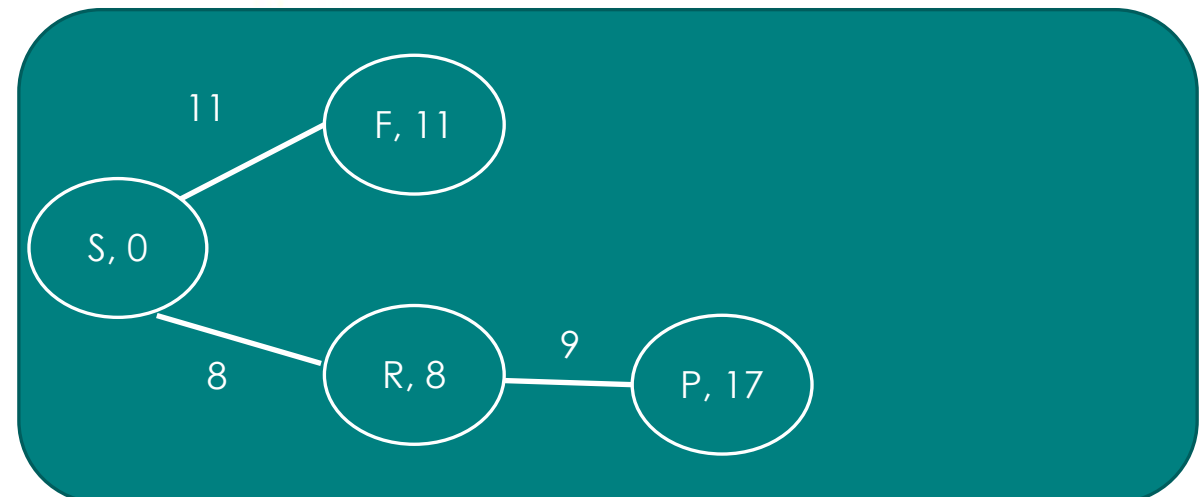
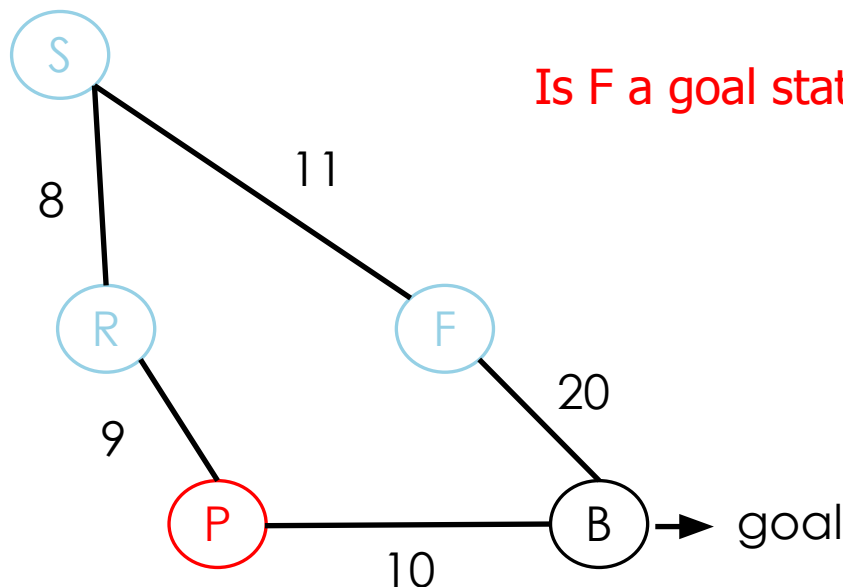
if *n* is not in *explored* or *opened* **then**

opened \leftarrow INSERT(*n*)

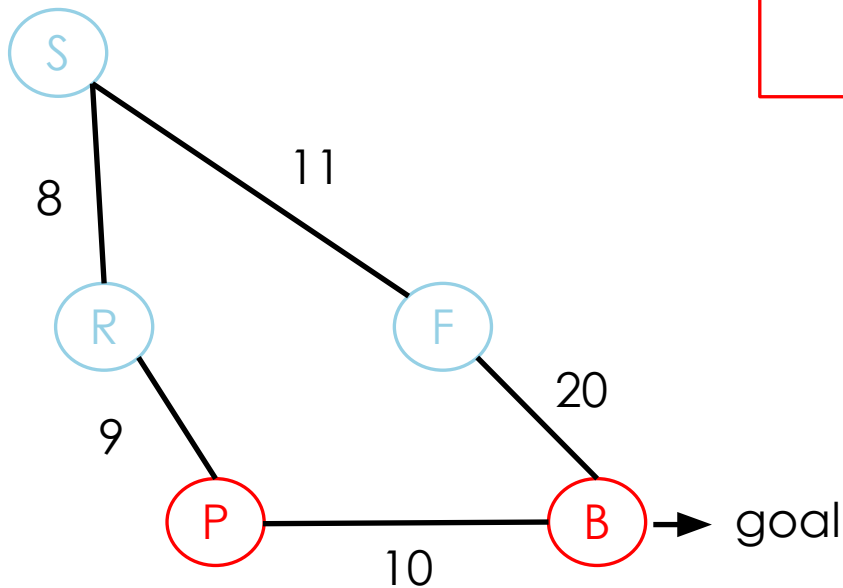
else if *n* is in *opened* with higher PATH-COST **then**

 replace that *opened* node with *n*

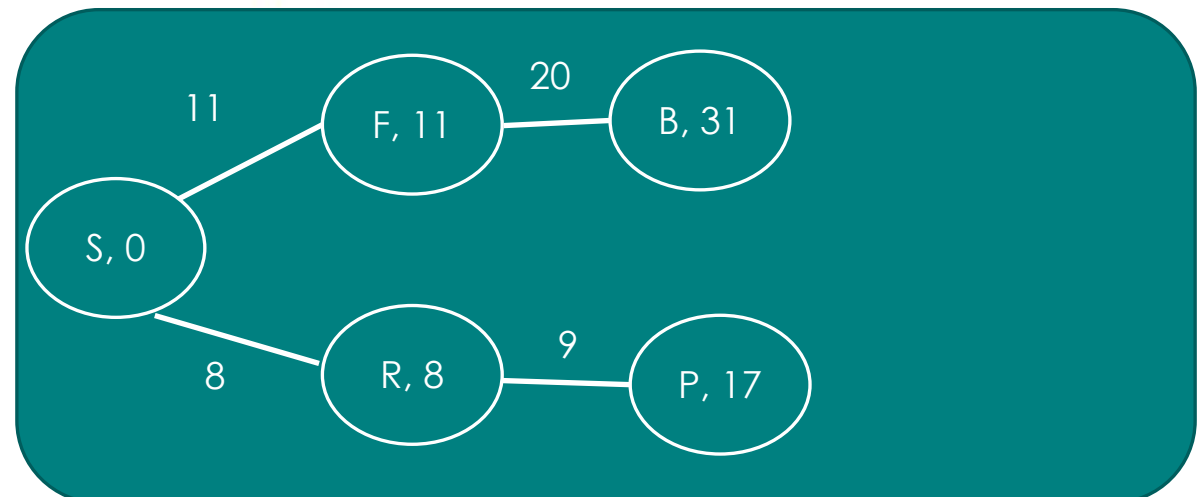
Is F a goal state?



| Opened | Explored |
|--------------------|-------------------------|
| {(S,0)} | {-} |
| {(R, 8), (F, 11)} | {(S,0)} |
| {(F, 11)} | {(S,0), (R,8)} |
| {(F, 11), (P, 17)} | {(S,0), (R,8)} |
| {(P, 17)} | {(S,0), (R,8), (F, 11)} |
| {(P, 17), (B, 31)} | {(S,0), (R,8), (F, 11)} |



function UNIFORM-COST-SEARCH(*problem*) **returns** a solution, or failure
opened \leftarrow a priority queue ordered by PATH-COST, with *node* as the only element
explored \leftarrow an empty set
loop do
 if EMPTY?(*opened*) **then return** failure
 node \leftarrow POP(*opened*) /* chooses the lowest-cost node in *opened* */
 if *node* == *goal* **then return** SOLUTION
 add *node* to *explored*
 for each adjacent node (*n*) of *node* **do**
 if *n* is not in *explored* or *opened* **then**
 opened \leftarrow INSERT(*n*)
 else if *n* is in *opened* with higher PATH-COST **then**
 replace that *opened* node with *n*



Opened

Explored

| | |
|--------------------|----------------------------------|
| {(S,0)} | {-} |
| {(R, 8), (F, 11)} | {(S,0)} |
| {(F, 11)} | {(S,0), (R,8)} |
| {(F, 11), (P, 17)} | {(S,0), (R,8)} |
| {(P, 17)} | {(S,0), (R,8), (F, 11)} |
| {(P, 17), (B, 31)} | {(S,0), (R,8), (F, 11)} |
| {(B, 31)} | {(S,0), (R,8), (F, 11), (P, 17)} |

function UNIFORM-COST-SEARCH(*problem*) **returns** a solution, or failure
opened \leftarrow a priority queue ordered by PATH-COST, with *node* as the only element
explored \leftarrow an empty set

loop do

if EMPTY?(*opened*) **then return** failure

node \leftarrow POP(*opened*) /* chooses the lowest-cost node in *opened* */

if *node* == *goal* **then return** SOLUTION

add *node* to *explored*

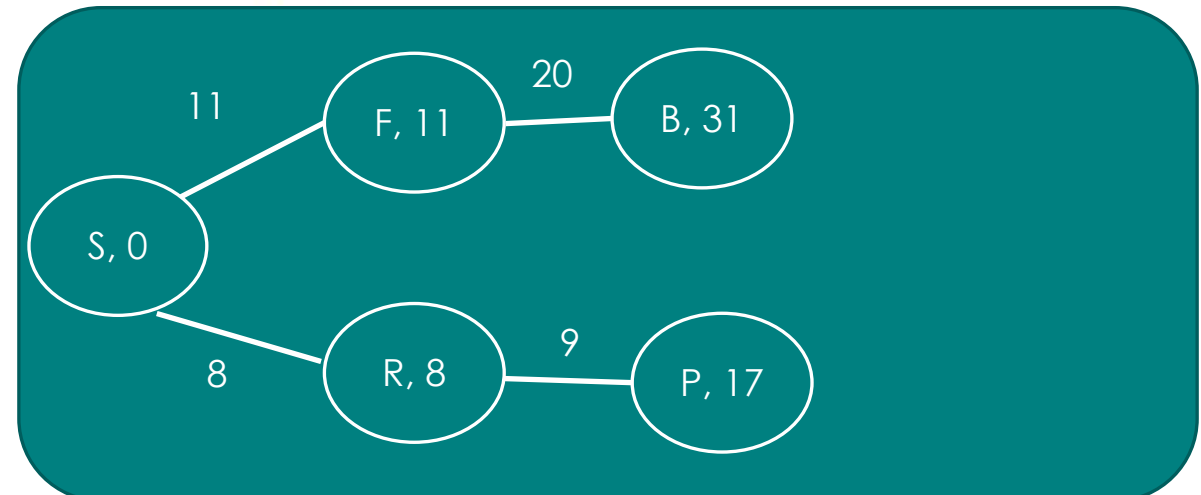
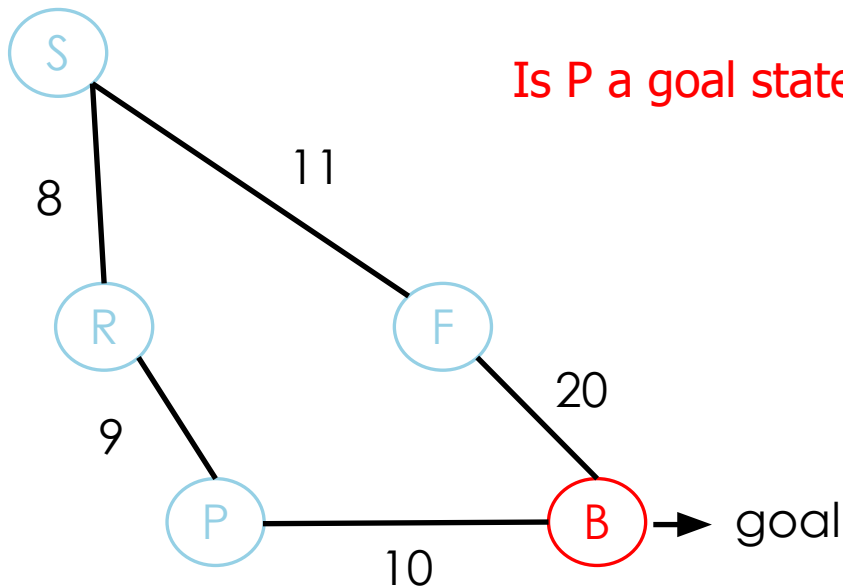
for each adjacent node (*n*) of *node* **do**

if *n* is not in *explored* or *opened* **then**

opened \leftarrow INSERT(*n*)

else if *n* is in *opened* with higher PATH-COST **then**

replace that *opened* node with *n*



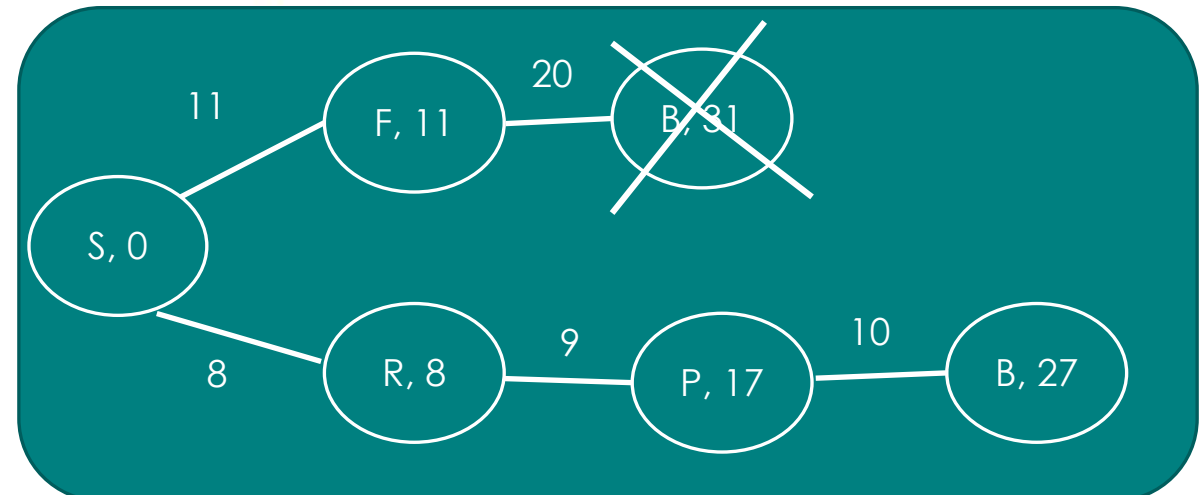
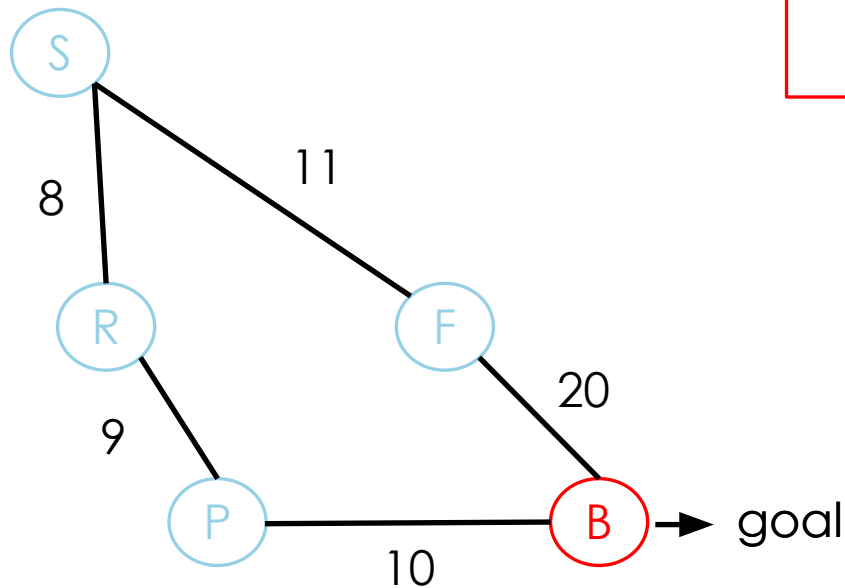
Opened

Explored

| | |
|--------------------|----------------------------------|
| {(S,0)} | {-} |
| {(R, 8), (F, 11)} | {(S,0)} |
| {(F, 11)} | {(S,0), (R,8)} |
| {(F, 11), (P, 17)} | {(S,0), (R,8)} |
| {(P, 17)} | {(S,0), (R,8), (F, 11)} |
| {(P, 17), (B, 31)} | {(S,0), (R,8), (F, 11)} |
| {(B, 31)} | {(S,0), (R,8), (F, 11), (P, 17)} |
| {(B, 27)} | |

```

function UNIFORM-COST-SEARCH(problem) returns a solution, or failure
  opened  $\leftarrow$  a priority queue ordered by PATH-COST, with node as the only element
  explored  $\leftarrow$  an empty set
  loop do
    if EMPTY?( opened ) then return failure
    node  $\leftarrow$  POP(opened) /* chooses the lowest-cost node in opened */
    if node == goal then return SOLUTION
    add node to explored
    for each adjacent node (n) of node do
      if n is not in explored or opened then
        opened  $\leftarrow$  INSERT(n)
      else if n is in opened with higher PATH-COST then
        replace that opened node with n
  
```



Opened

Explored

| | |
|--------------------|----------------------------------|
| {(S,0)} | {-} |
| {(R, 8), (F, 11)} | {(S,0)} |
| {(F, 11)} | {(S,0), (R,8)} |
| {(F, 11), (P, 17)} | {(S,0), (R,8)} |
| {(P, 17)} | {(S,0), (R,8), (F, 11)} |
| {(P, 17), (B, 31)} | {(S,0), (R,8), (F, 11)} |
| {(B, 31)} | {(S,0), (R,8), (F, 11), (P, 17)} |
| {(B, 27)} | |

function UNIFORM-COST-SEARCH(*problem*) **returns** a solution, or failure
opened \leftarrow a priority queue ordered by PATH-COST, with *node* as the only element
explored \leftarrow an empty set

loop do

if EMPTY?(*opened*) **then return** failure

node \leftarrow POP(*opened*) /* chooses the lowest-cost node in *opened* */

if *node* == *goal* **then return** SOLUTION

add *node* to *explored*

for each adjacent node (*n*) of *node* **do**

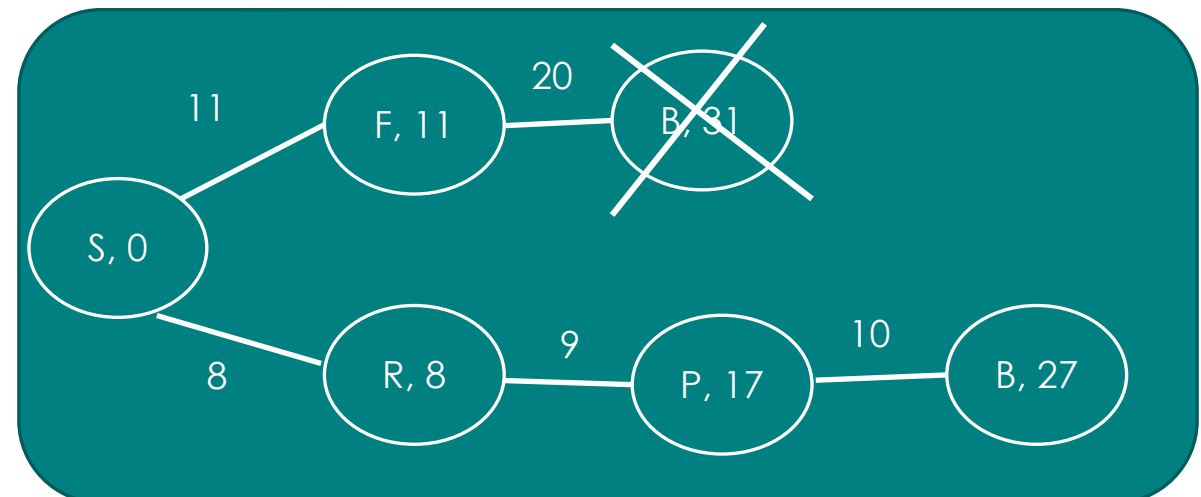
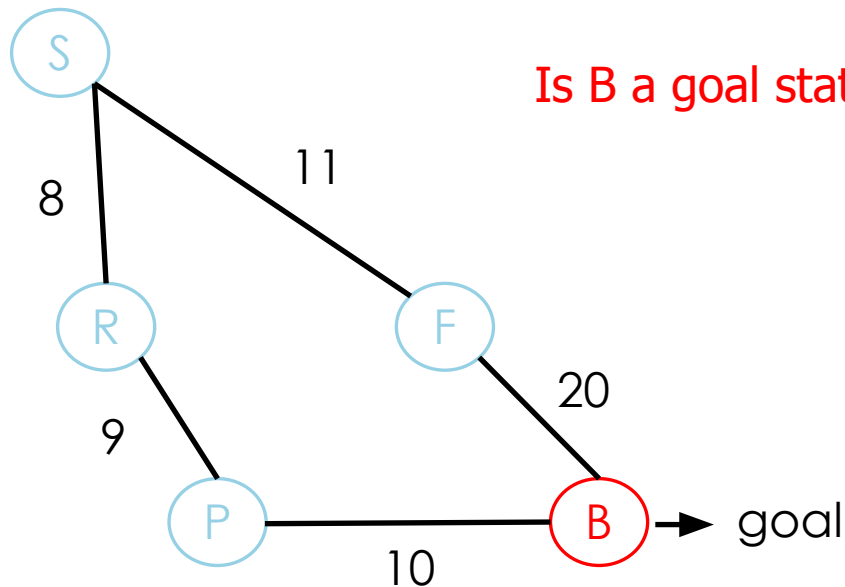
if *n* is not in *explored* or *opened* **then**

opened \leftarrow INSERT(*n*)

else if *n* is in *opened* with higher PATH-COST **then**

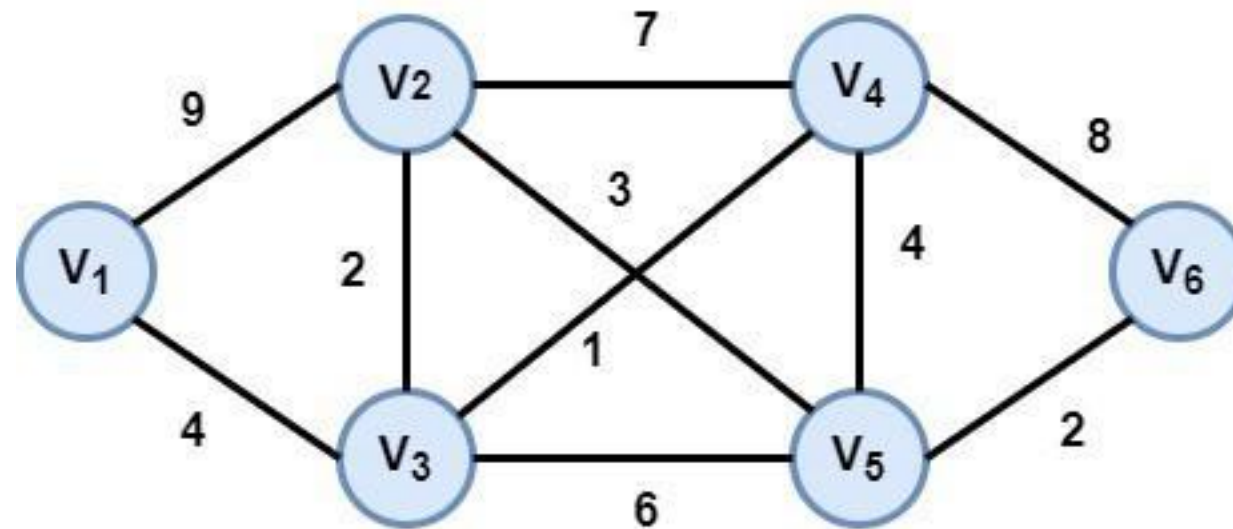
replace that *opened* node with *n*

Is B a goal state?



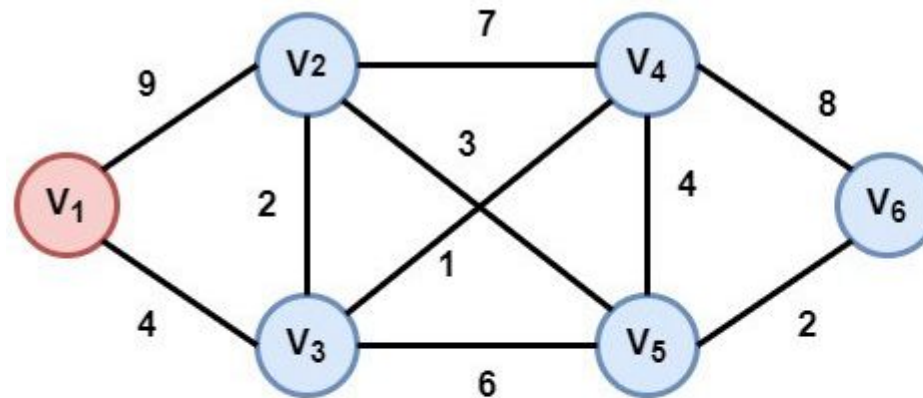
Example

Our target is to go from the city (node) V_1 to V_6 following the path with the smallest cost (shortest path). Let's execute the UCS algorithm:



Step 1: Initialization

The first node V_1 (initial state) of the graph is appended to the opened list. The distance of this node from itself is zero.



Step

0

Opened

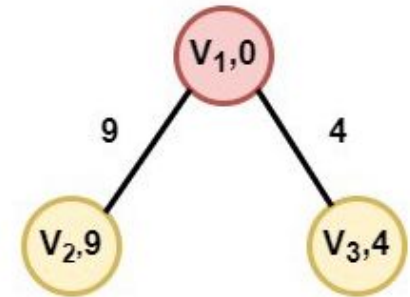
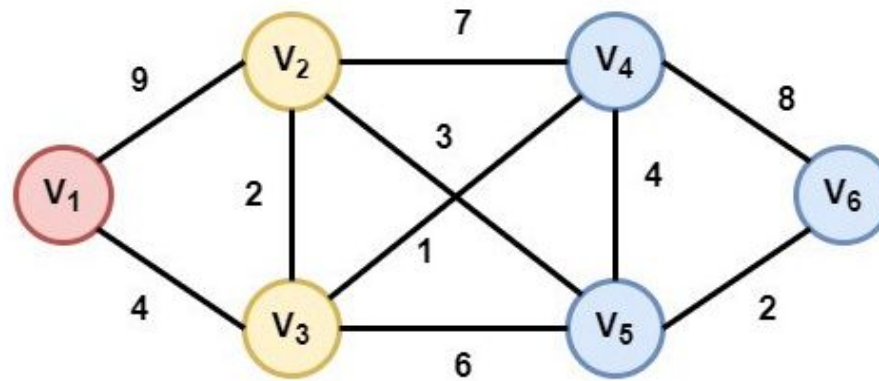
$\{(V_1, 0)\}$

Explored

$\{-\}$

Step 2: Node V1 is selected

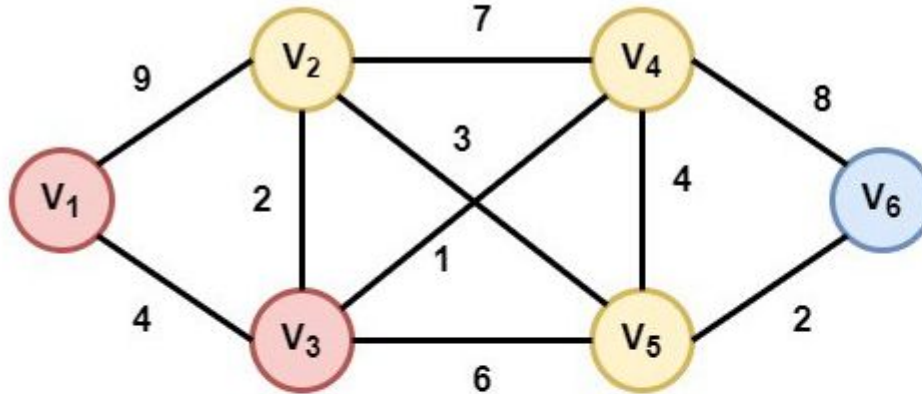
The V1 is selected as it is the only node in the opened list. Its children V2 and V3 are appended in the opened list after the distance calculation from node V1.



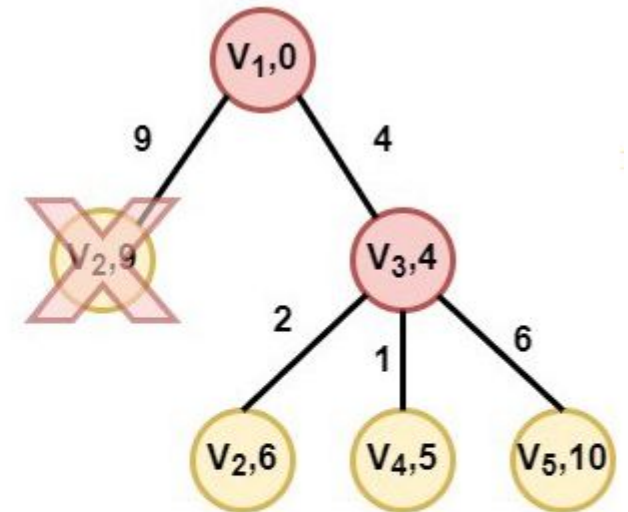
| Step | Opened | Explored |
|------|--------------------------|----------------|
| 0 | $\{(V_1, 0)\}$ | $\{-\}$ |
| 1 | $\{(V_2, 9), (V_3, 4)\}$ | $\{(V_1, 0)\}$ |

Step 3: Node V3 is selected

Node V3 is selected as it has the smallest distance value. As we can see, extending the node V3 we find the node V2 with a smaller distance value. So we replace node (V2,9) with the new node (V2,6).

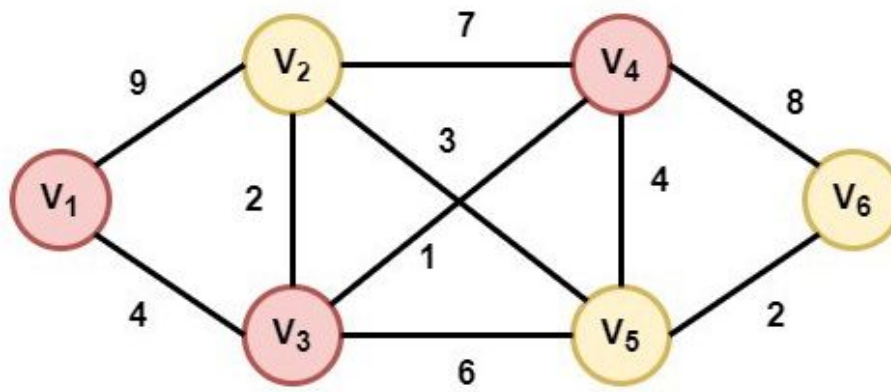


| Step | Opened | Explored |
|------|-------------------------------------|--------------------------|
| 0 | $\{(V_1, 0)\}$ | $\{-\}$ |
| 1 | $\{(V_2, 9), (V_3, 4)\}$ | $\{(V_1, 0)\}$ |
| 2 | $\{(V_2, 6), (V_4, 5), (V_5, 10)\}$ | $\{(V_1, 0), (V_3, 4)\}$ |

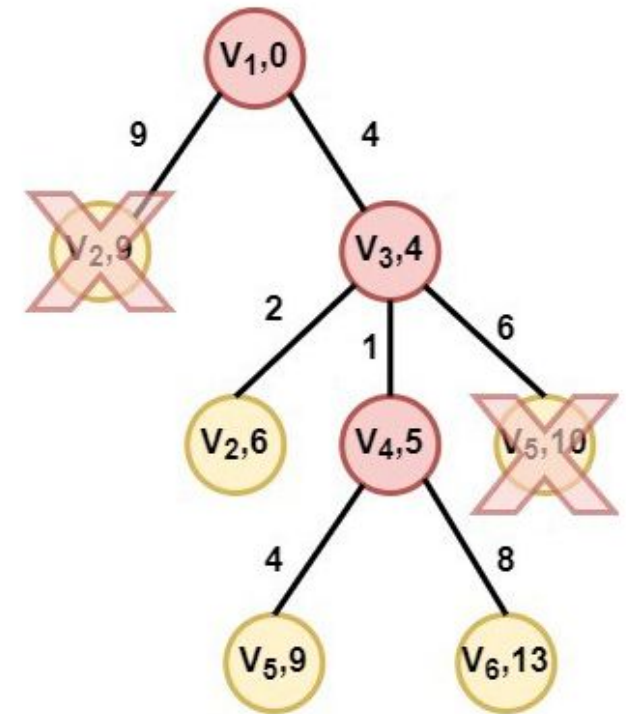


Step 4: Node V4 is selected

Node V4 is selected as it has the smallest distance value. In this step, we find a better distance value for node V5, so we replace the node (V5, 10) with node (V5, 9).

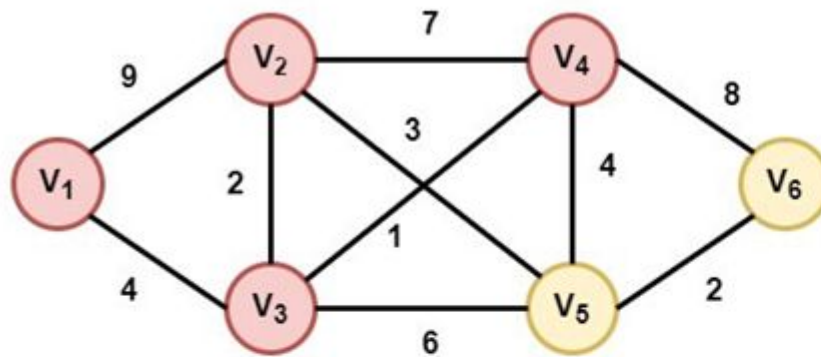


| Step | Opened | Explored |
|------|-------------------------------------|------------------------------------|
| 0 | $\{(V_1, 0)\}$ | $\{-\}$ |
| 1 | $\{(V_2, 9), (V_3, 4)\}$ | $\{(V_1, 0)\}$ |
| 2 | $\{(V_2, 6), (V_4, 5), (V_5, 10)\}$ | $\{(V_1, 0), (V_3, 4)\}$ |
| 3 | $\{(V_2, 6), (V_6, 13), (V_5, 9)\}$ | $\{(V_1, 0), (V_3, 4), (V_4, 5)\}$ |

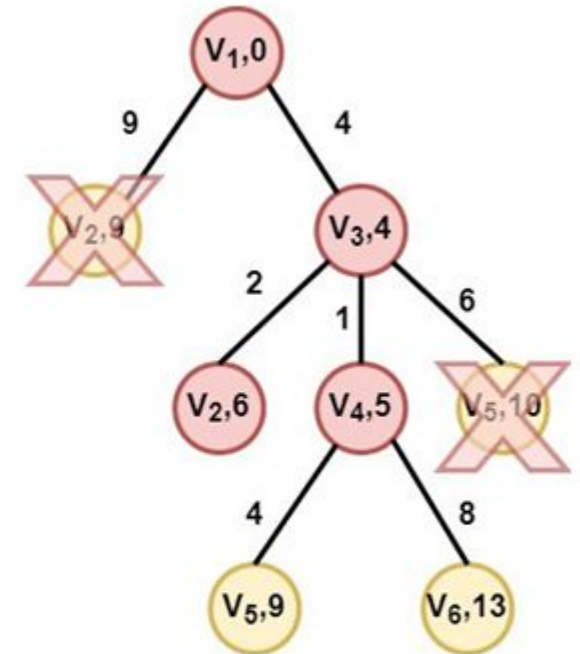


Step 5: Node V2 is selected

Node V2 is selected as it has the smallest distance value. However, none of its children is appended in the opened list, as nodes V3 and V4 are already inserted in the explored list and the algorithm doesn't find a better distance value for node V5.

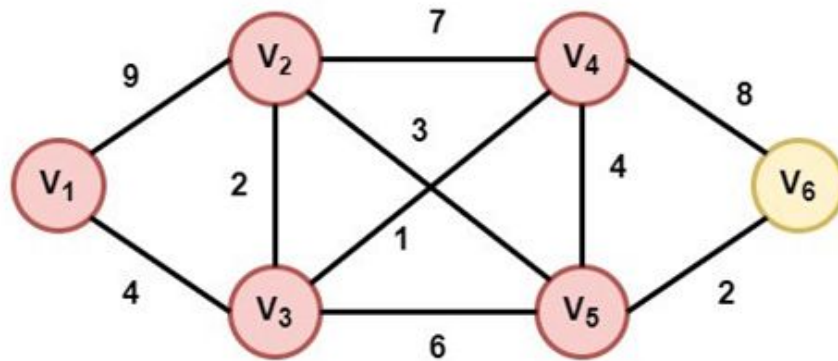


| Step | Opened | Explored |
|------|-------------------------------------|--|
| 0 | $\{(V_1, 0)\}$ | $\{-\}$ |
| 1 | $\{(V_2, 9), (V_3, 4)\}$ | $\{(V_1, 0)\}$ |
| 2 | $\{(V_2, 6), (V_4, 5), (V_5, 10)\}$ | $\{(V_1, 0), (V_3, 4)\}$ |
| 3 | $\{(V_2, 6), (V_6, 13), (V_5, 9)\}$ | $\{(V_1, 0), (V_3, 4), (V_4, 5)\}$ |
| 4 | $\{(V_6, 13), (V_5, 9)\}$ | $\{(V_1, 0), (V_3, 4), (V_4, 5), (V_2, 6)\}$ |

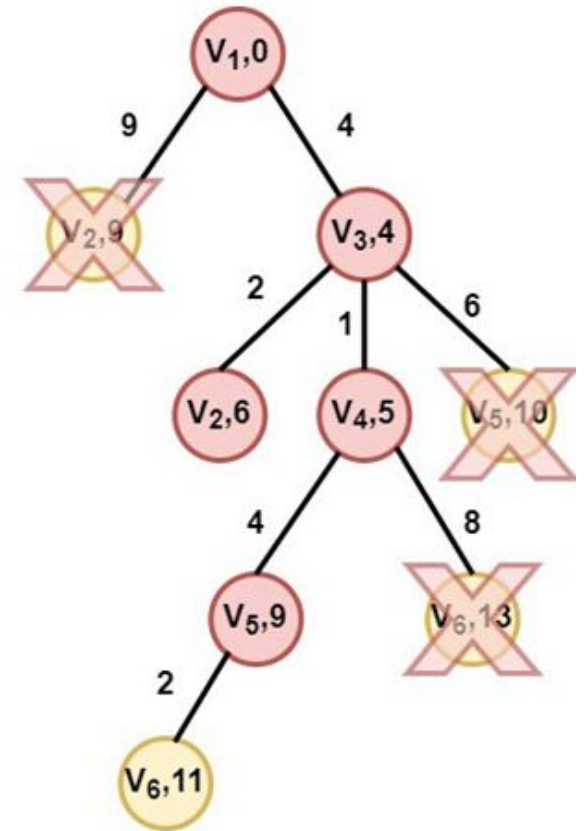


Step 6: Node V5 is selected

Node V5 is selected as it has the smallest distance value. A better path to node V6 is found in this step. So, we replace the old node (V6, 13) with node (V6, 11)

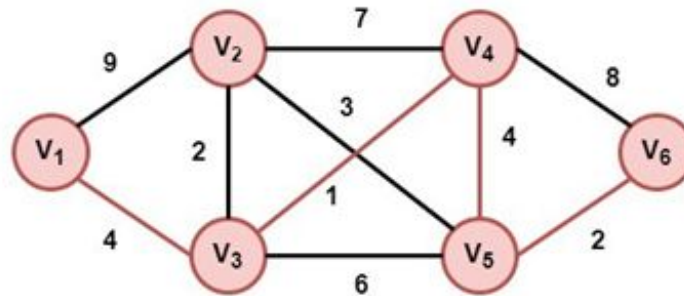


| Step | Opened | Explored |
|------|--|---|
| 0 | {(V ₁ ,0)} | {-} |
| 1 | {(V ₂ ,9),(V ₃ ,4)} | {(V ₁ ,0)} |
| 2 | {(V ₂ ,6),(V ₄ ,5),(V ₅ ,10)} | {(V ₁ ,0),(V ₃ ,4)} |
| 3 | {(V ₂ ,6),(V ₆ ,13),(V ₅ ,9)} | {(V ₁ ,0),(V ₃ ,4),(V ₄ ,5)} |
| 4 | {(V ₆ ,13),(V ₅ ,9)} | {(V ₁ ,0),(V ₃ ,4),(V ₄ ,5),(V ₂ ,6)} |
| 5 | {(V ₆ ,11)} | {(V ₁ ,0),(V ₃ ,4),(V ₄ ,5),(V ₂ ,6),(V ₅ ,9)} |



Step 7: Node V6 is selected

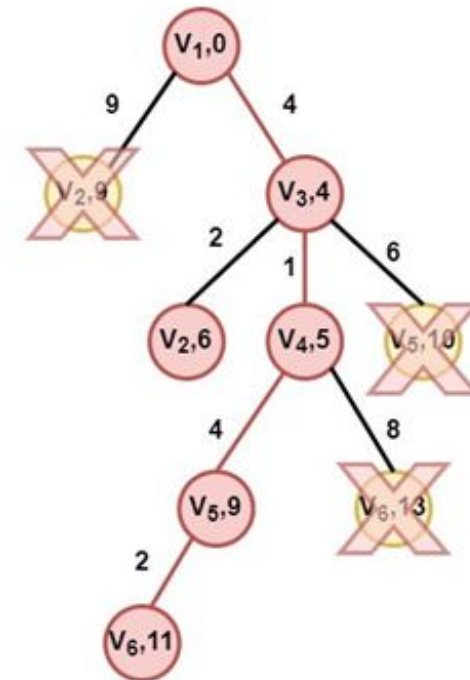
Node V6 (target node) is selected. So the algorithm returns the path from node V1 to node V6 with cost 11, which constitutes the best solution.



| Step | Opened | Explored |
|------|-------------------------------------|--|
| 0 | $\{(V_1, 0)\}$ | $\{-\}$ |
| 1 | $\{(V_2, 9), (V_3, 4)\}$ | $\{(V_1, 0)\}$ |
| 2 | $\{(V_2, 6), (V_4, 5), (V_5, 10)\}$ | $\{(V_1, 0), (V_3, 4)\}$ |
| 3 | $\{(V_2, 6), (V_6, 13), (V_5, 9)\}$ | $\{(V_1, 0), (V_3, 4), (V_4, 5)\}$ |
| 4 | $\{(V_6, 13), (V_5, 9)\}$ | $\{(V_1, 0), (V_3, 4), (V_4, 5), (V_2, 6)\}$ |
| 5 | $\{(V_6, 11)\}$ | $\{(V_1, 0), (V_3, 4), (V_4, 5), (V_2, 6), (V_5, 9)\}$ |
| 6 | $\{-\}$ | $\{(V_1, 0), (V_3, 4), (V_4, 5), (V_2, 6), (V_5, 9)\}$ |

Path: $V_1 - V_3 - V_4 - V_5 - V_6$

Total Cost: 11





When to use BFS? Real-Life Applications



❑ Crawlers in Search Engines:

BFS is used for indexing web pages. The algorithm starts traversing from the **source page and follows all the links associated with the page**. Here each web page will be considered as a node in a graph.

❑ GPS Navigation systems:

BFS is used to find **neighboring locations** by using the GPS system.

❑ Broadcasting:

Networking used to communicate **broadcasted packets** across all the nodes in a network. These packets follow a traversal method of BFS to reach various networking nodes.

❑ Peer to Peer Networking:

BFS can be used as a traversal method to find all the **neighboring nodes** in a Peer to Peer Network. For example, **BitTorrent uses Breadth-First Search for peer to peer communication**.



When to use DFS? Real-Life Applications



□ Cycle detection:

DFS can be used to detect cycles in a graph. If a node is visited again during a DFS traversal, it indicates **that there is a cycle in the graph**.

□ Pathfinding:

DFS can be used to find a **path between two nodes in a graph**.

□ Solving puzzles:

DFS can be used to **solve puzzles such as mazes**, where the goal is to find a path from the start to the end.

□ Backtracking:

DFS can be used for **backtracking in algorithms like Sudoku**.

