

CS380  
Artificial Intelligence for Games

**Uninformed Search**

# Outline

- Uninformed search
  - Breadth-first search
    - Uniform-cost search
  - Depth-first search
    - Backtracking
  - Depth-limited search
  - Iterative deepening search
  - Bidirectional search

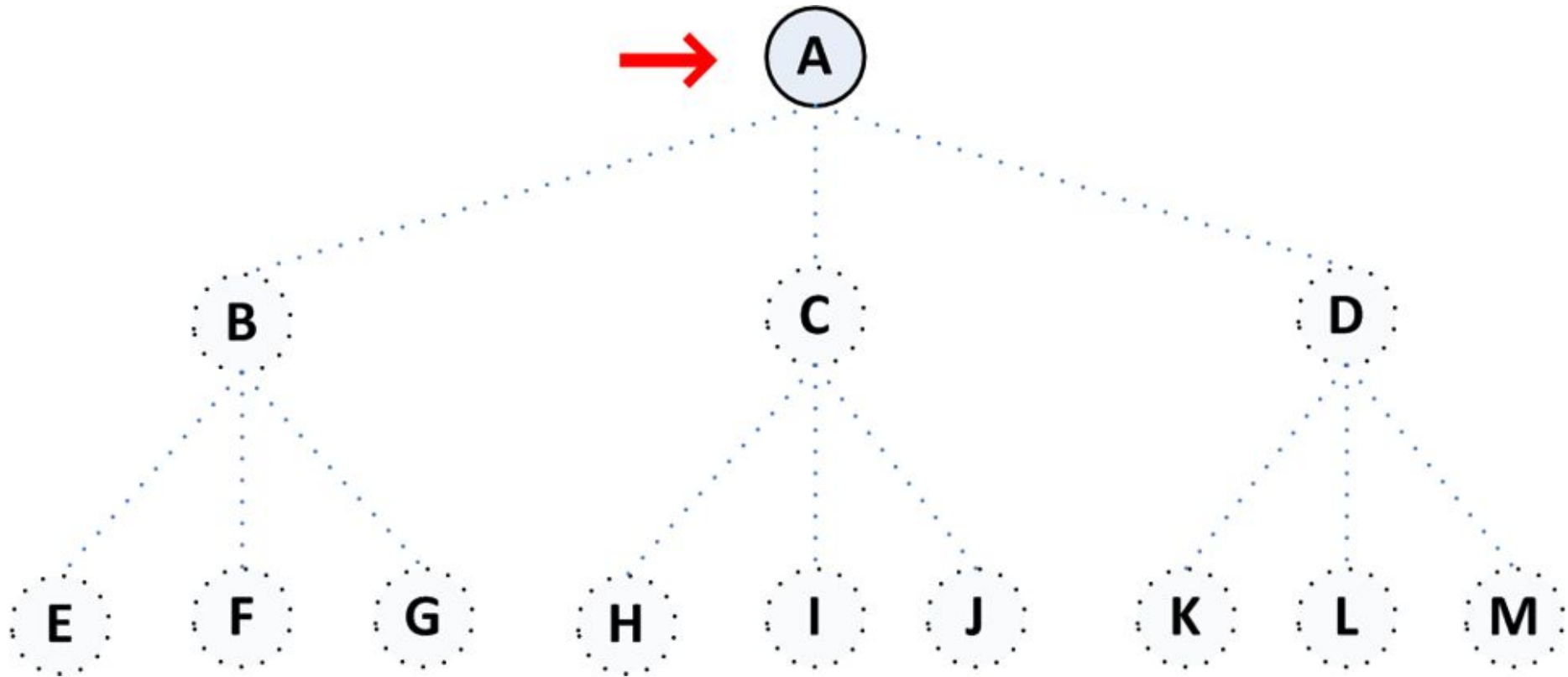
## Uninformed search. BFS

- All nodes are expanded at a given depth in the search tree before any nodes at the next level are expanded
  - At a certain level depth  $d$  of the search tree, all the previous nodes are visited for sure, and none of the nodes at level  $d + 1$  are visited yet
- Implemented using
  - **Openlist** - a queue (FIFO) of nodes that are next to be expanded
  - **Closedlist** - a list (hash table) of nodes being expanded

# Uninformed search. BFS Code

```
var closedlist = new List();
var openlist = new Queue();
var current = null;
openlist.push(starting);
while(true) {
    if (openlist.empty()) { current = null; break; }
    current = openlist.pop();
    closedlist.push(current);
    if (current == target) break;
    for (var adjacent of getAdjacents(current))
        if (!closedlist.find(adjacent) && !openlist.find(adjacent));
            openlist.push(adjacent);
}
return current;
```

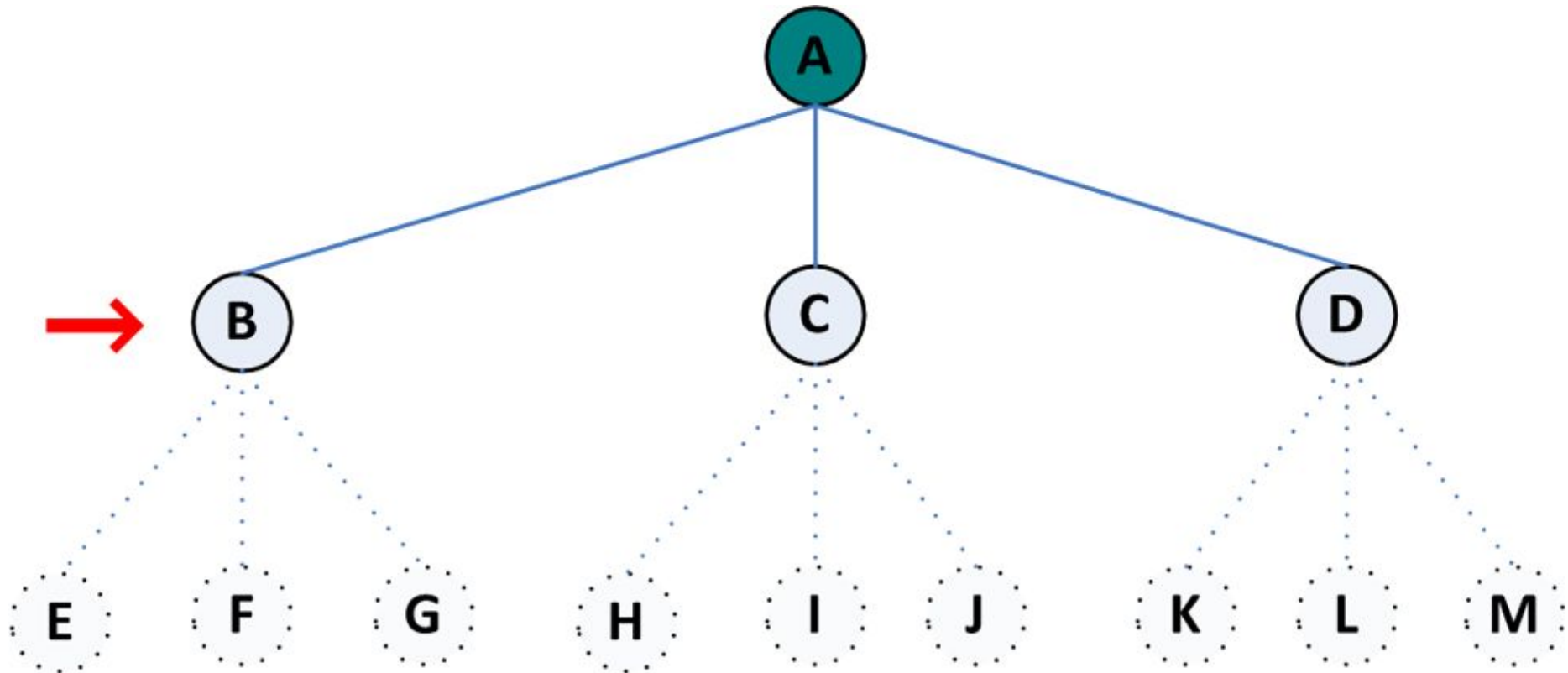
## Uninformed search. BFS Example



closedlist={ }

openlist={**A**}

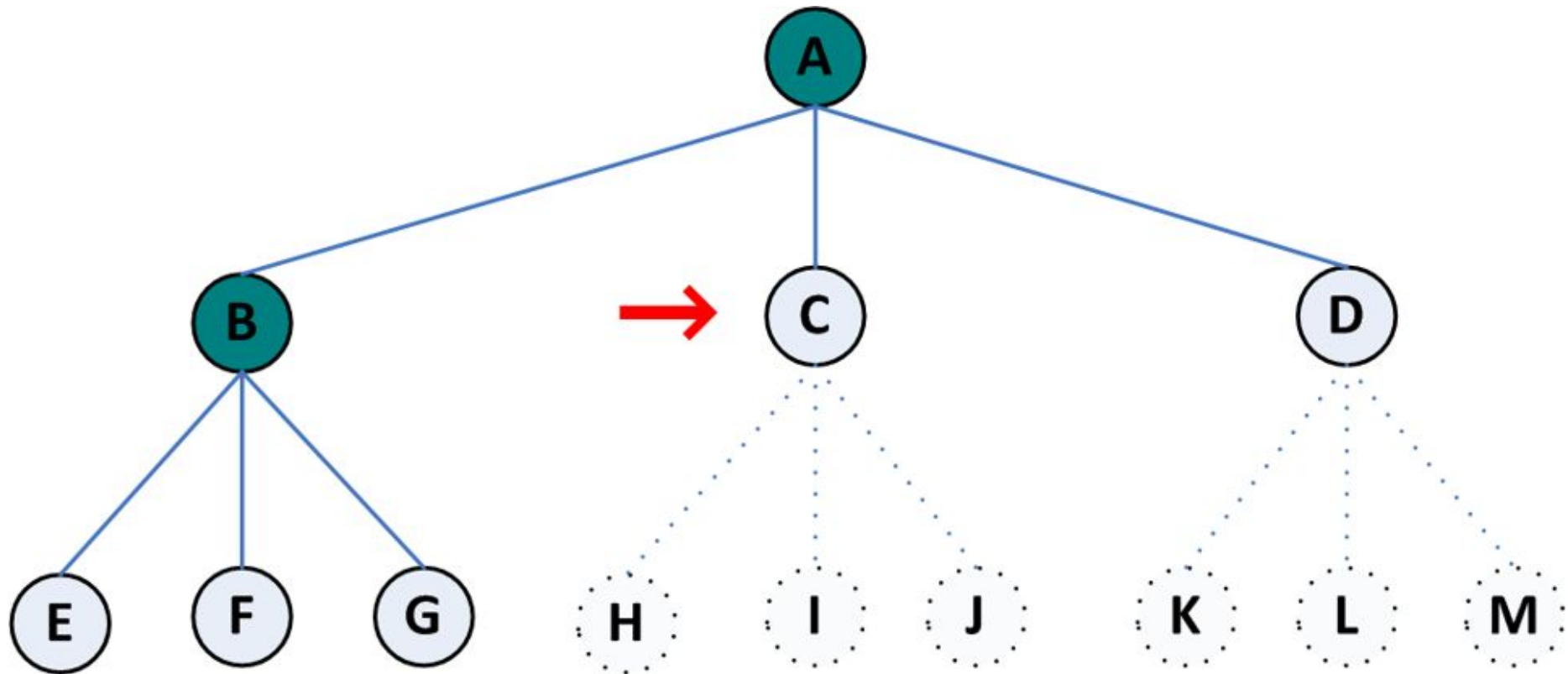
## Uninformed search. BFS Example



closedlist={A}

openlist={**B**, C, D}

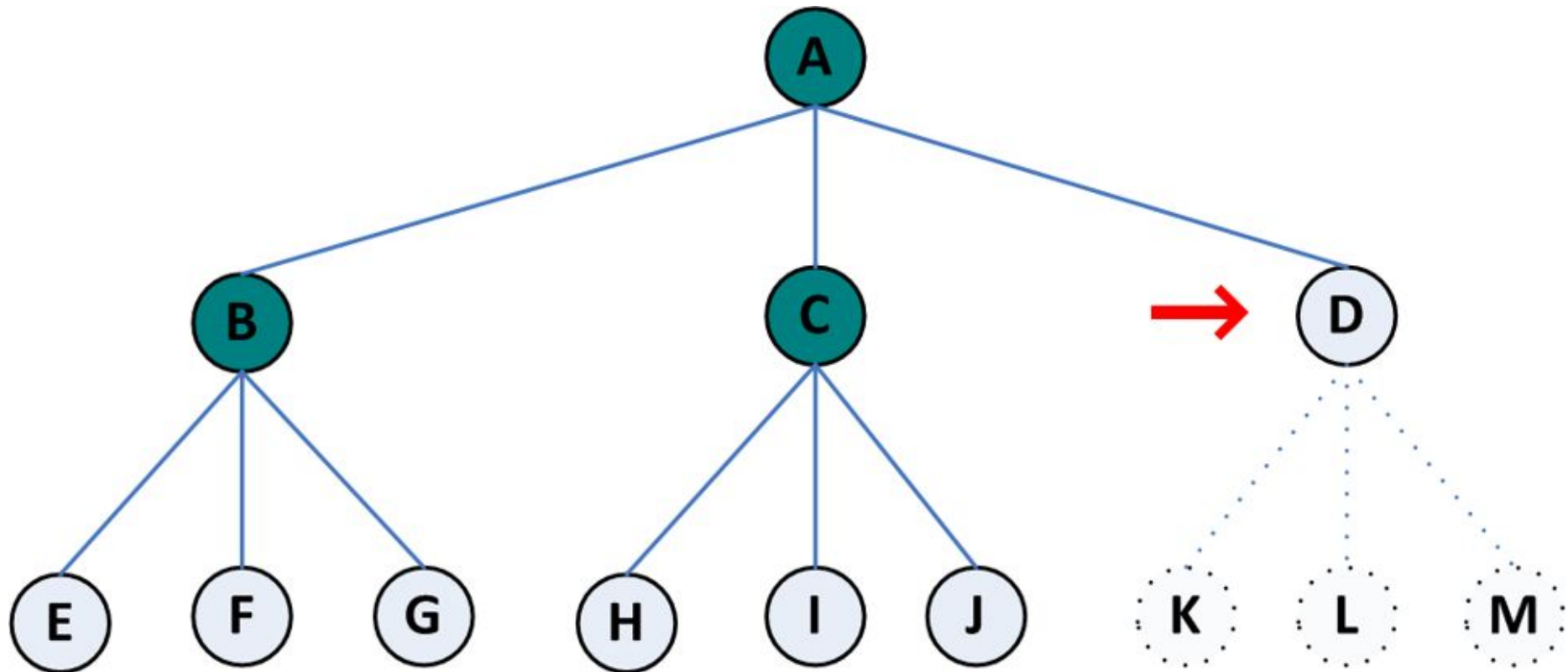
## Uninformed search. BFS Example



`closedlist={A,B}`

`openlist={C,D,E,F,G}`

## Uninformed search. BFS Example

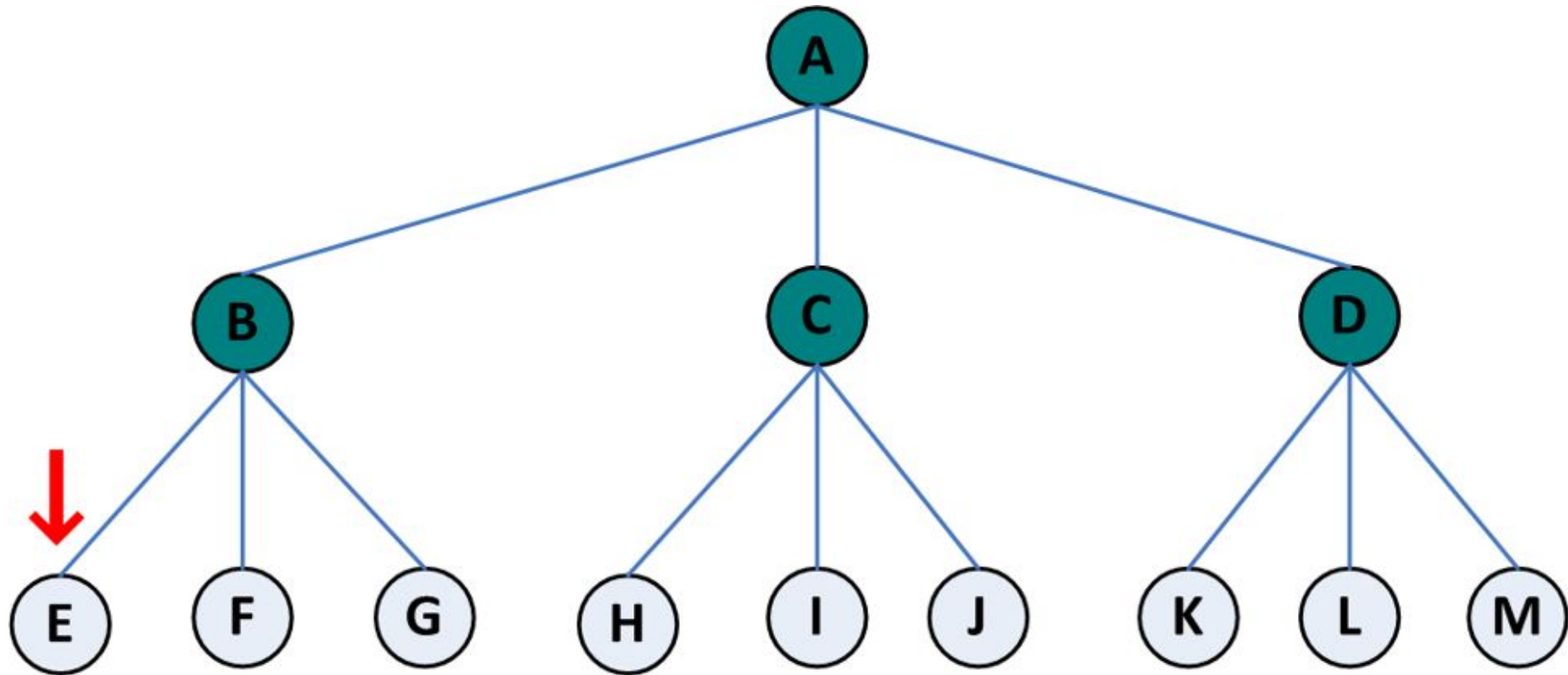


`closedlist={A,B,C}`

`openlist={D,E,F,G,H,I,J}`



## Uninformed search. BFS Example



`closedlist={A,B,C,D}`

`openlist={E,F,G,H,I,J,K,L,M}`

# Uninformed search. BFS

- Complete?
  - Yes, if the shallowest goal node is at some finite depth and the branching factor is also finite.
- Optimal?
  - Yes, no other search algorithm uses less time or space or expands fewer nodes, both with a guarantee of solution quality.

## Uninformed search. BFS

- **Complexity** in terms of branching factors:  $b$  and depth:  $d$
- **Time complexity**
  - $1+b+b^2+\dots+b^d = O(b^d)$
- **Space complexity**
  - $O(b^{d-1})$  nodes in the closedlist and  $O(b^d)$  nodes in the openlist

# Uninformed search. BFS

- Branching factor:  $b=10$
- 1 million nodes can be generated per second
- Each node requires 1KB of storage

Depth	Node	Time	memory
2	110	0.11 ms	107 KB
4	11,110	11 ms	10.6 MB
6	$10^6$	1.1 s	1 GB
10	$10^{10}$	3 hours	10 TB
16	$10^{16}$	350 years	10 EB*

\*1EB (ExaByte) =  $10^6$ TB

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# Uninformed search. Uniform-Cost Search Code

- Extension of the Breadth-First Search: Finds an **optimal** solution with any **positive** step cost
- Expands the node from the openlist with the **cheapest path cost** from the root.
  - **Openlist** is implemented using a **priority queue** ordered by path cost. It gives maximum priority to the lowest cumulative cost.
- A “relaxation” test can be added in case a better path is found to a node currently on the openlist

# Uninformed search. Uniform-Cost Search Code

```
var closedlist = new List();
var openlist = new PriorityQueue();
var current = null;
openlist.push(starting);
while(true) {
    if (openlist.empty()) { current = null; break; }
    current = openlist.pop();
    closedlist.push(current);
    if (current == target) break;
    for (var adjacent of getAdjacents(current))
        if (!closedlist.find(adjacent) && !openlist.find(adjacent))
            openlist.push(adjacent);
}
return current;
```

## Uninformed search. Uniform-Cost Search

- It has **greater** or equal work than BFS.
- It explores large trees of small steps before exploring paths involving large and perhaps useful steps.
- When all step costs are the same, uniform-cost search is similar to BFS, except that the latter stops as soon as it generates a goal, whereas uniform-cost search examines all the nodes at the goal's depth to see if one has a lower cost.



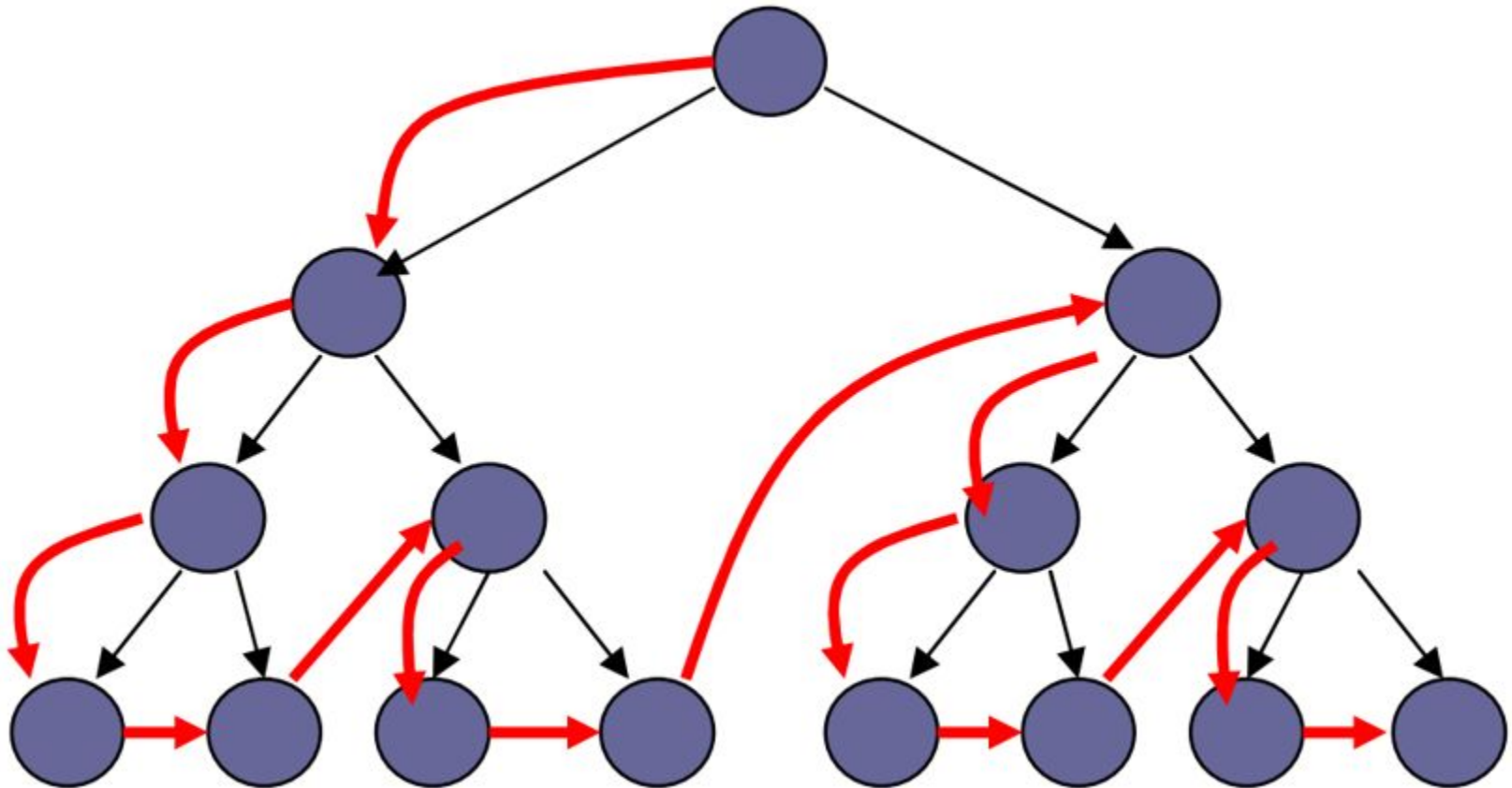
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## Uninformed search. Depth-First Search

- It visits nodes into the deepest level before going back and visiting the siblings in the tree
- **Openlist** is implemented using a **stack** (LIFO).
- **Backtrack** when the path cannot be further expanded

# Uninformed search. DFS path



# Uninformed search. DFS Code

```
var closedlist = new List();
var openlist = new Stack();
var current = null;
openlist.push(starting);
while(true) {
    if (openlist.empty()) { current = null; break; }
    current = openlist.pop();
    closedlist.push(current);
    if (current == target) break;
    for (var adjacent of getAdjacents(current))
        if (!closedlist.find(adjacent) && !openlist.find(adjacent))
            openlist.push(adjacent);
}
return current;
```

## Uninformed search. DFS

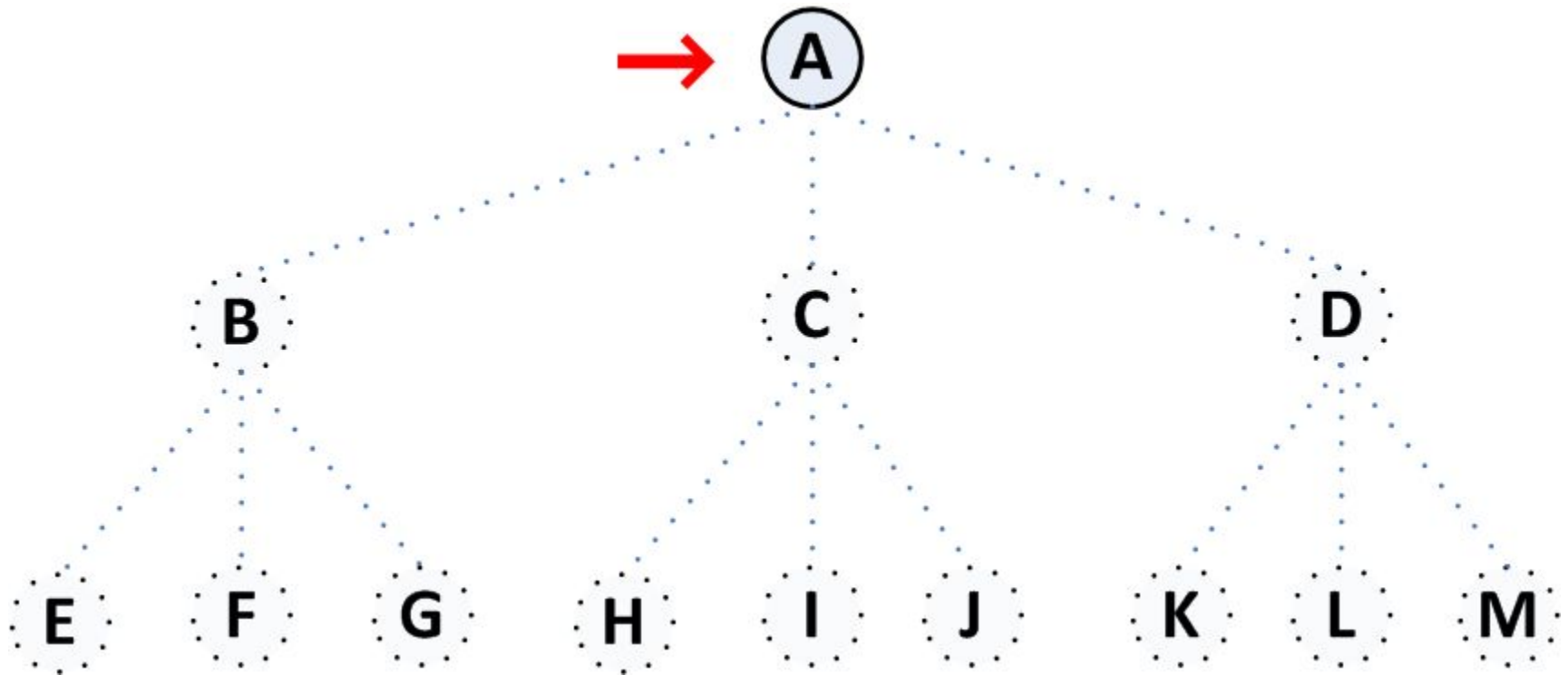
- **Complete?**

- Yes, if the state space is **finite** with **no repeated states** and paths

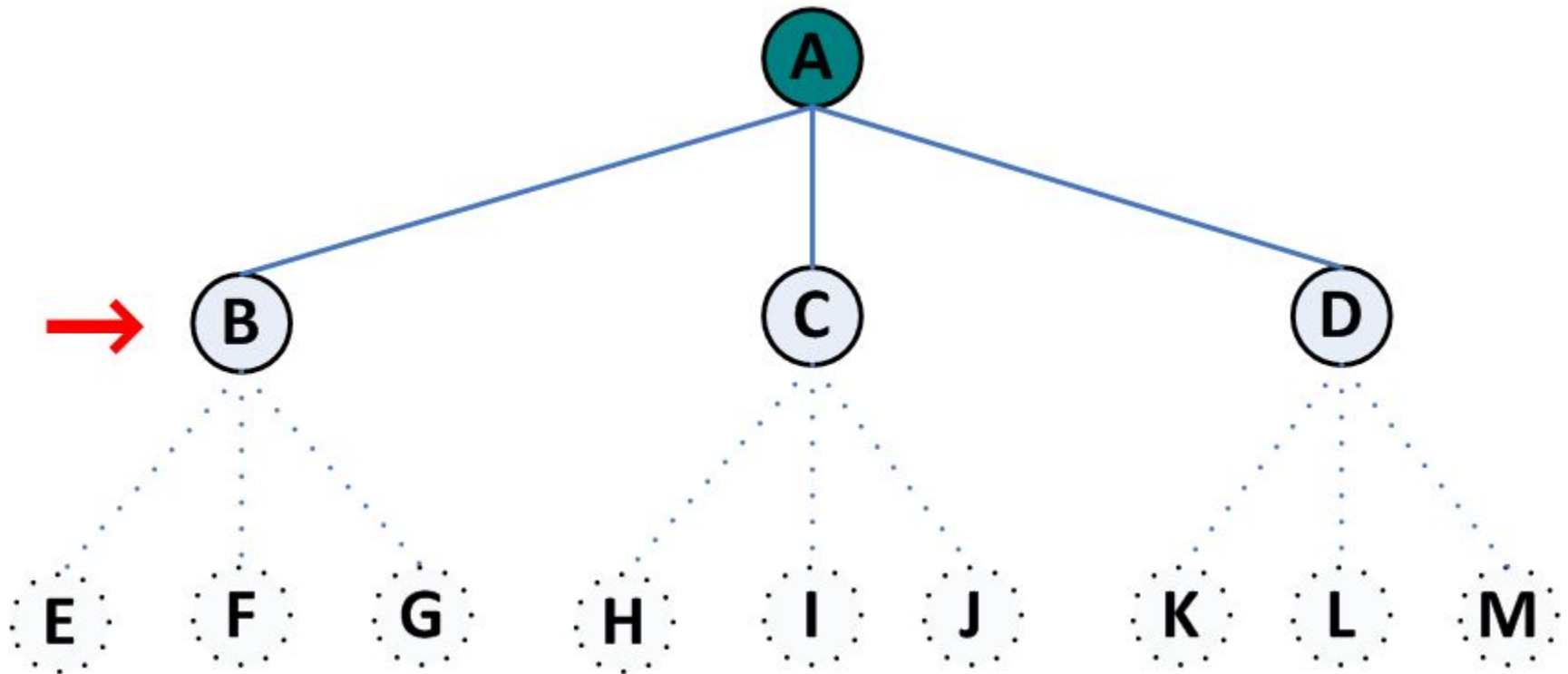
- **Optimal?**

- No. We may find a solution at a deep level, whereas a more optimal solution exists at a shallow level to the right side of the search tree

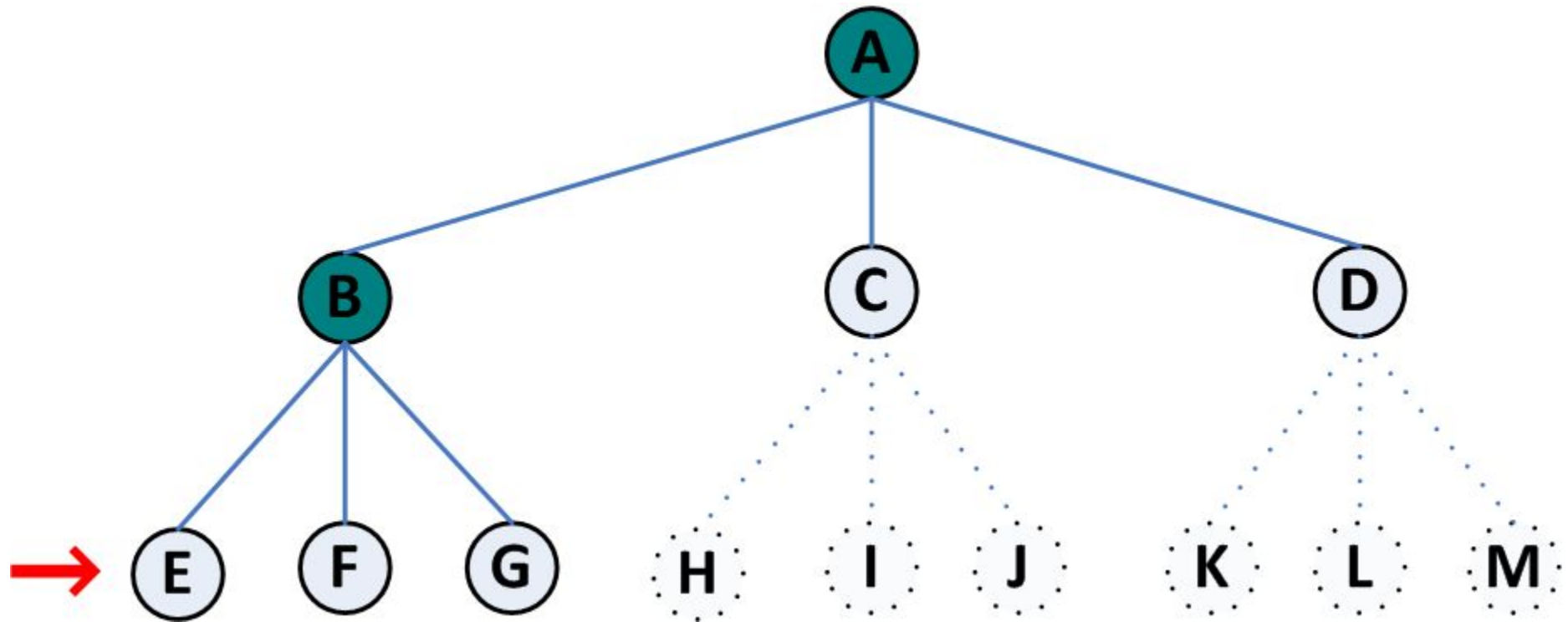
## Uninformed search. DFS Example



## Uninformed search. DFS Example

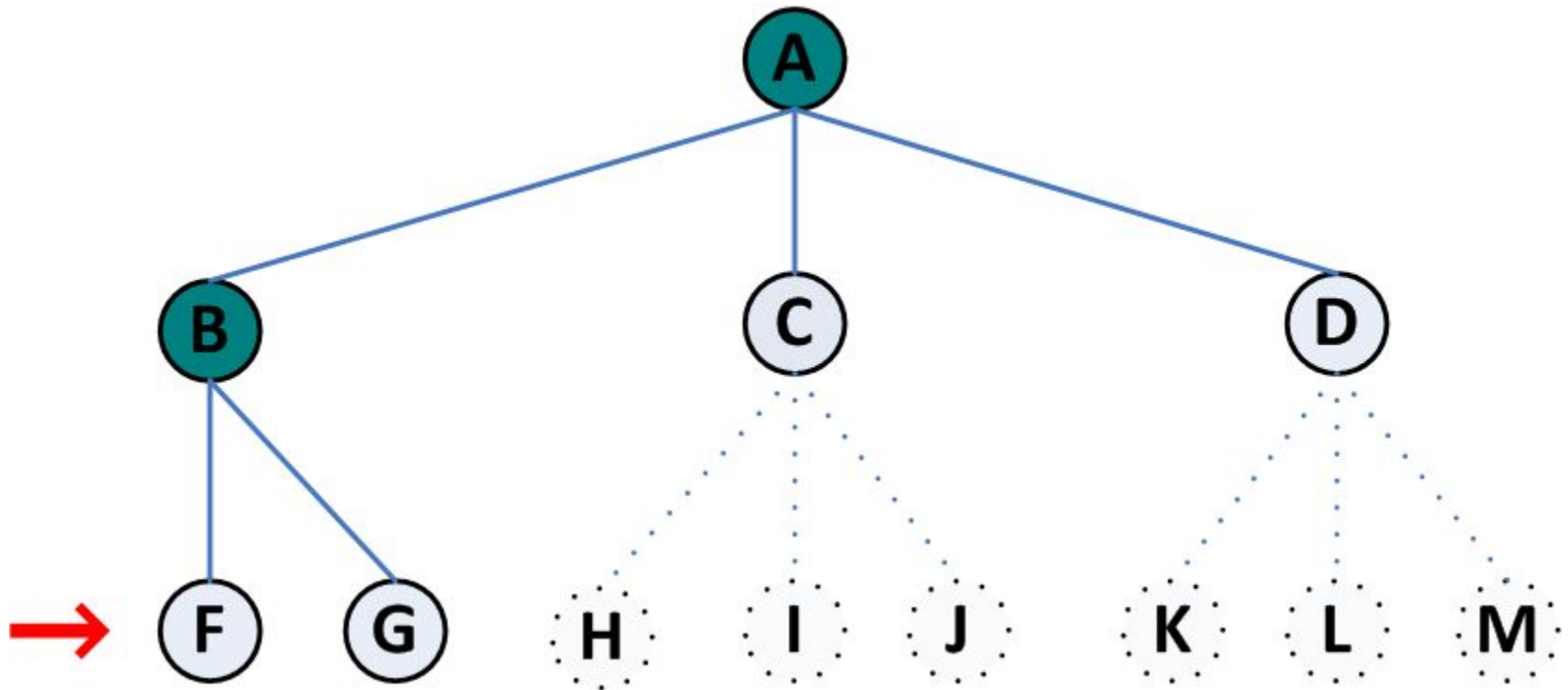


## Uninformed search. DFS Example

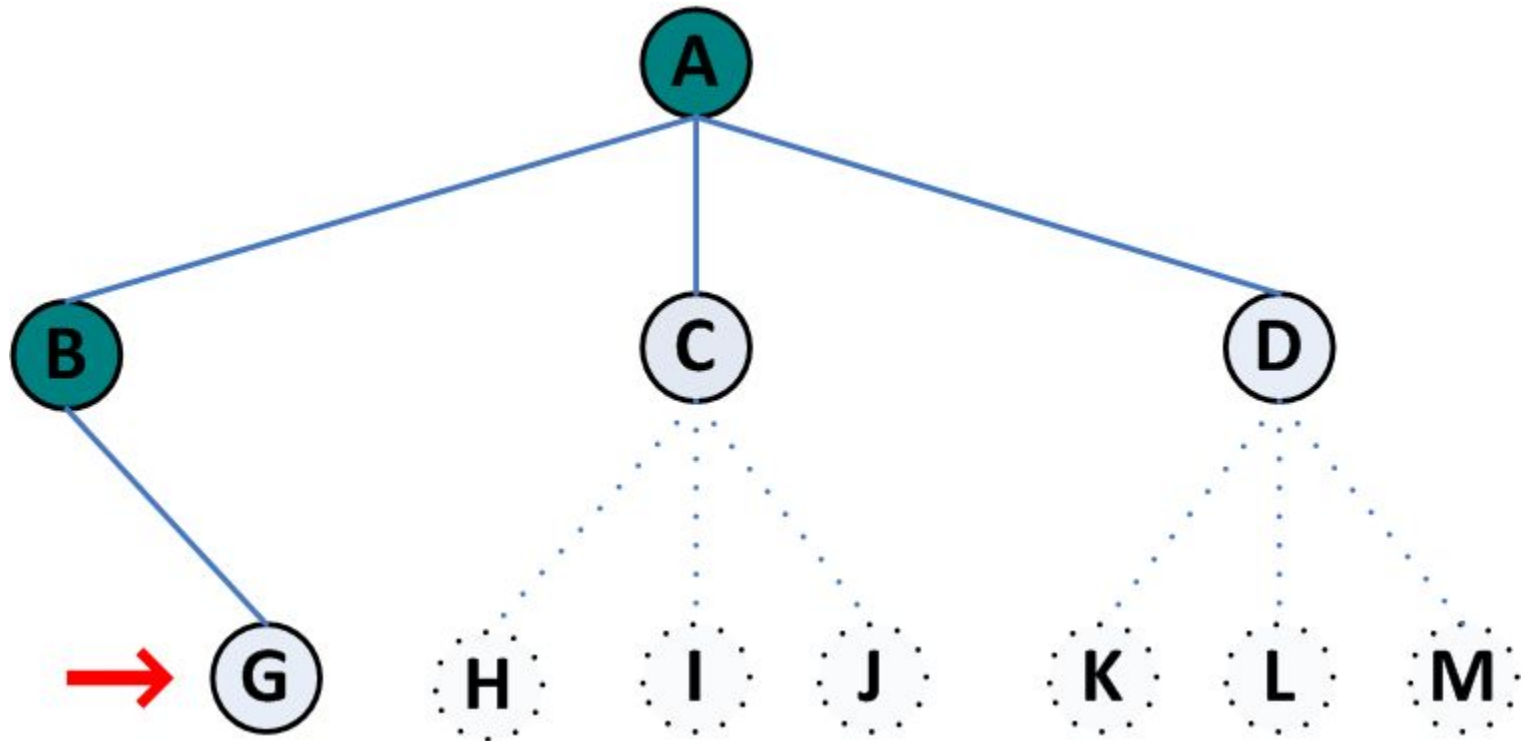




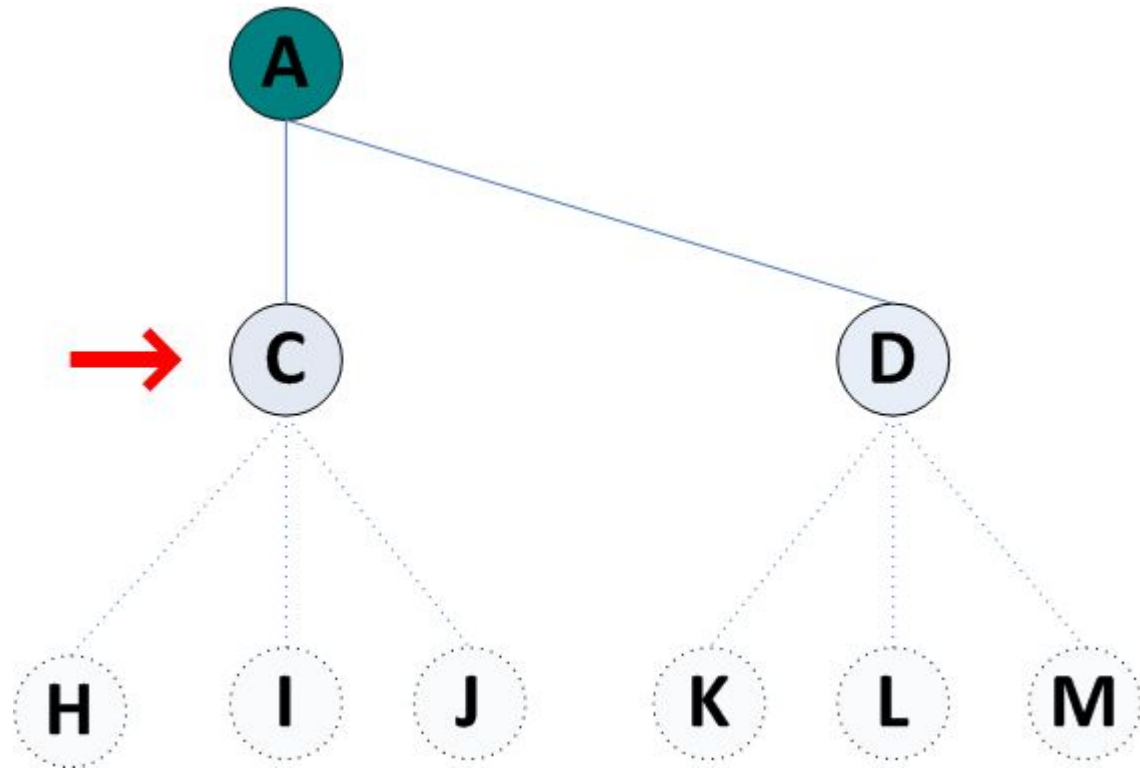
## Uninformed search. DFS Example



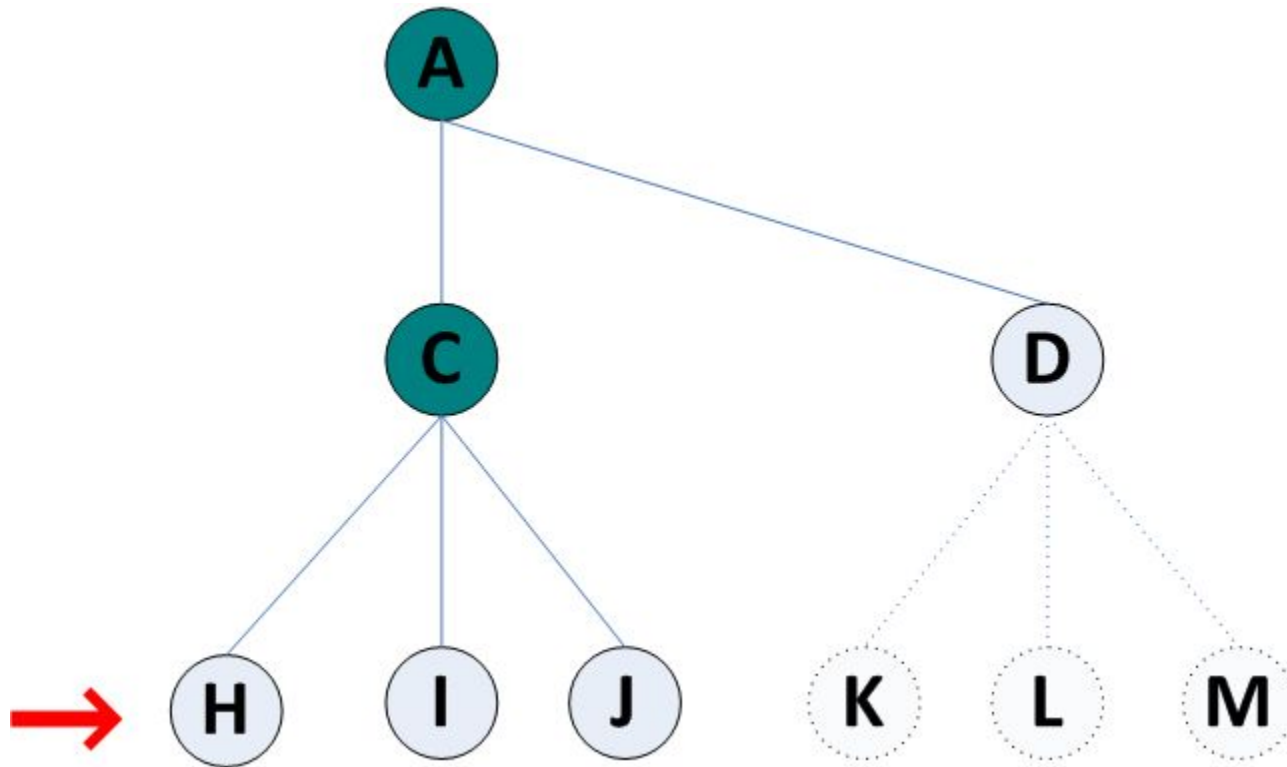
## Uninformed search. DFS Example



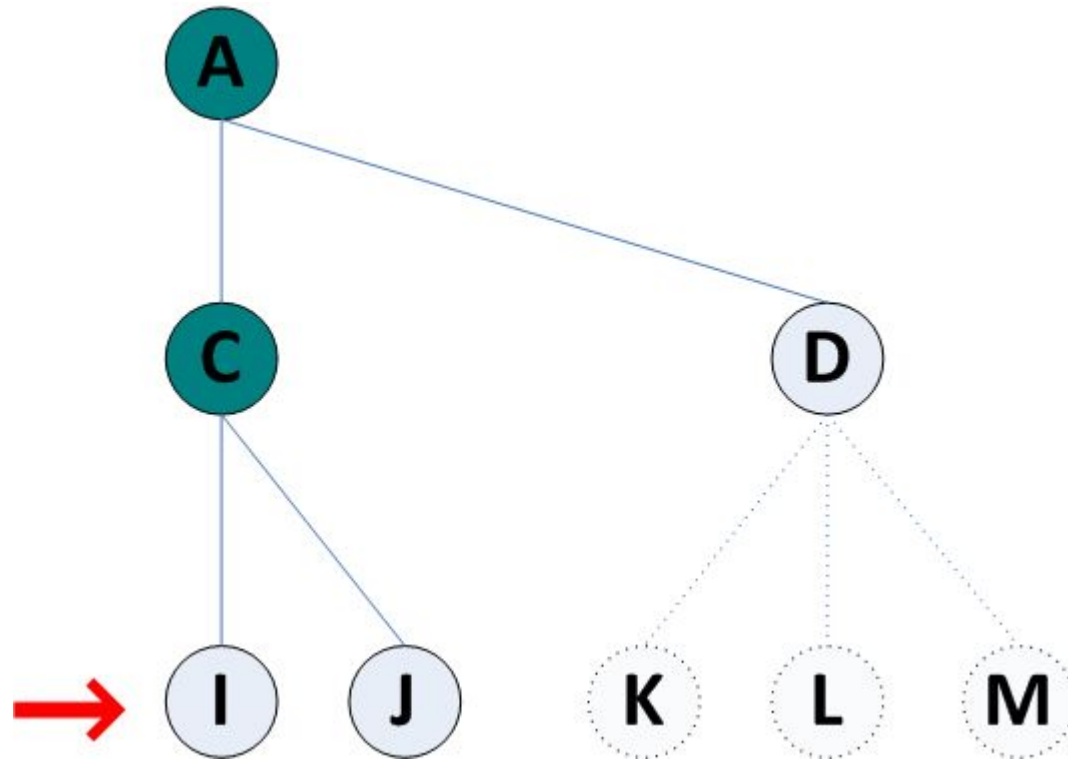
## Uninformed search. DFS Example



## Uninformed search. DFS Example



## Uninformed search. DFS Example



# Uninformed search. DFS

- **Complexity** in terms of branching factors  $b$  and depth  $d$
- **Time complexity:**
  - $O(b^d)$
- **Space complexity:**
  - $O(bd)$
  - Only the path from the root to the current expanded node needs to be saved
  - Once a node has been expanded, it can be removed from memory as soon as all its descendants have been fully explored

## Uninformed search. DFS vs BFS

- Branching factor:  $b=10$
- Each node requires 1KB of storage

Depth	Memory (Depth-first)	Memory (Breath-first)
2	<20 KB	107 KB
4	<40 KB	10.6 MB
6	<60 KB	1 GB
10	<100 KB	10 TB
16	156 KB	10 EB

## Uninformed search. Backtracking

- DFS, but only one successor is generated at a time rather than all successors
- Each partially expanded node remembers which successor to generate next
- Only  $O(d)$  memory is needed rather than  $O(bd)$ .
- Recursion



# Outline

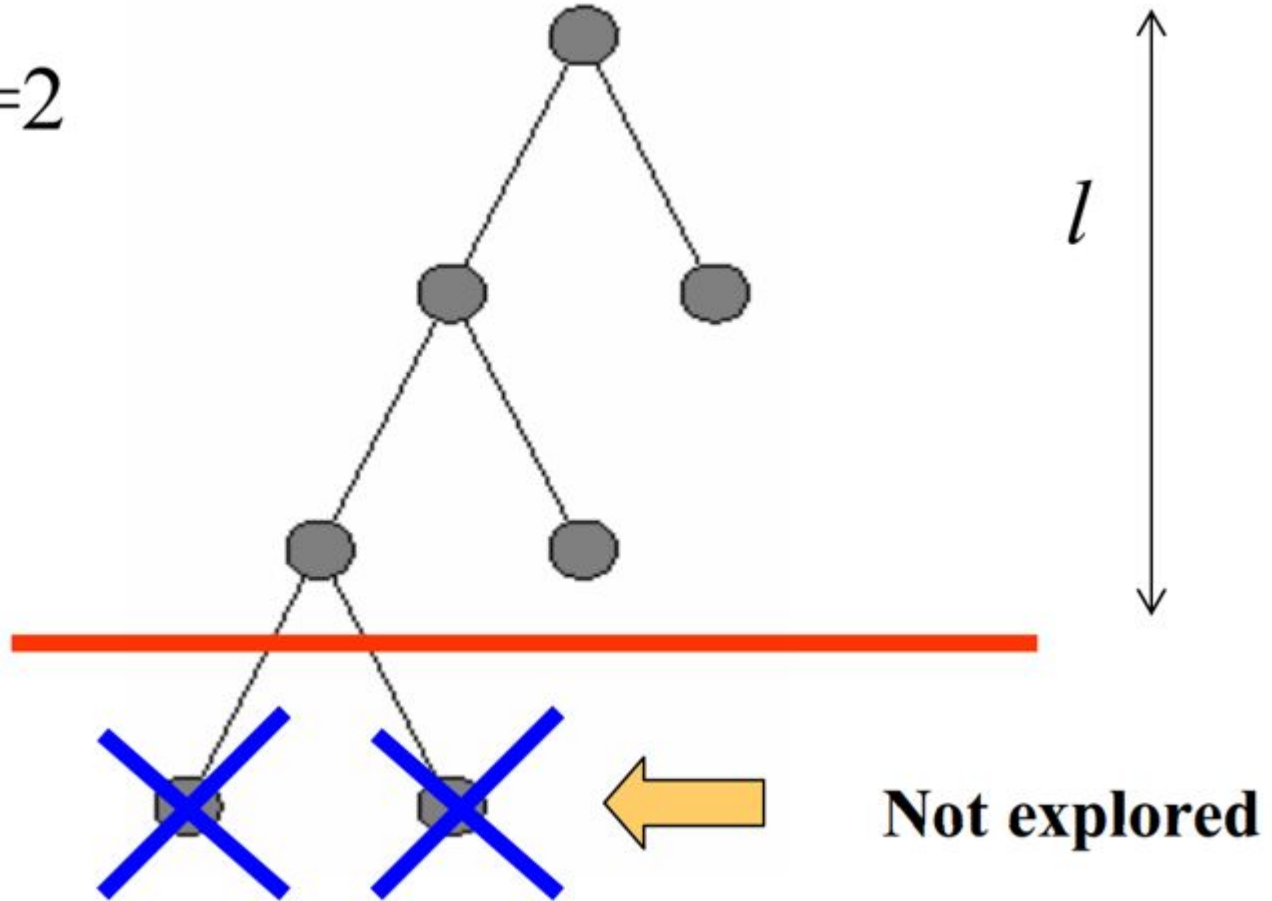
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## Uninformed search. Depth-limited search

- A depth limit  $L$  is assigned to the depth-first search algorithm
  - When the limit is reached, the algorithm returns with a cut off information which is different than a failure (no solution)
- When  $L < D$ , where  $D$  is the shallowest goal to be reached, the algorithm becomes incomplete
- When  $L > D$  the algorithm become non-optimal as described previously
- How to determine  $L$ ?

# Uninformed search. Depth-limited search

Limit  $l=2$



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# Uninformed search. Iterative Deepening Search

- This search algorithm finds out the best depth limit and does it by gradually **increasing** the limit until a goal is found
- Combines benefits of both **Depth-first search** and **Breadth-first search**
  - $O(bd)$  memory requirements
  - **Complete** when  $k$  is finite
  - **Optimum** when the path cost is a non-decreasing function of the depth of the node
- The main drawback is that it repeats all the work of the previous iteration

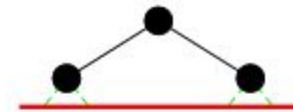
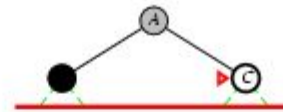
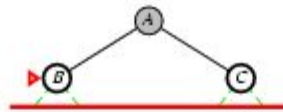
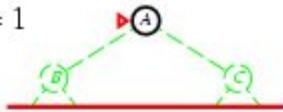
# Uninformed search. IDS. $L=0$

Limit = 0



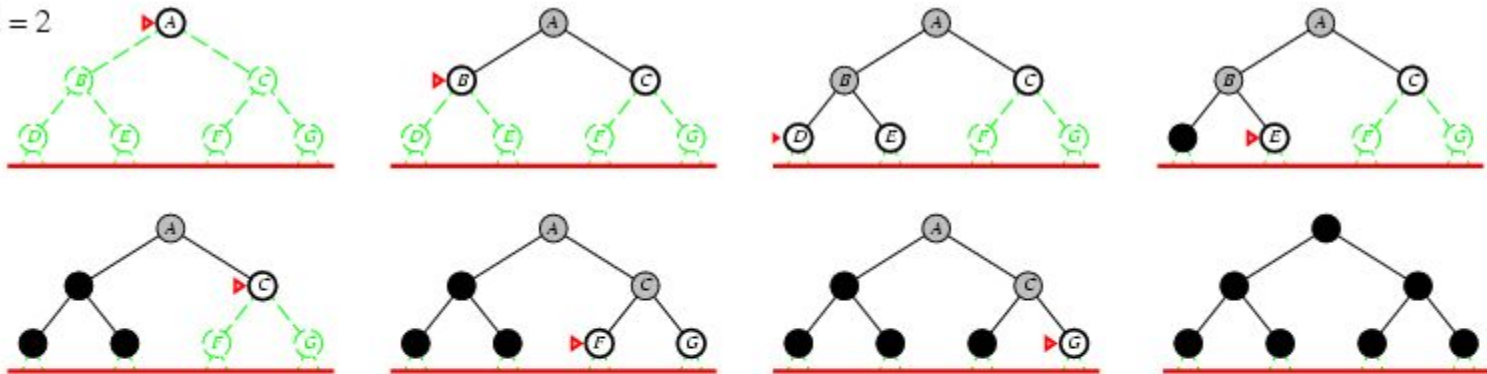
# Uninformed search. IDS. L=1

Limit = 1



# Uninformed search. IDS. L=2

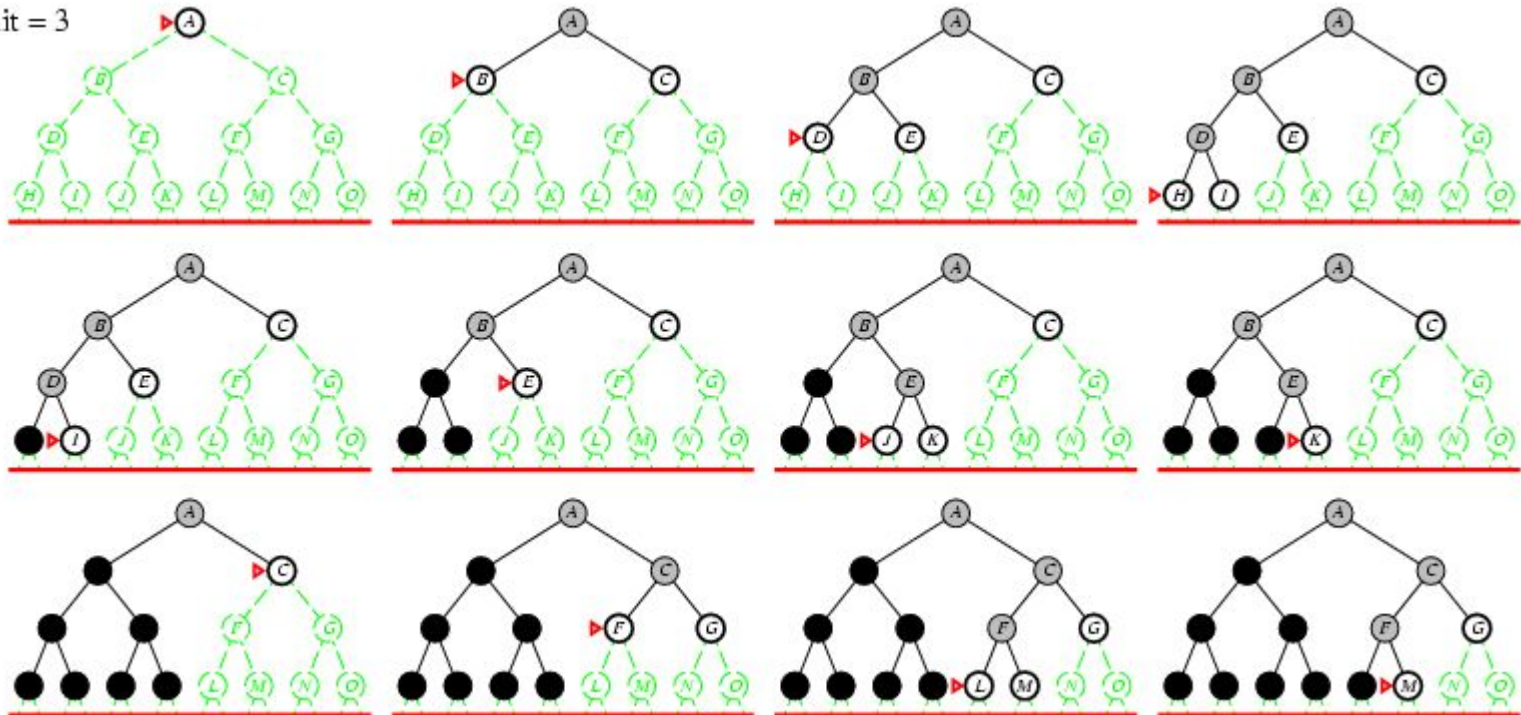
Limit = 2





# Uninformed search. IDS. L=3

Limit = 3



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## Uninformed search. Bidirectional search

- Bidirectional search algorithm runs two simultaneous searches:
  1. from initial state called as forward-search
  2. from goal node called as backward-search
- Bidirectional search replaces one single search graph with two small subgraphs
- The search stops when subgraphs intersect each other
- Bidirectional search can use search techniques such as BFS, DFS, DLS, etc.

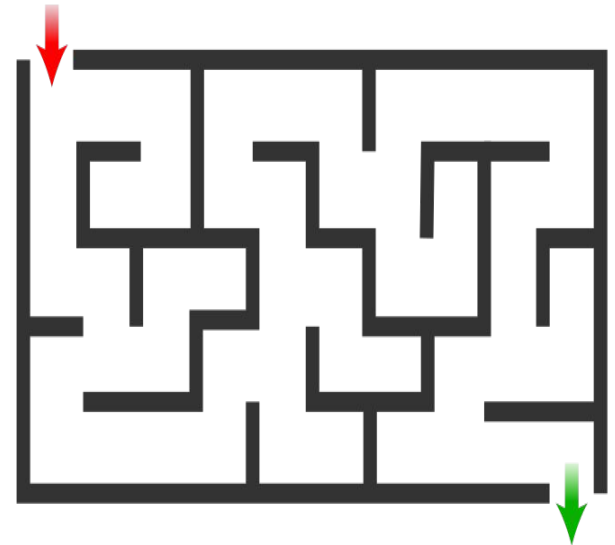
# Uninformed search. Bidirectional search

## Advantages:

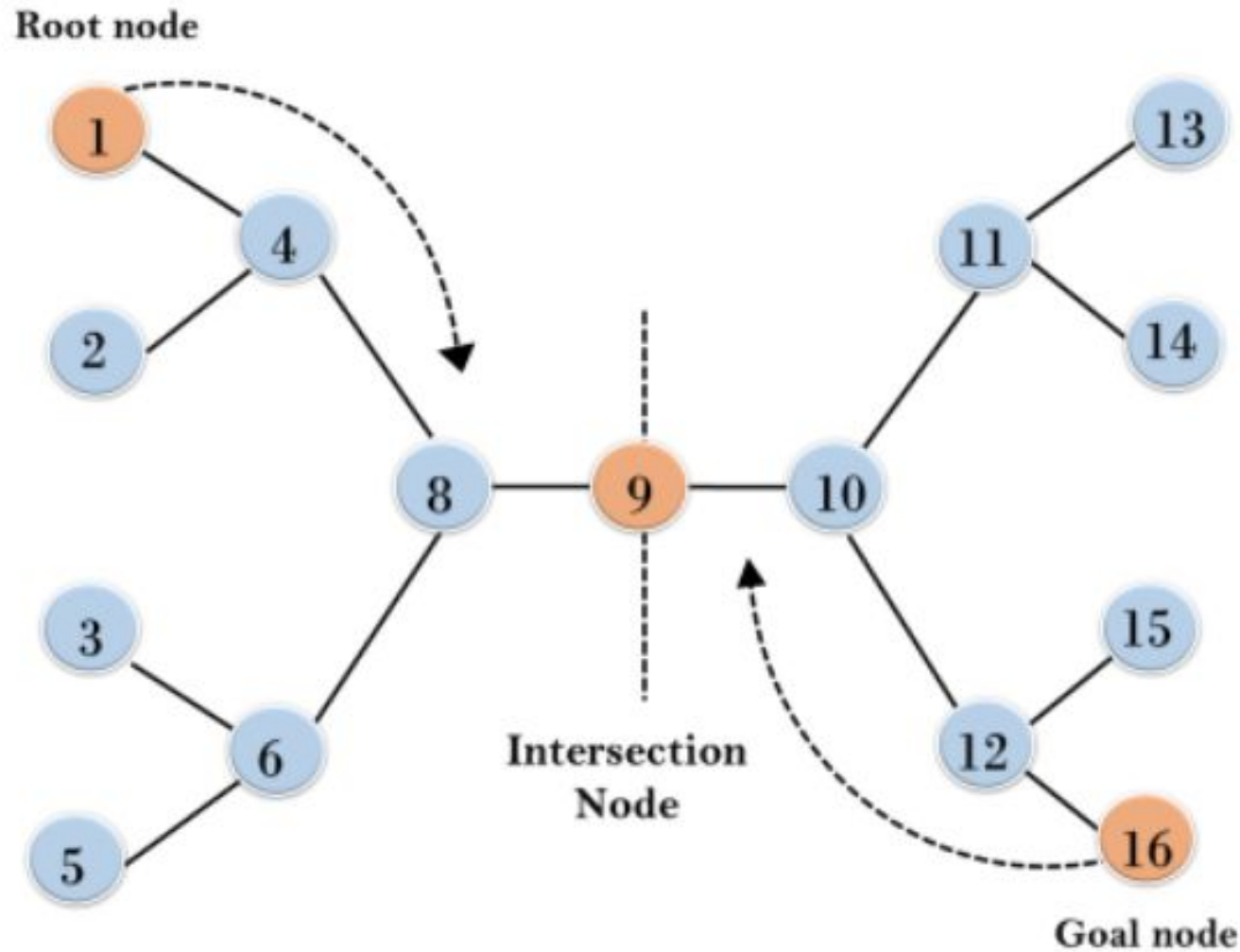
- Bidirectional search is fast
- Bidirectional search requires less memory

## Disadvantages:

- Implementation of the bidirectional search tree is difficult
- In bidirectional search, one should know the goal state in advance



# Uninformed search. Bidirectional search. Example



Uninformed search. Bidirectional search

**Completeness:**

Is complete if BFS is used in both searches

**Time Complexity:**

$O(b^d)$  using BFS

**Space Complexity:**

$O(b^d)$