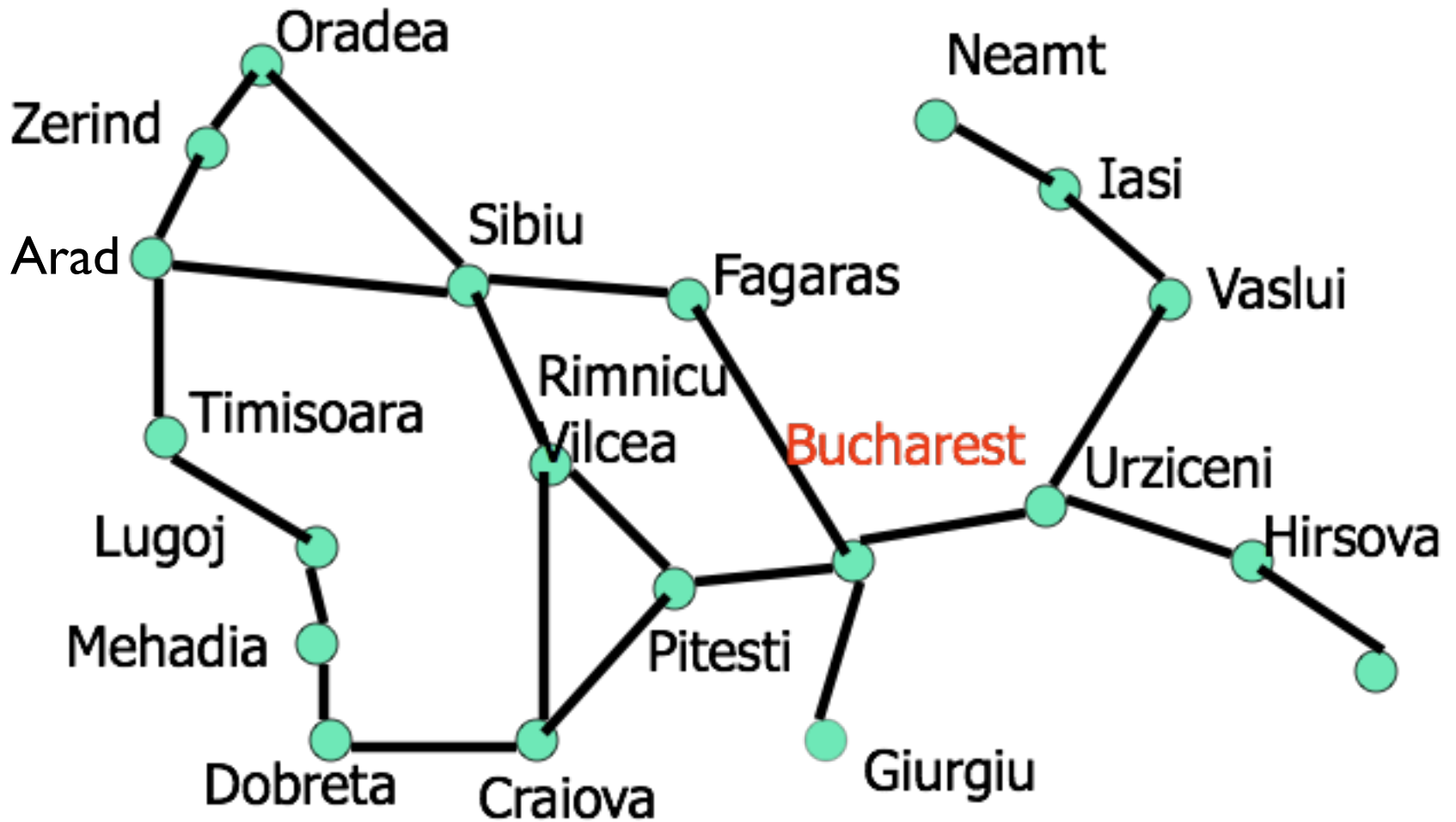


Blind search algorithms: DFS, BFS, iterative deepening

Devika Subramanian

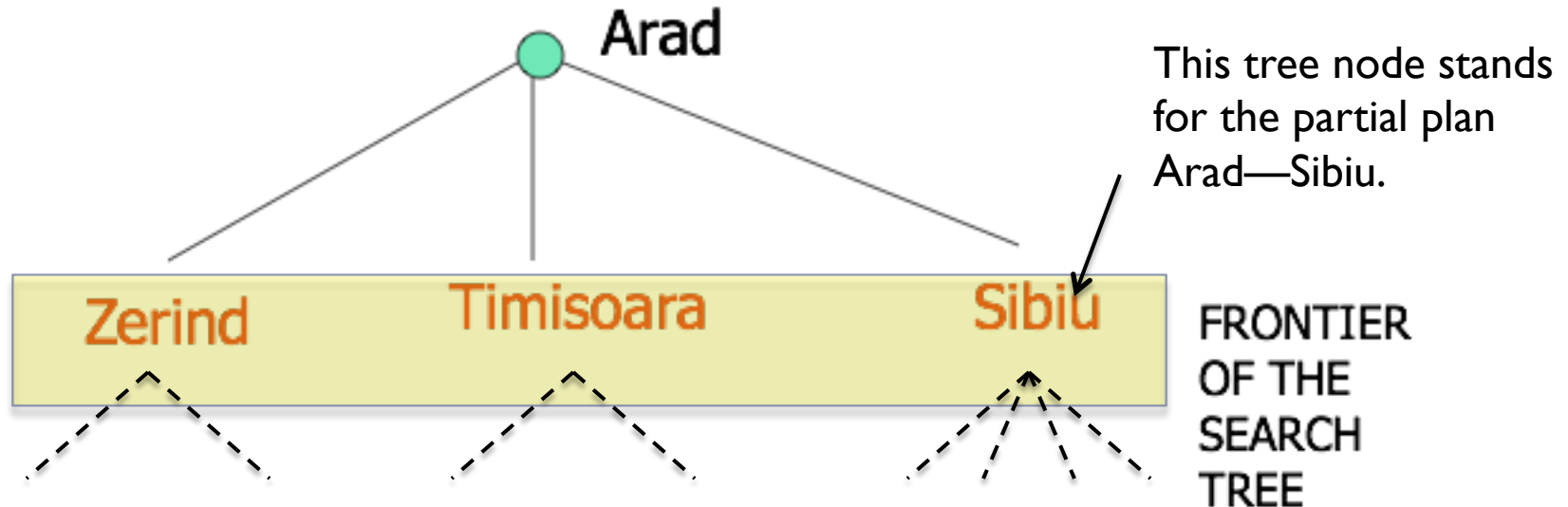
Route planning



Need for search algorithms

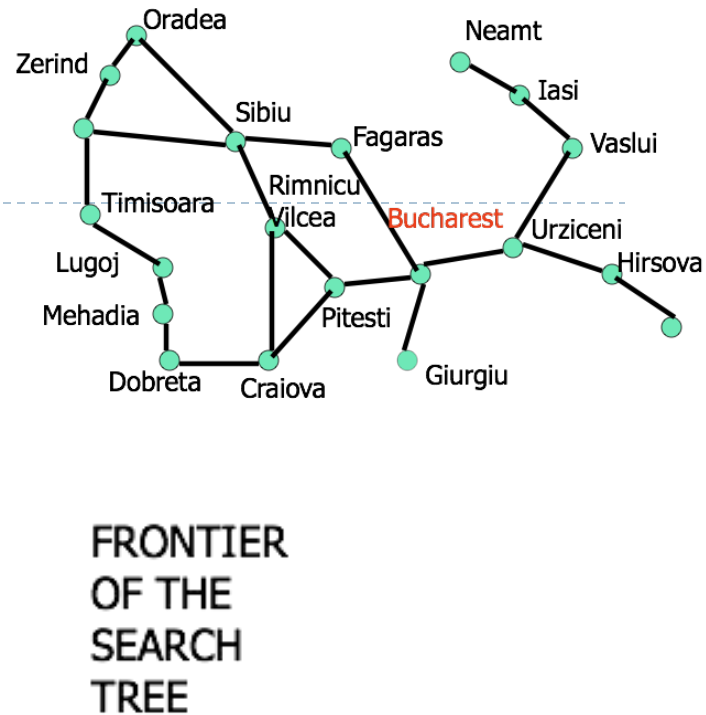
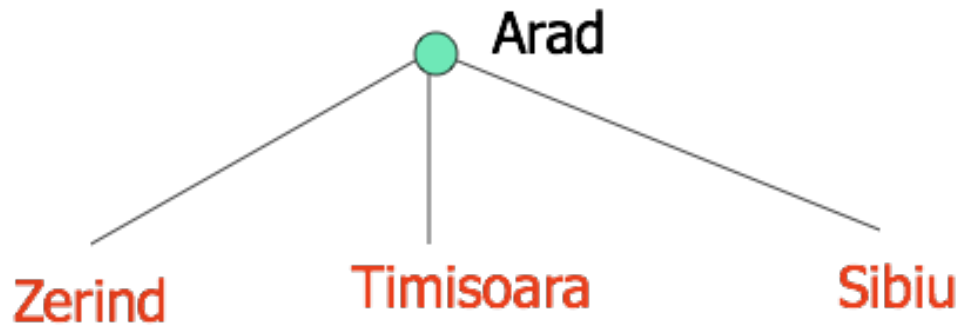
- ▶ Dynamic programming takes time proportional to the square of the size of the state space.
 - ▶ It finds shortest paths to a goal (e.g., Bucharest) from every node in the state space (e.g., every city in Romania).
- ▶ What if all we care about is getting between a given node (e.g., Arad) and a goal node (e.g., Bucharest)?
 - ▶ Can we solve this problem in time proportional to the size of the state space?
- ▶ This is what search algorithms are for: given a start state, a goal state and a state space graph, find a path between the two states.

Search tree



A tree is a graph in which any two vertices are connected by exactly one path.

Search tree



A tree is a graph in which any two vertices are connected by exactly one path.

- ◆ A what-if tree of plans and their outcomes
- ◆ The root node is the start state
- ◆ Children correspond to successor states
- ◆ Nodes also correspond to sequences of actions to achieve the state at the node
- ◆ For real problems, we never build the entire tree!

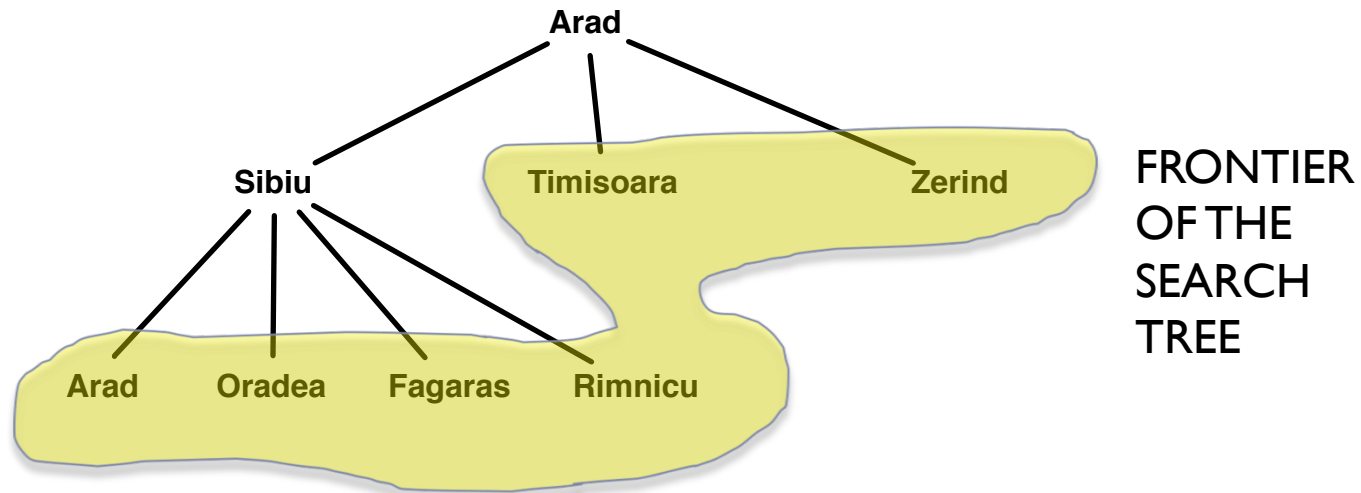
Search algorithms

- ▶ Which node in the frontier of the search tree to expand next?
- ▶ Two classes of search strategies
 - ▶ Uninformed: no information on distance to goal configuration.
 - ▶ Informed: use estimates of distance to goal configuration.

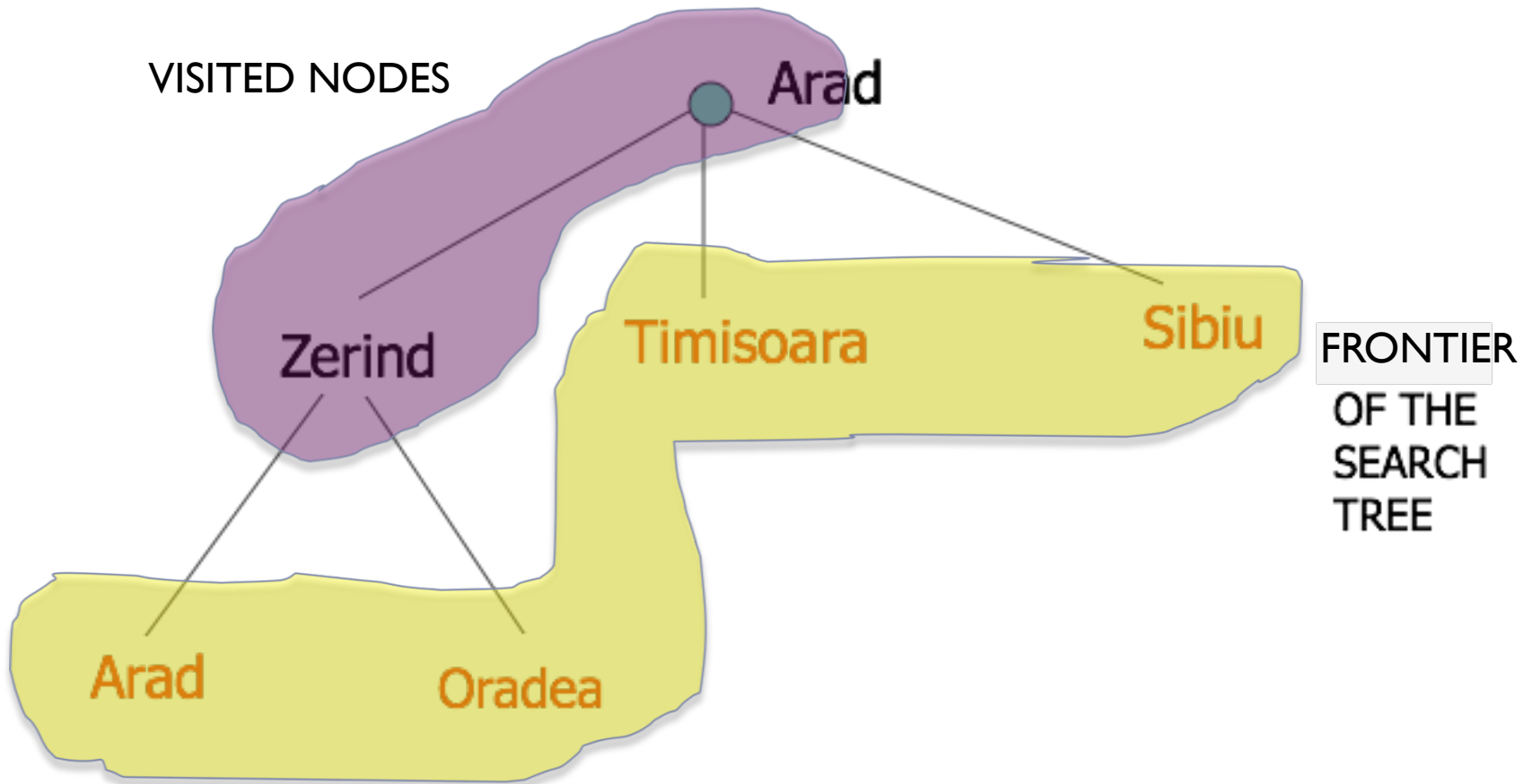
Depth-first search

- ▶ Always explore from the most recently added node, if it has any untried successors. Else, backup to the previous node on the current path.

Search tree for depth-first search



Search trees with visited nodes



Template for search algorithms

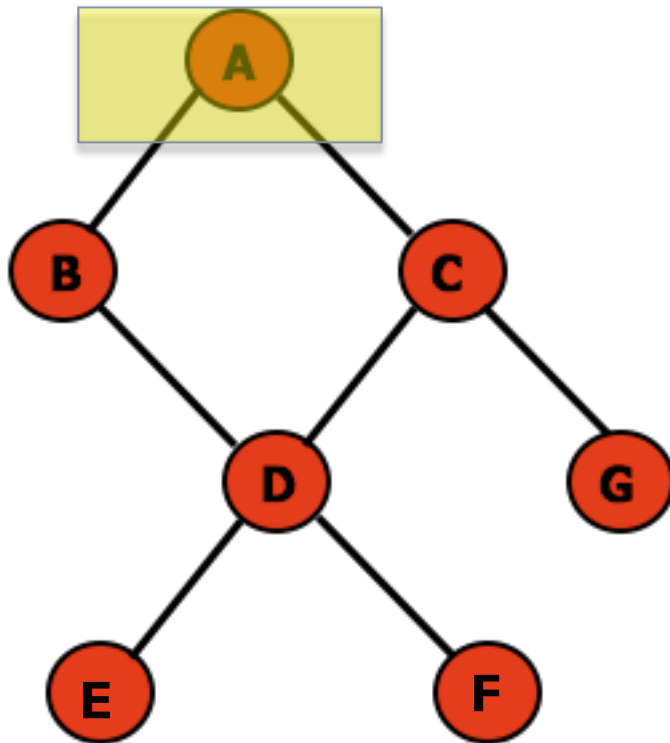
- ▶ Function SEARCH(start, end, graph, frontier) returns True or False
 - ▶ Insert start into the frontier.
 - ▶ Initialize the visited list to empty.
 - ▶ while frontier is nonempty:
 - ▶ current = **remove** node from frontier
 - ▶ add current to the visited list
 - ▶ If current node == end, return True.
 - ▶ for every nbr of current node not in visited
 - **insert** nbr into frontier
 - ▶ return False.

Depth-first search

- ▶ Policy for adding and removing entries from the frontier
 - ▶ **stack**: last in, first out

Depth-first search (DFS) : a stack frontier

Find a path from A to G



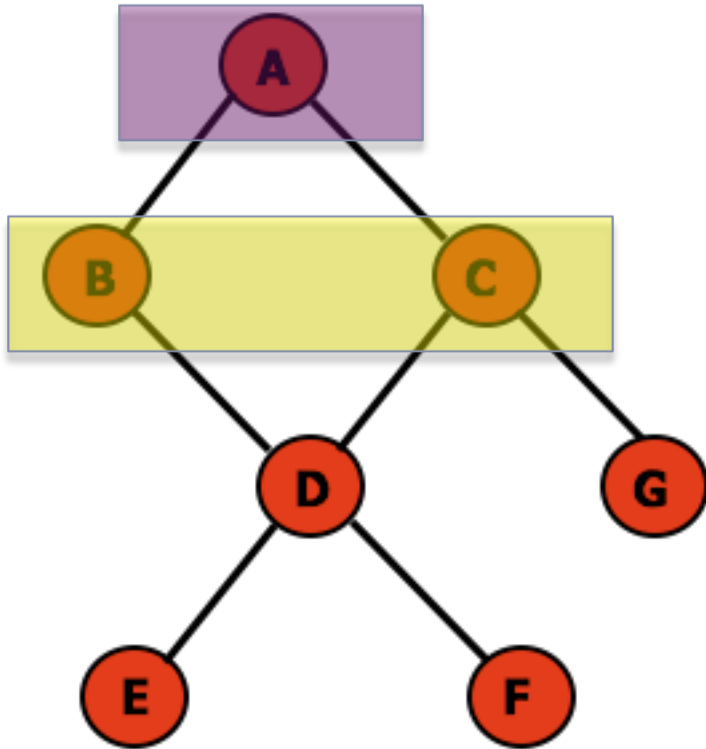
Frontier

Visited

A

frontier starts with A
visited is empty

Depth-first search (DFS): a stack frontier



Frontier

Visited

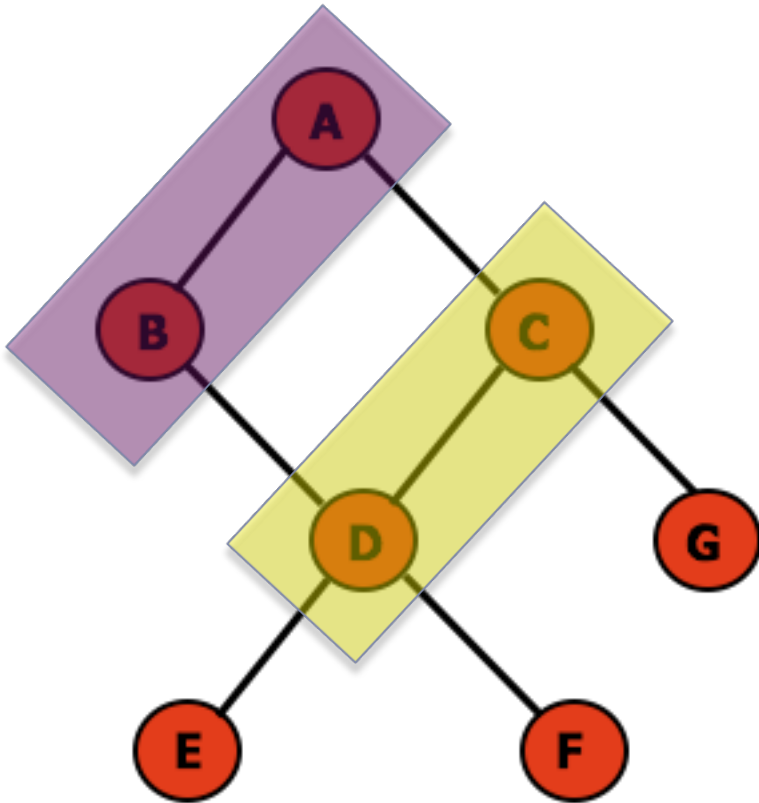
B
C

A

The top node of **frontier** is **current**.
Remove **current** from **frontier**
and move it to **visited**.

for every nbr of **current** not in **visited**
insert nbr into **frontier**

Depth-first search (DFS): a stack frontier



Frontier

D
C

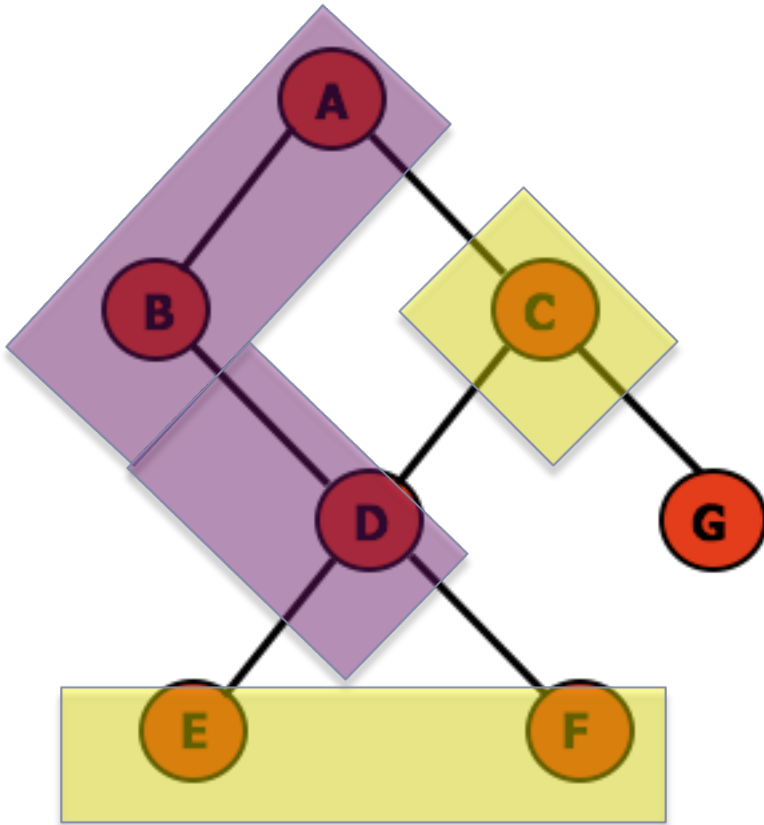
Visited

A
B

The top node of **frontier** is **current**.
Remove **current** from **frontier**
and move it to **visited**.

for every nbr of **current** not in **visited**
insert nbr into **frontier**

Depth-first search (DFS): a stack frontier



Frontier

E
F
C
~~C~~

Visited

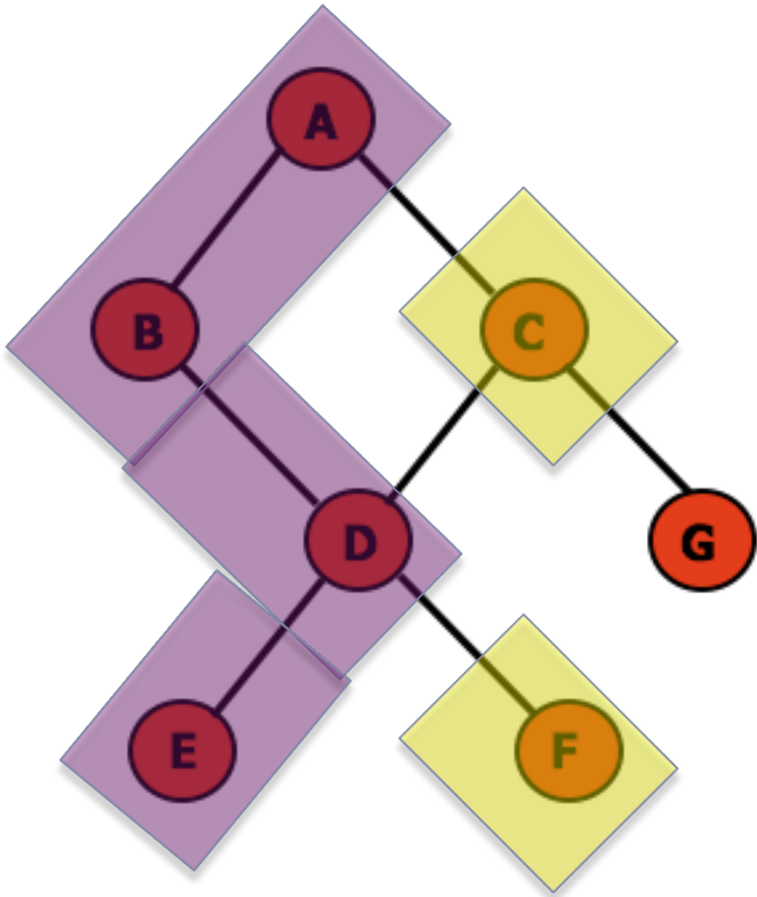
A
B
D

The top node of **frontier** is **current**.
Remove **current** from **frontier**
and move it to **visited**.

for every nbr of **current** not in **visited**
insert nbr into **frontier**

If you generate a node which is already
on the frontier, remove the one already
in frontier and insert the new one.

Depth-first search (DFS): a stack frontier



Frontier

F
C

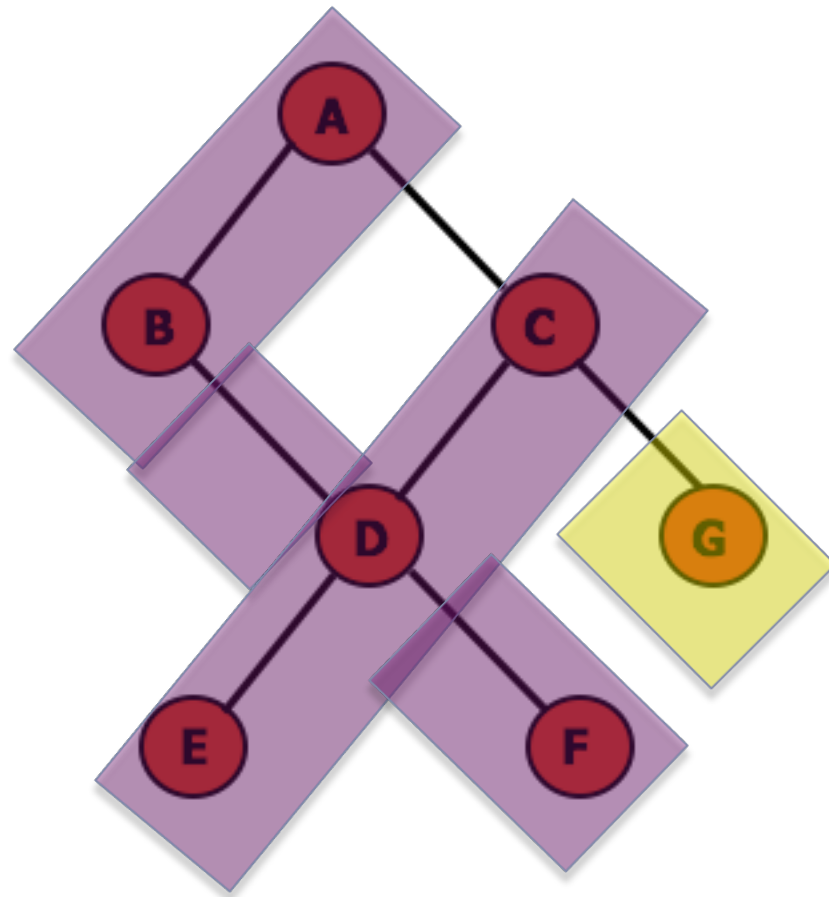
Visited

A
B
D
E

The top node of **frontier** is **current**.
Remove **current** from **frontier**
and move it to **visited**.

for every nbr of **current** not in **visited**
insert nbr into **frontier**

Depth-first search (DFS): a stack frontier



Frontier

G

Visited

**A
B
D
E
F
C**

The top node of **frontier** is **current**.
Remove **current** from **frontier**
and move it to **visited**.

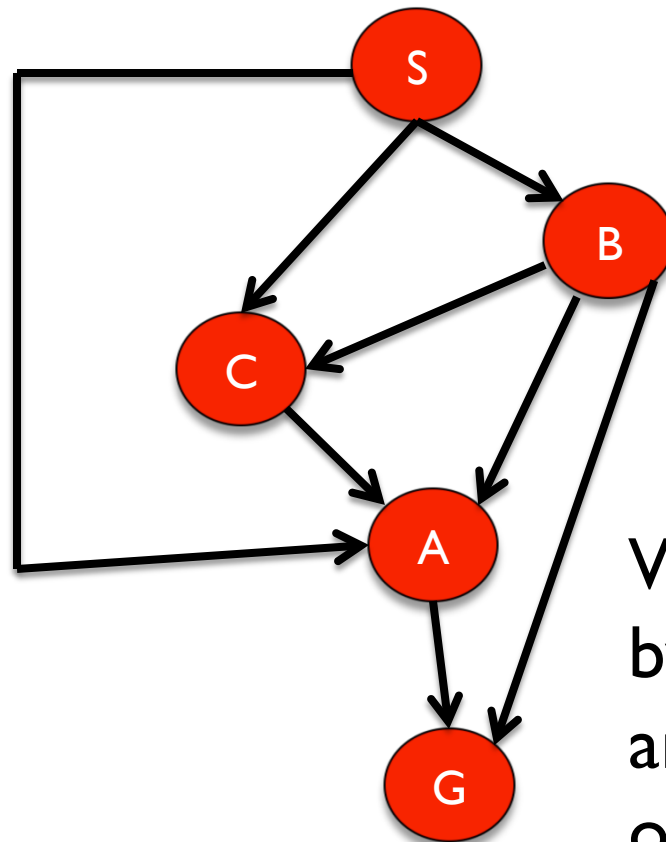
for every nbr of **current** not in **visited**
insert nbr into **frontier**

G is the goal node and it is current. We have found a path.

How to manage the frontier for DFS

- ▶ To get the current node, pop the frontier list
- ▶ To insert a new node n ,
 - ▶ if node n already exists in frontier, remove it from frontier
 - ▶ Add the new node n to the front of the frontier list.

Path selected by DFS from S to G



Which path is selected by DFS assuming ties are broken in alphabetical order?

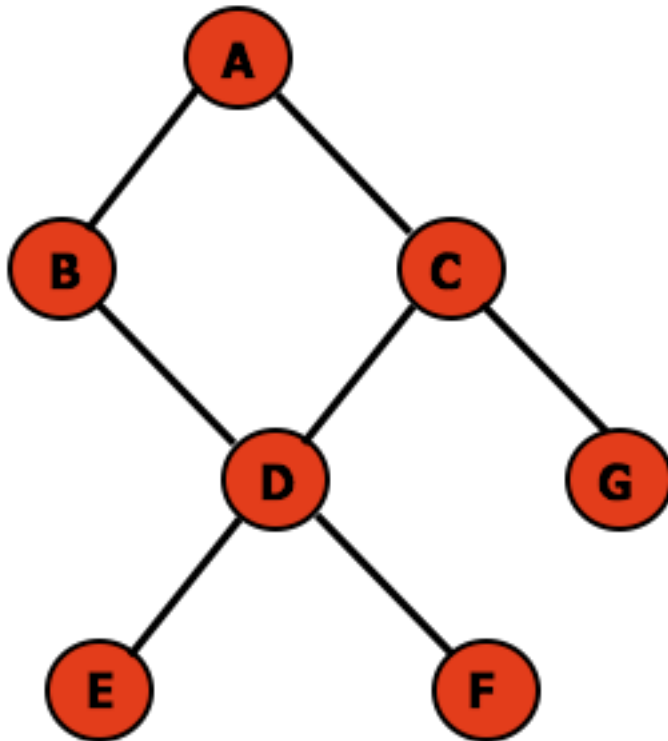
$S \rightarrow A$ explored before $S \rightarrow B$

Template for search algorithms

- ▶ Function SEARCH(start, end, graph, frontier) returns True or False
 - ▶ Insert start into the frontier.
 - ▶ Initialize the visited list to empty.
 - ▶ while frontier is nonempty:
 - ▶ current = **remove** node from frontier
 - ▶ add current to the visited list
 - ▶ If current node == end, return True.
 - ▶ for every nbr of current node not in visited
 - **insert** nbr into frontier
 - ▶ return False.

Breadth-first search (BFS): a queue frontier

Find a path from A to G



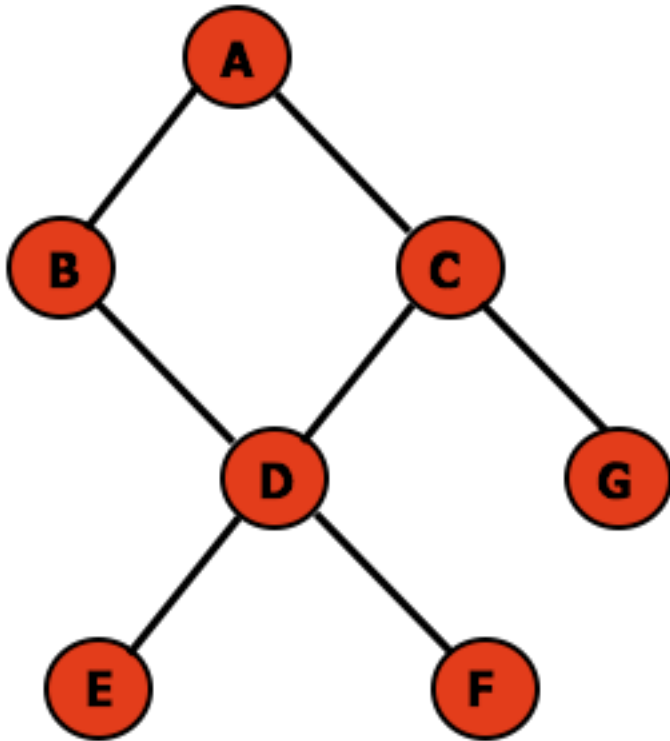
Frontier

Visited

A

frontier starts with A
visited is empty

Breadth-first search (BFS): queue frontier



Frontier

Visited

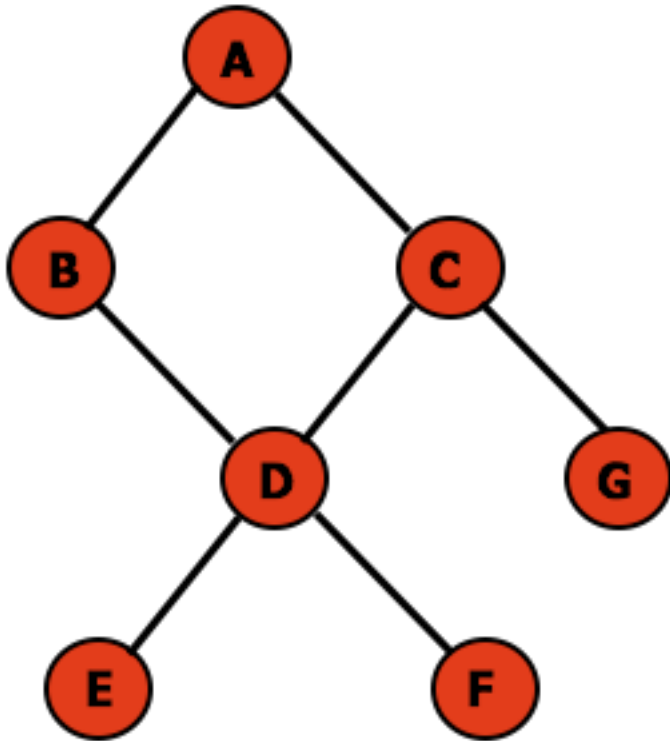
B
C

A

The top node of **frontier** is **current**.
Remove **current** from **frontier**
and move it to **visited**.

for every nbr of **current** not in **visited**
insert nbr into **frontier**

Breadth-first search (BFS): queue frontier



Frontier

C
D

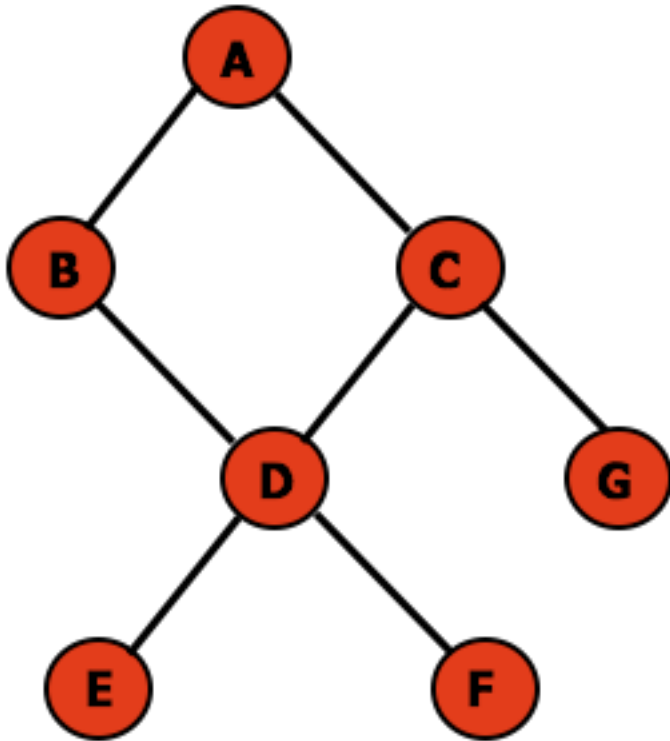
Visited

A
B

The top node of **frontier** is **current**.
Remove **current** from **frontier**
and move it to **visited**.

for every nbr of **current** not in **visited**
insert nbr into **frontier**

Breadth-first search (BFS): queue frontier



Frontier

D
G

Visited

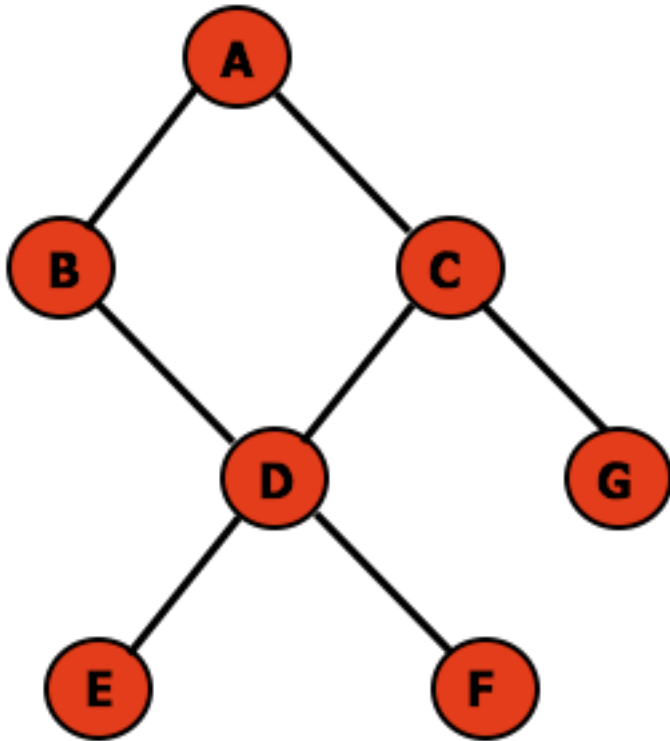
A
B
C

The top node of **frontier** is **current**.
Remove **current** from **frontier**
and move it to **visited**.

for every nbr of **current** not in **visited**
insert nbr into **frontier**

If you generate a node which is already on the frontier, do not insert it into frontier.

Breadth-first search (BFS): queue frontier



Frontier

G
E
F

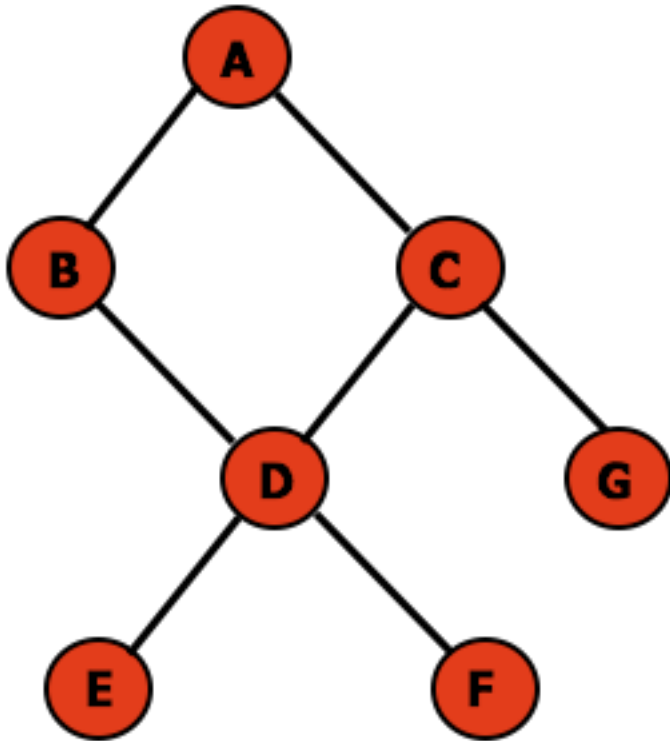
Visited

A
B
C
D

The top node of **frontier** is **current**.
Remove **current** from **frontier**
and move it to **visited**.

for every nbr of **current** not in **visited**
insert nbr into **frontier**

Breadth-first search (BFS): queue frontier



Frontier

G
E
F

Visited

A
B
C
D

The top node of **frontier** is **current**.
Remove **current** from **frontier**
and move it to **visited**.

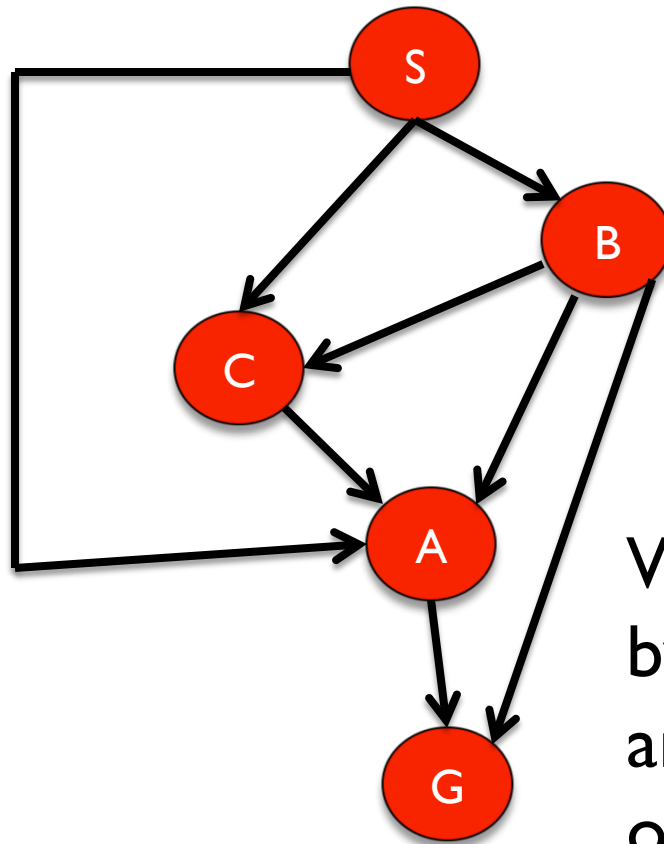
for every nbr of **current** not in **visited**
insert nbr into **frontier**

G is the goal node and it is current. We have found a path.

How to manage the frontier for BFS

- ▶ To get the current node, get the node at the front of the frontier list
- ▶ To insert a new node n ,
 - ▶ if node n already exists in frontier, do not insert it into frontier
 - ▶ Add the new node n to the back of the frontier list.

Path selected by BFS from S to G



POLL

Which path is selected by BFS assuming ties are broken in alphabetical order?

$S \rightarrow A$ explored before $S \rightarrow B$

Template for search algorithms

- ▶ Function SEARCH(start, end, graph, frontier) returns True or False
 - ▶ Insert start into the frontier.
 - ▶ Initialize the visited list to empty.
 - ▶ while frontier is nonempty:
 - ▶ current = **remove** node from frontier
 - ▶ add current to the visited list
 - ▶ If current node == end, return True.
 - ▶ for every nbr of current node not in visited
 - **insert** nbr into frontier
 - ▶ return False.

REMOVAL from frontier:

Last-in first-out: DFS

First-in first-out: BFS

INSERTION into frontier:

Front of list: DFS

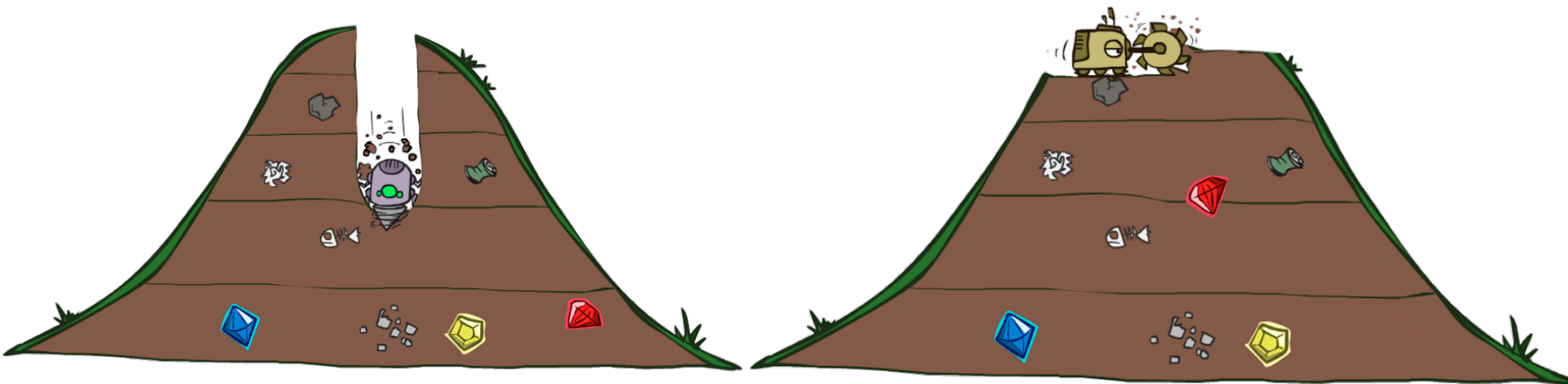
End of list: BFS

DUPLICATES in frontier:

Replace with new: DFS

Delete new: BFS

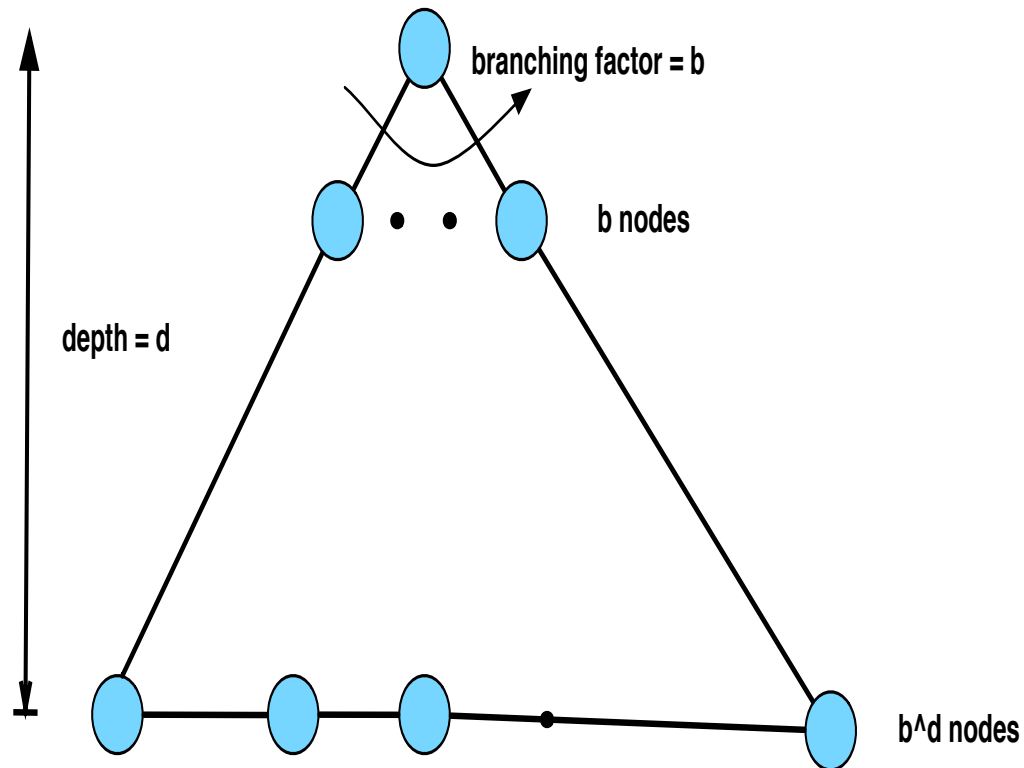
DFS vs BFS



Slide courtesy of Dan Klein/Peter Abeel

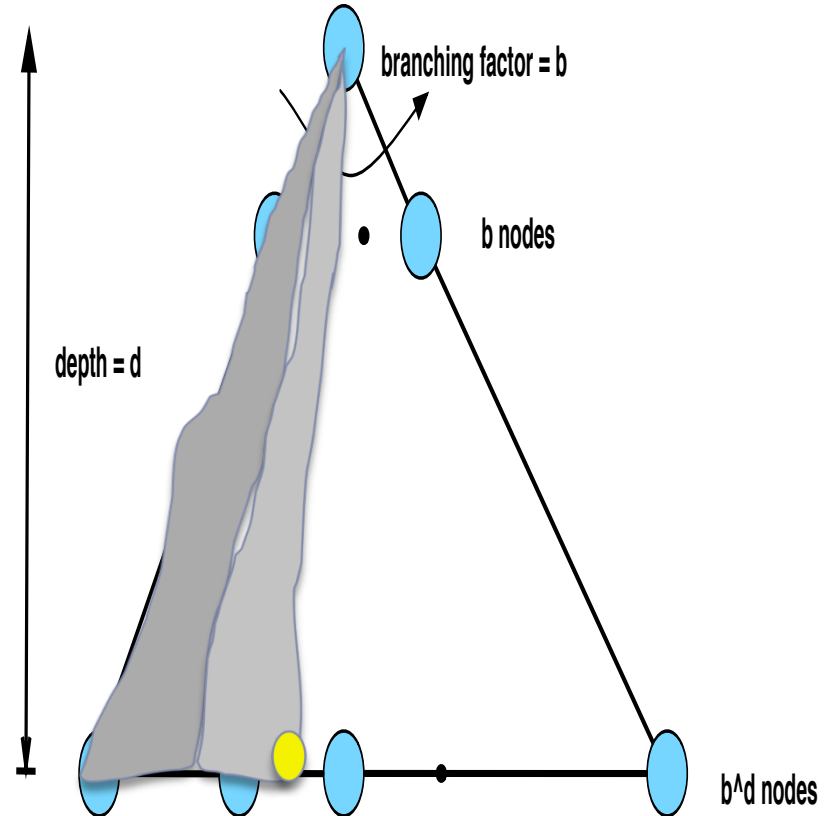
Search Algorithm properties

- ▶ **Complete:** guaranteed to find a solution if one exists.
- ▶ **Optimal:** Guaranteed to find the least cost path.
- ▶ **Time complexity:** big- O analysis in terms of branching factor b and depth d (i.e., size of the state space)
- ▶ **Space complexity:** big- O analysis in terms of branching factor b and depth d (i.e., size of the state space)



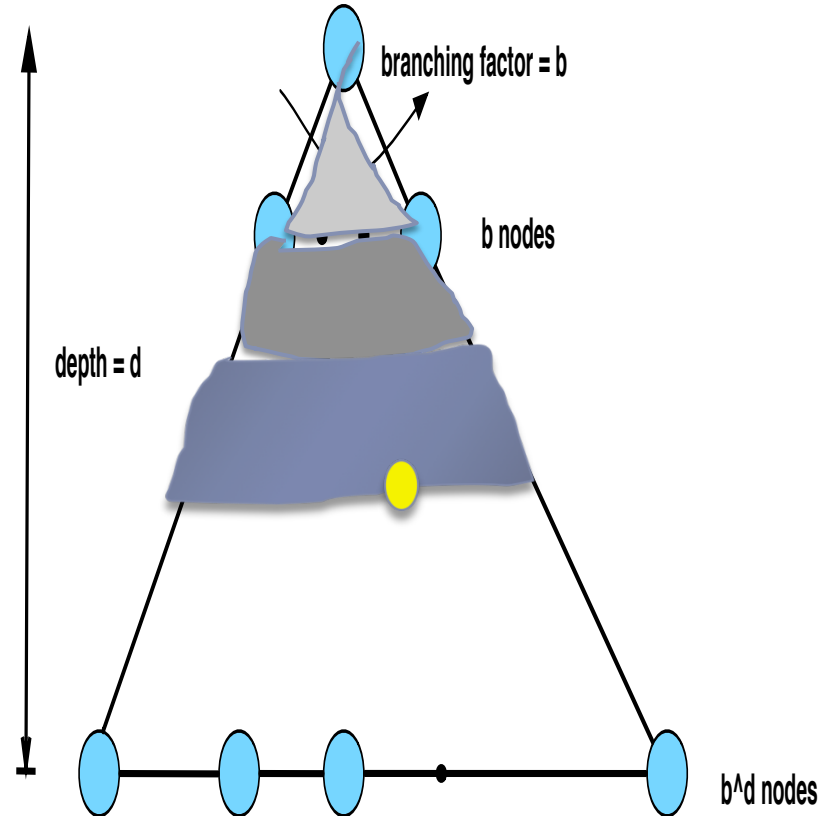
Properties of DFS

- ▶ Is DFS complete?
 - ▶ If we can prevent cycles, DFS is complete.
- ▶ Is DFS optimal?
 - ▶ No, it finds the “leftmost” solution.
- ▶ Time complexity
 - ▶ If no infinite paths, then $O(b^d)$
- ▶ Space complexity
 - ▶ Only has children on path to root, so $O(bd)$



Properties of BFS

- ▶ Is BFS complete?
 - ▶ If there is a solution, BFS will find it.
- ▶ Is BFS optimal?
 - ▶ Yes, if all edge costs are 1; no, otherwise because BFS finds “shallowest” solution.
- ▶ Time complexity
 - ▶ $O(b^s)$ if s is the depth of the solution.
- ▶ Space complexity
 - ▶ $O(b^s)$ if s is the depth of the solution.



DFS v BFS

- ▶ Give an example where BFS outperforms DFS.
- ▶ Give an example where DFS outperforms BFS.

Depth-limited DFS

- ▶ Function depth-limited-DFS (start, end, graph, frontier, d) returns True or False
 - ▶ Insert start into the **stack** frontier.
 - ▶ Initialize the visited list to empty.
 - ▶ while frontier is nonempty:
 - ▶ current = **remove** node from frontier
 - ▶ add current to the visited list
 - ▶ If current node == end, return True.
 - ▶ for every nbr of current node not in visited
 - **insert** nbr into frontier **if depth of nbr ≤ d**
 - ▶ return False.

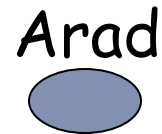
Depth-limited DFS properties

- ▶ Is it complete?
- ▶ Is it optimal?
- ▶ What is its time complexity?
- ▶ What is its space complexity?

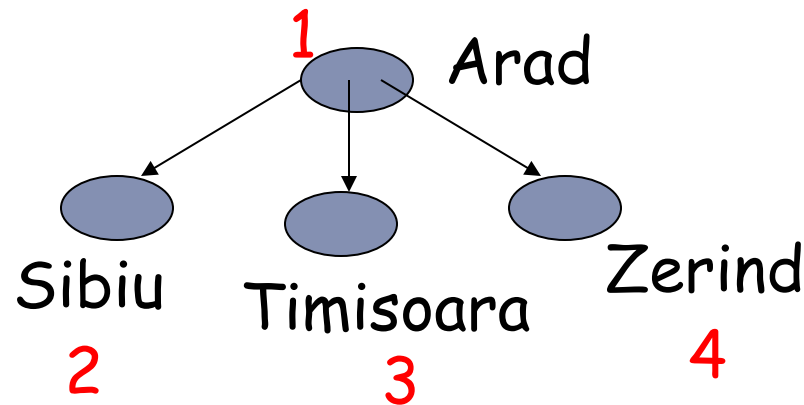
Iterative deepening

- ▶ Function iterative-deepening (start,end,graph,frontier) returns a solution or failure
 - ▶ for depth = 0 to ∞ do
 - ▶ if depth-limited-DFS(start,end,graph,frontier,d) succeeds then return its result
 - ▶ end for
 - ▶ return failure

Iterative deepening in action



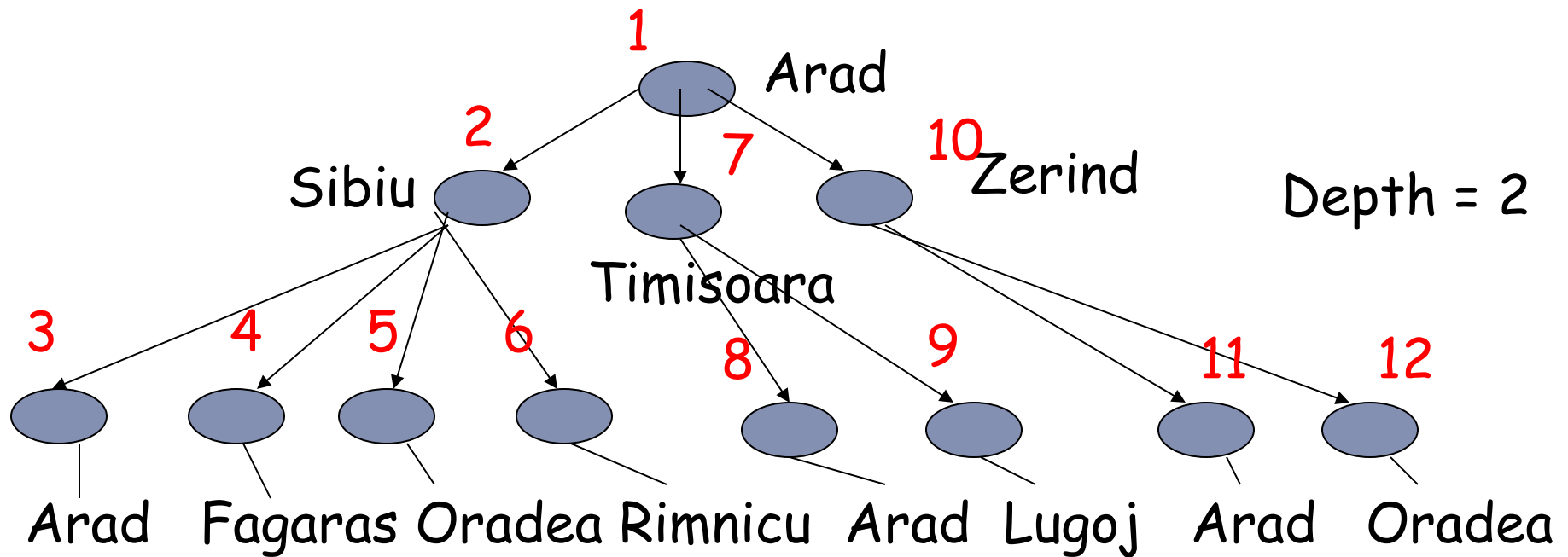
Depth = 0



Depth = 1

Tree generated in a depth-first fashion. Order of expansion of nodes indicated in red.

Iterative deepening in action (contd.)



Order of node expansions indicated in red.

Properties of iterative deepening search

- ▶ It is complete. It systematically considers all paths of lengths 1,2,3,
- ▶ It is optimal when all edge costs are 1; it finds the shortest-hop solution. Not optimal for general edge costs.
- ▶ Its time complexity is $O(b^d)$, where b is the branching factor and d , the solution depth of the search space.
 - ▶ $O(b) + O(b^2) + \dots + O(b^d) = O(b^d)$
- ▶ Its space complexity is $O(bd)$.