

# Solving Problems by Searching

CS 486/686: Introduction to Artificial Intelligence  
Winter 2016

# Introduction

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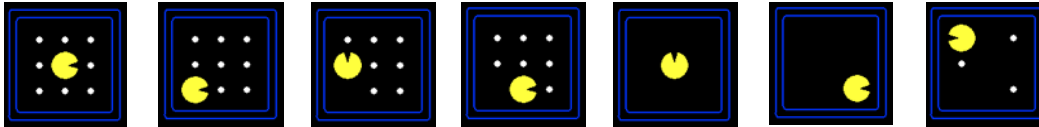
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- Search was one of the first topics studied in AI
  - Newell and Simon (1961) *General Problem Solver*
- Central component to many AI systems
  - Automated reasoning, theorem proving, robot navigation, scheduling, game playing,...

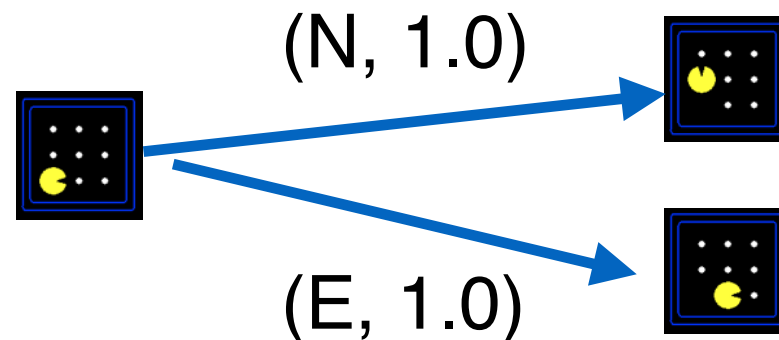
# Search Problems

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- A **search problem** consists of

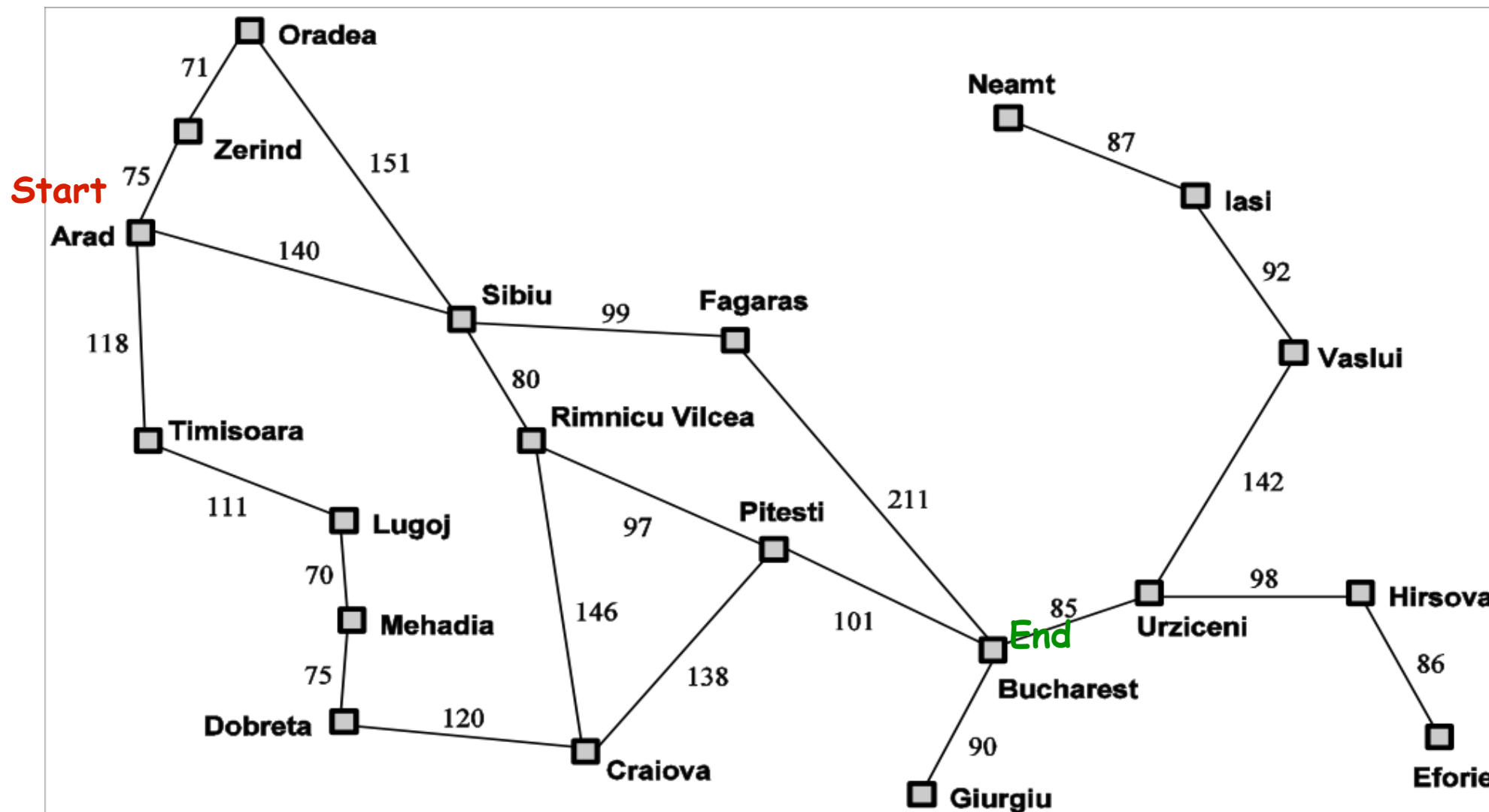
- a state space 

- a successor function (actions, cost)



- a start state and a goal test
- A **solution** is a sequence of actions (plan) from the start state to a goal state

# Example: Traveling in Romania

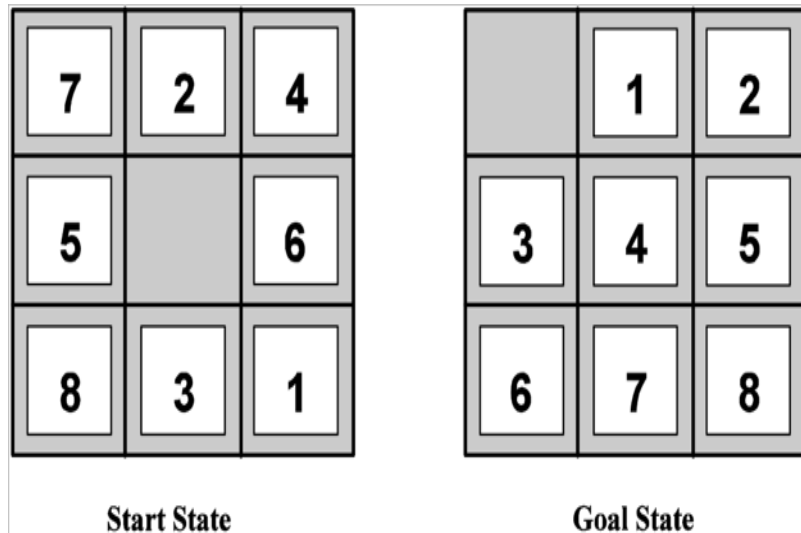


- States:
- Initial State:
- Successor Function:
- Goal test:
- Solution:

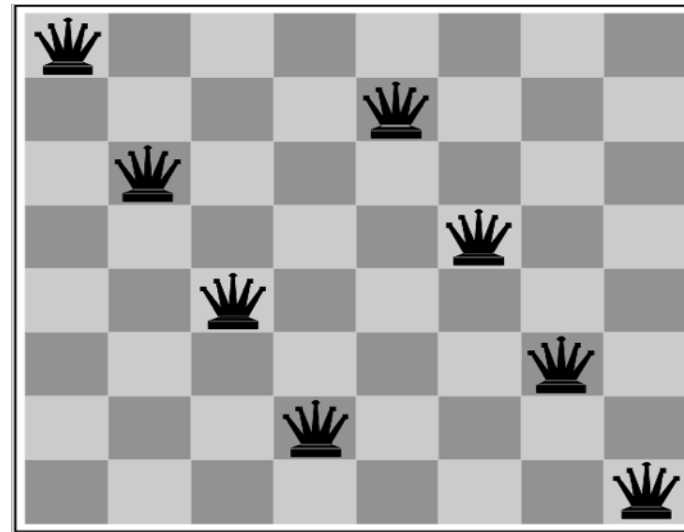
# Examples of Search Problems

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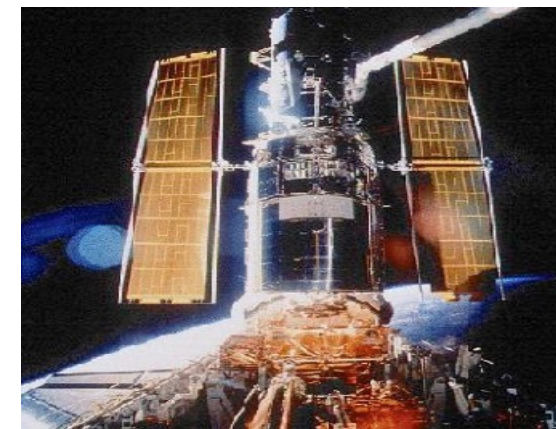
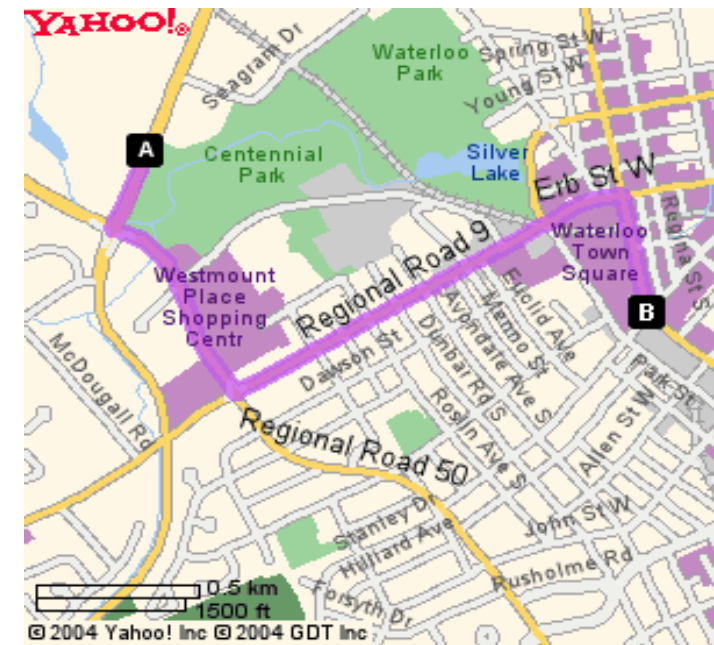
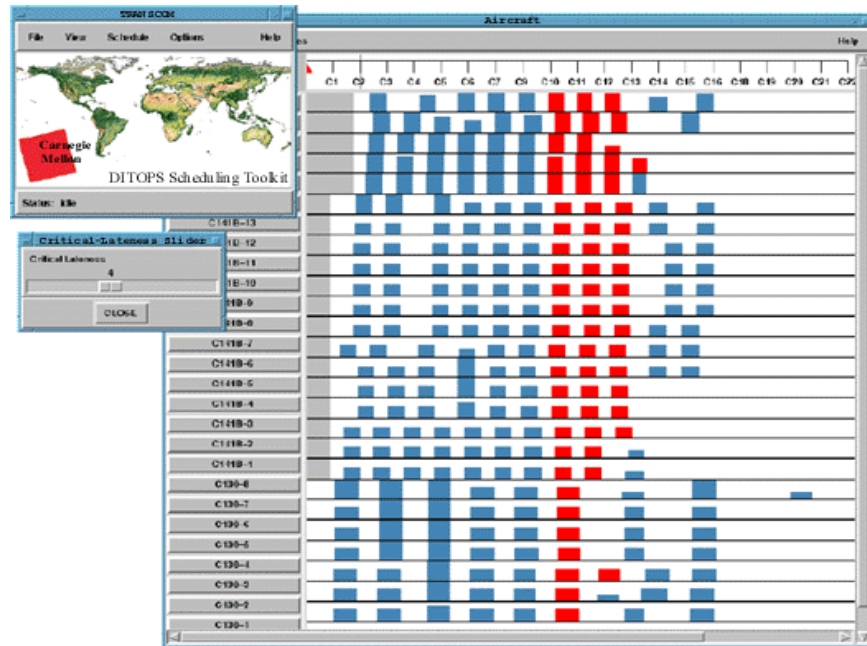


- States:
- Initial State:
- Successor Function:
- Goal test:
- Solution:



- States:
- Initial State:
- Successor Function:
- Goal test:
- Solution:

# Examples of Search Problems



# Our Definition Excludes...

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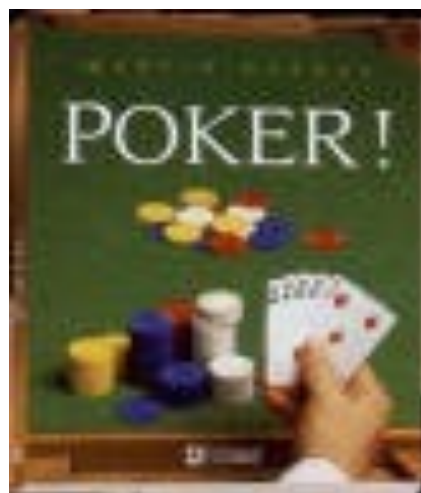
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Chance



Adversaries

Continuous states



Partial  
Observability



All of the above

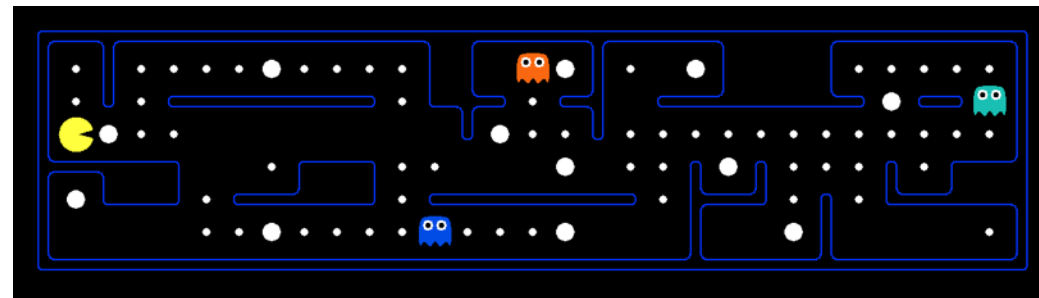


# What is is a state space?

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The **world state** includes every last detail of the environment



A **search state** keeps only the details needed for planning (abstraction)

- Problem: Pathing
  - States:  $(x,y)$  location
  - Actions: NSEW
  - Successor: update location only
  - Goal test: is  $(x,y)=END$
- Problem: Eat-All-Dots
  - States:  $\{(x,y), \text{dot booleans}\}$
  - Actions: NSEW
  - Successor: update location and possibly a dot boolean
  - Goal test: dots all false

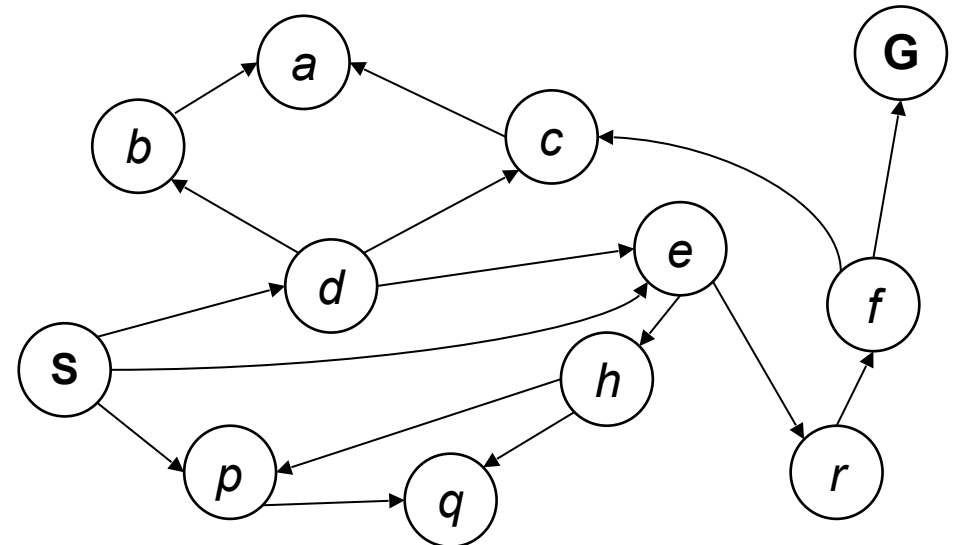


# Representing Search

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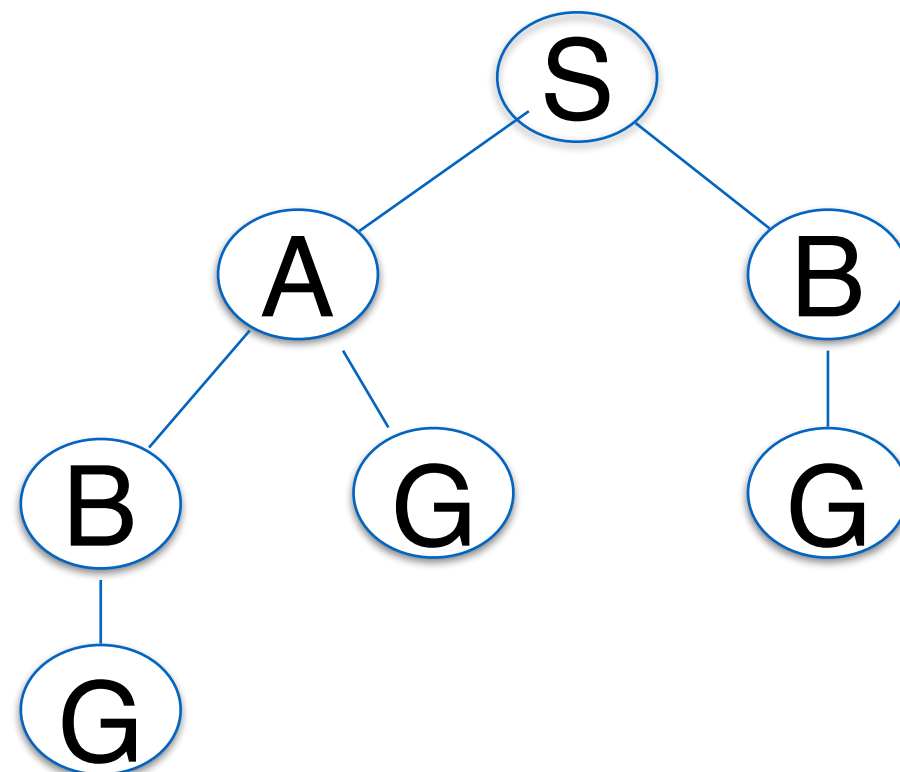
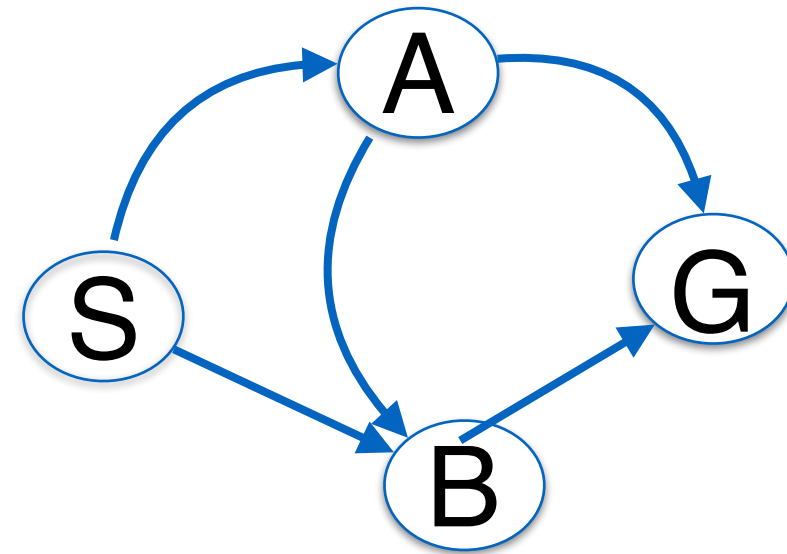
- State space graph
  - Vertices correspond to states (one vertex for each state)
  - Edges correspond to successors
  - Goal test is a set of goal nodes
- We search for a solution by building a search tree and traversing it to find a goal state



# Search Tree

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- A search tree:
  - Start state is the root of the tree
  - Children are successors
  - A plan is a path in the tree. A solution is a path from the root to a goal node.
  - For most problems we do not actually generate the entire tree

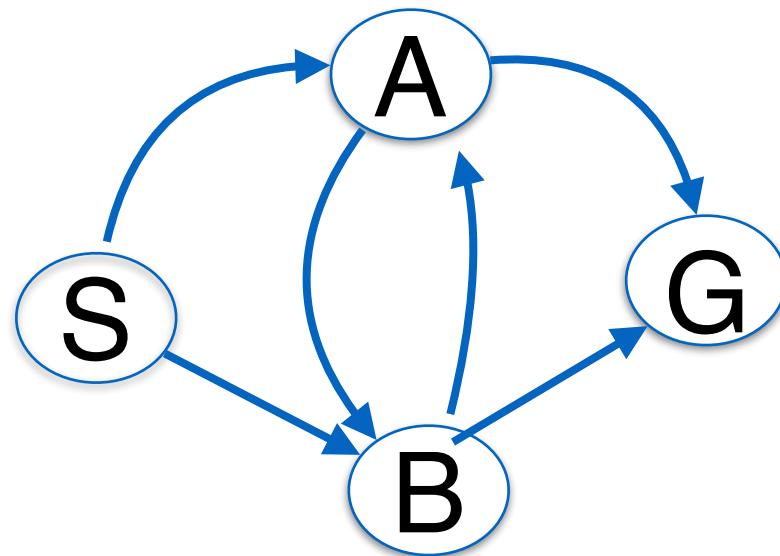


# Quiz

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- Given this state graph, how large is the search tree?



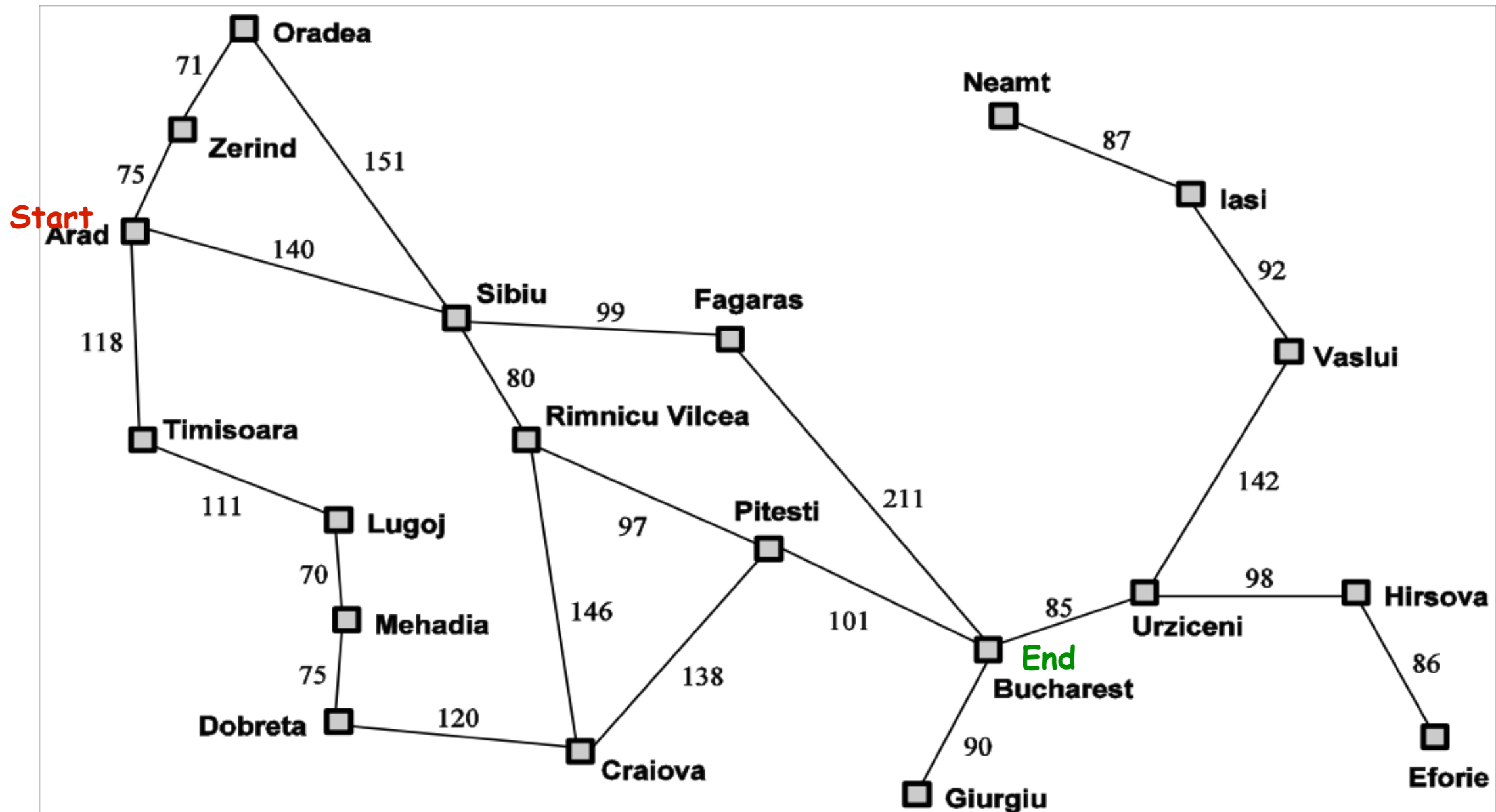
# Expanding Nodes

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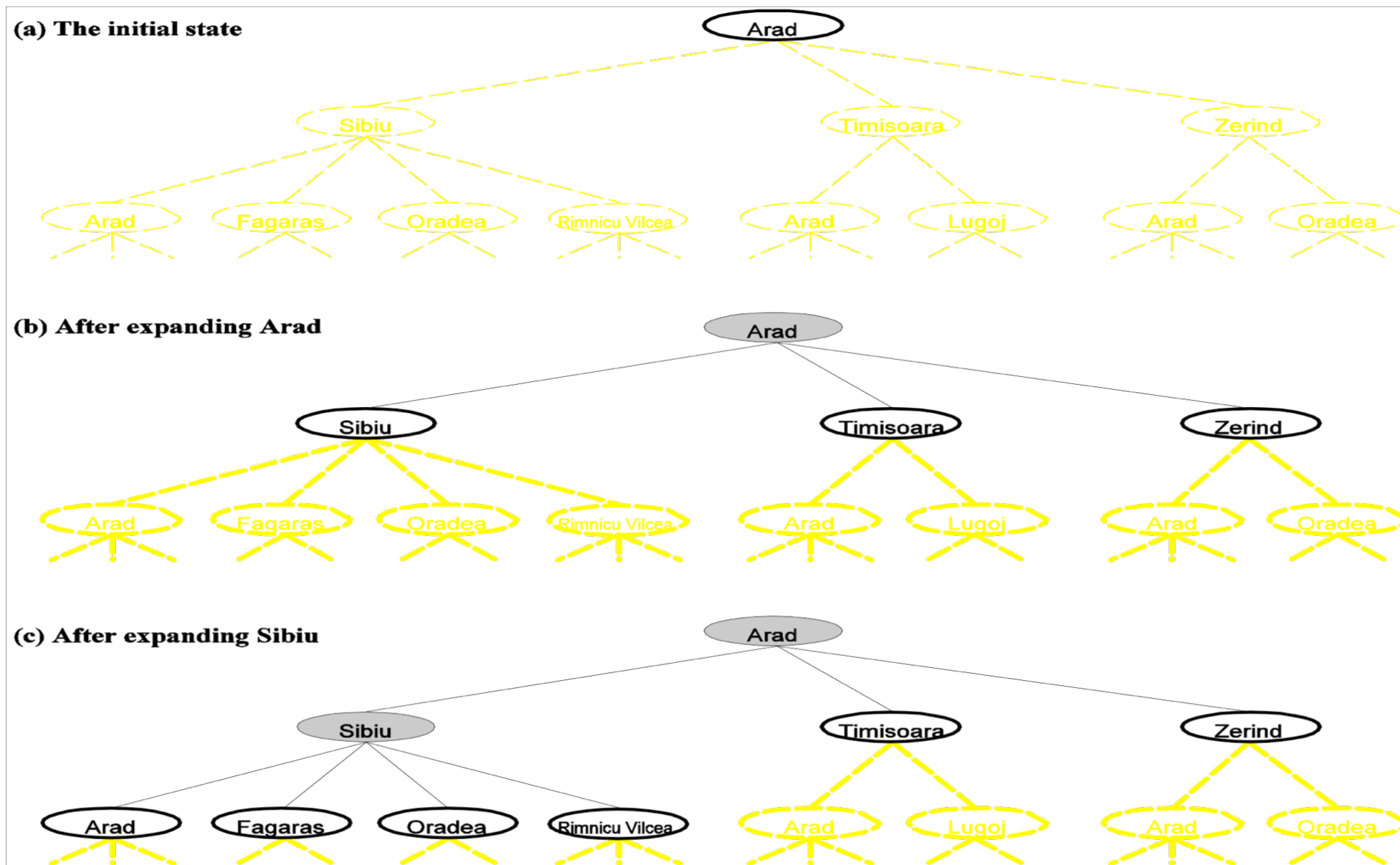
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- Expanding a node
  - Applying all legal operators to the state contained in the node
  - Generating nodes for all corresponding successor states

# Example: Traveling in Romania



# Expanding Nodes



# Generic Search Algorithm

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- Initialize with initial state of the problem
- Repeat
  - If no candidate nodes can be expanded **return failure**
  - Choose leaf node for expansion, according to **search strategy**
  - If node contains goal state, **return solution**
  - Otherwise, expand the node. Add resulting nodes to the tree



# Implementation Details

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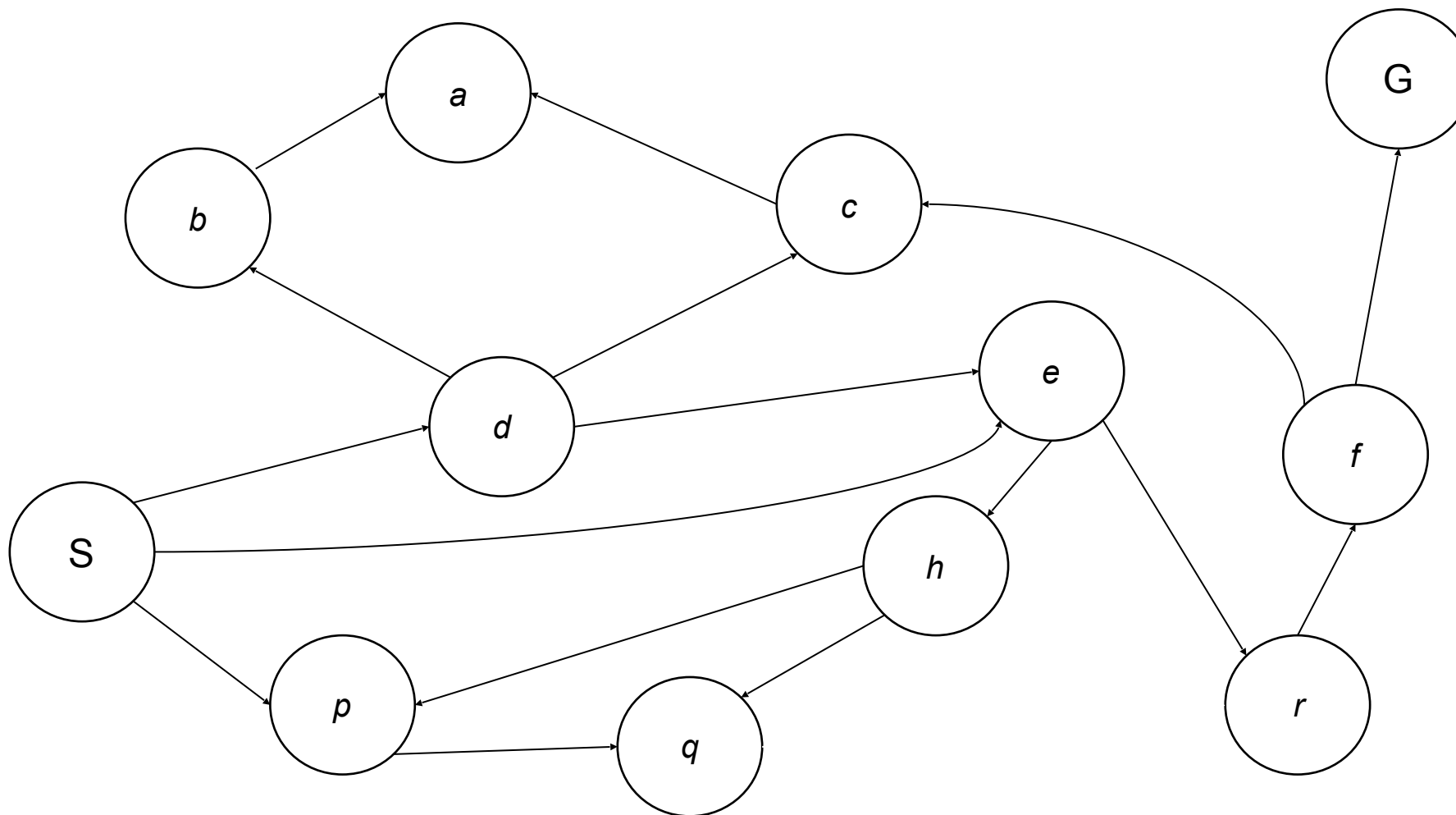
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- Need to keep track of nodes to be expanded (**fringe**)
- Implement using a queue:
  - Insert node for initial state
  - Repeat
    - If queue is empty, return failure
    - **Dequeue a node**
    - If node contains goal state, return solution
    - Expand node
- Search algorithms differ in their queuing function!

# Search Strategies

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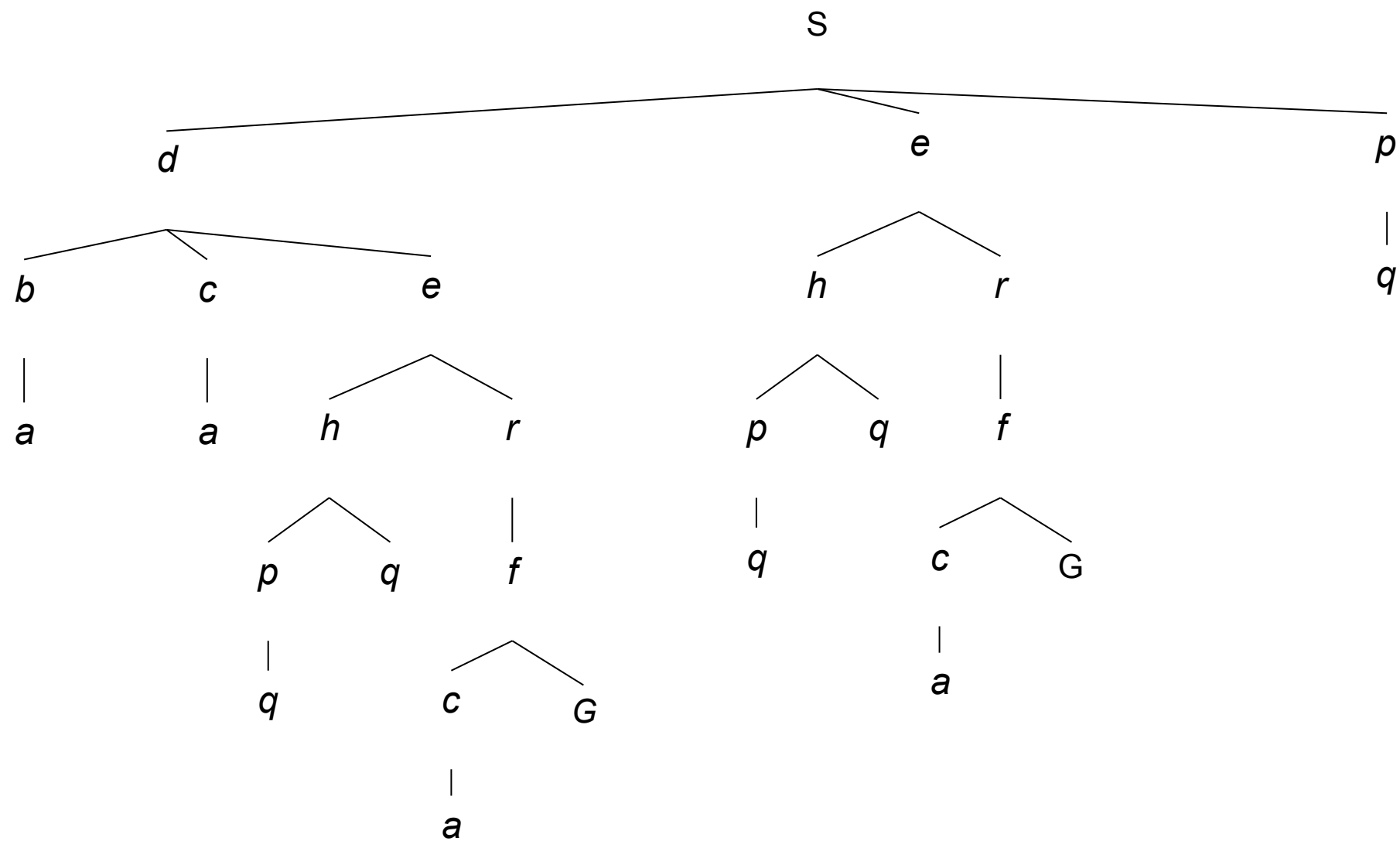
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# Search Strategies

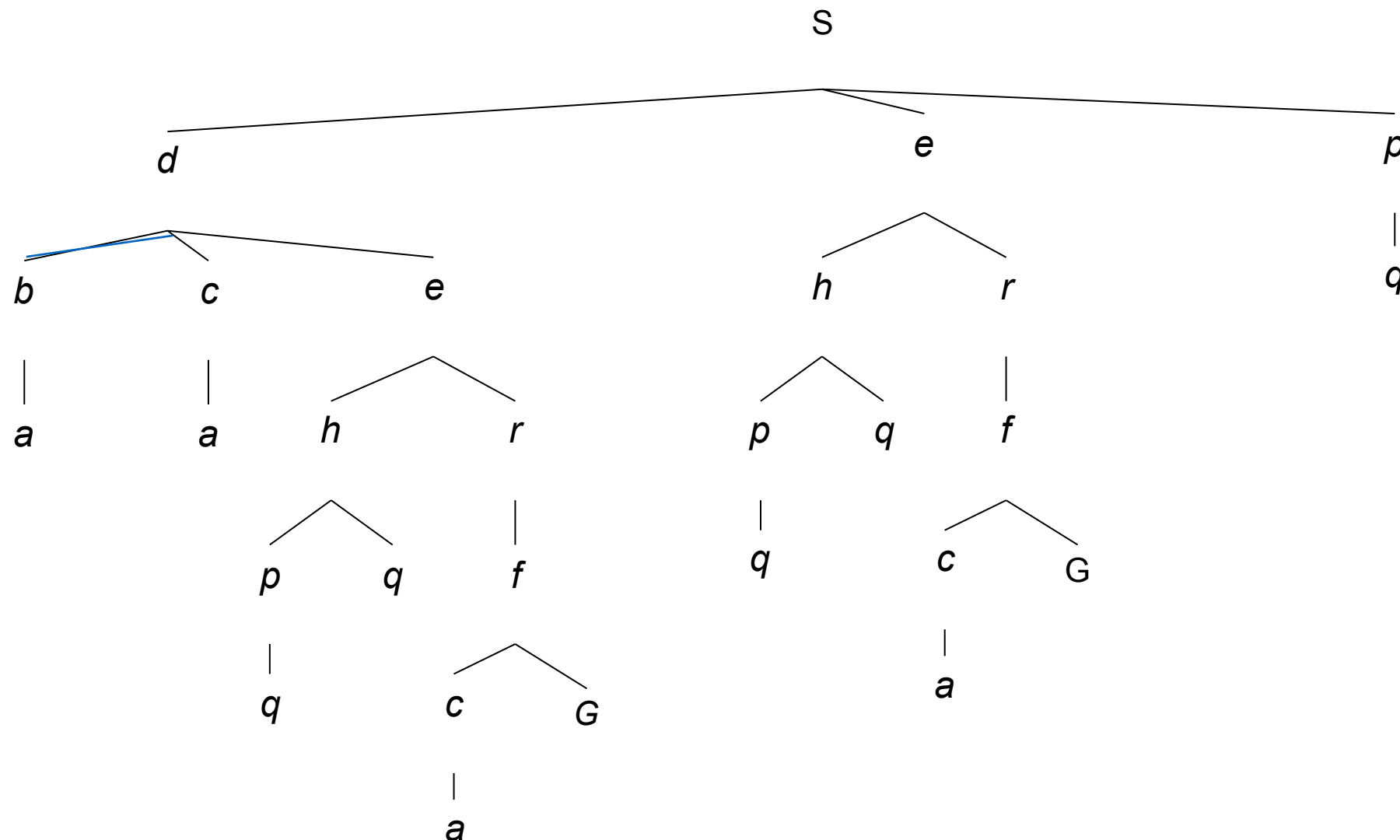
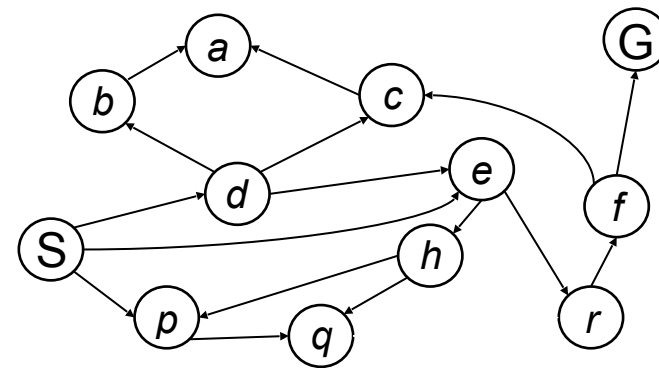
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# Depth-First Search

**Strategy:** Expand deepest node first  
**Implementation:** LIFO stack



# Key Properties

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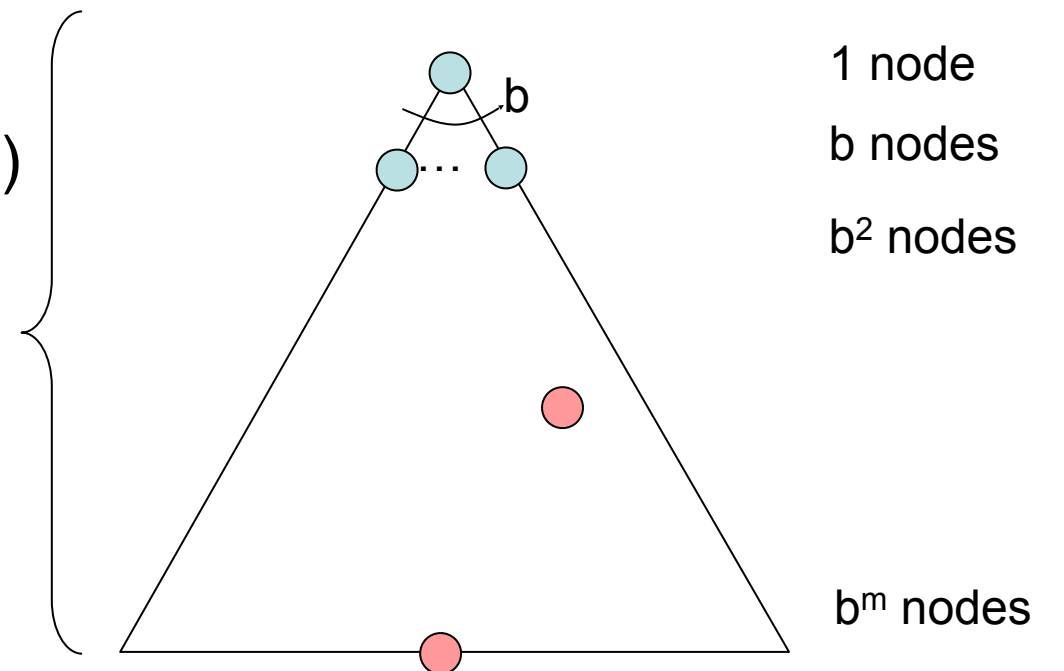
- **Completeness:** Is the alg. guaranteed to find a solution if the solution exists?
- **Optimality:** Does the alg. find the optimal solution?
- **Time complexity**
- **Space complexity** (size of the fringe)

b: branching factor

m: maximum depth

d: depth of shallowest goal node

m tiers

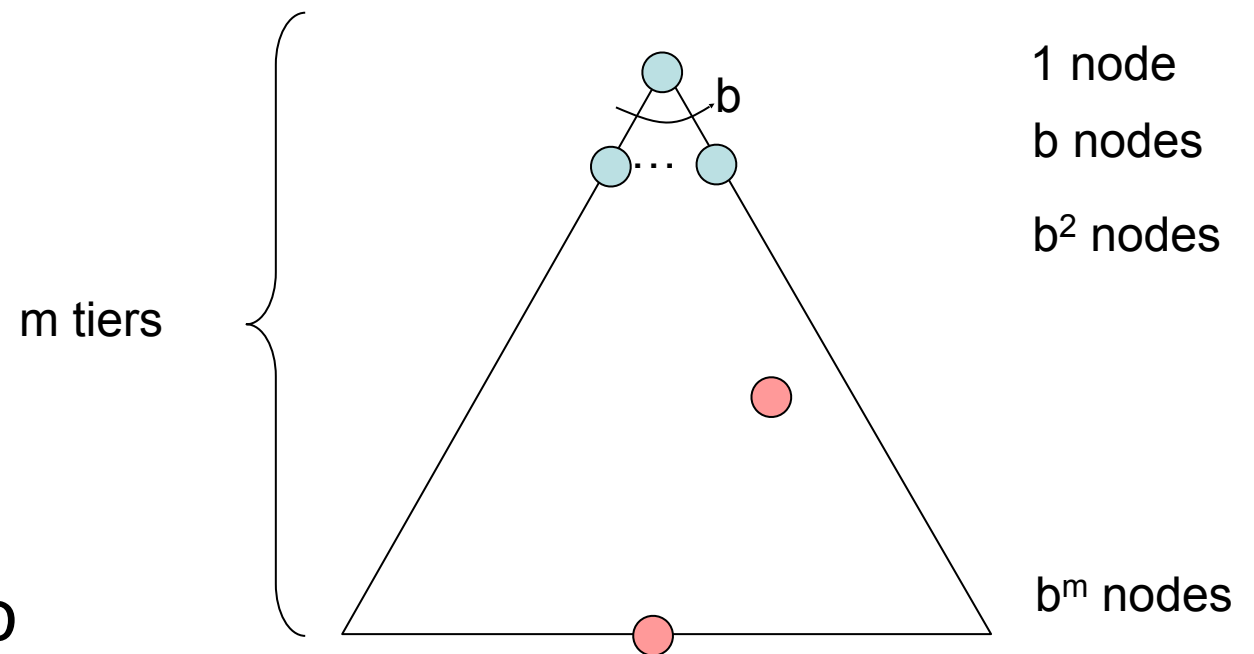


**Number of nodes in tree?  $1+b+b^2+\dots+b^m=O(b^m)$**

# DFS Properties

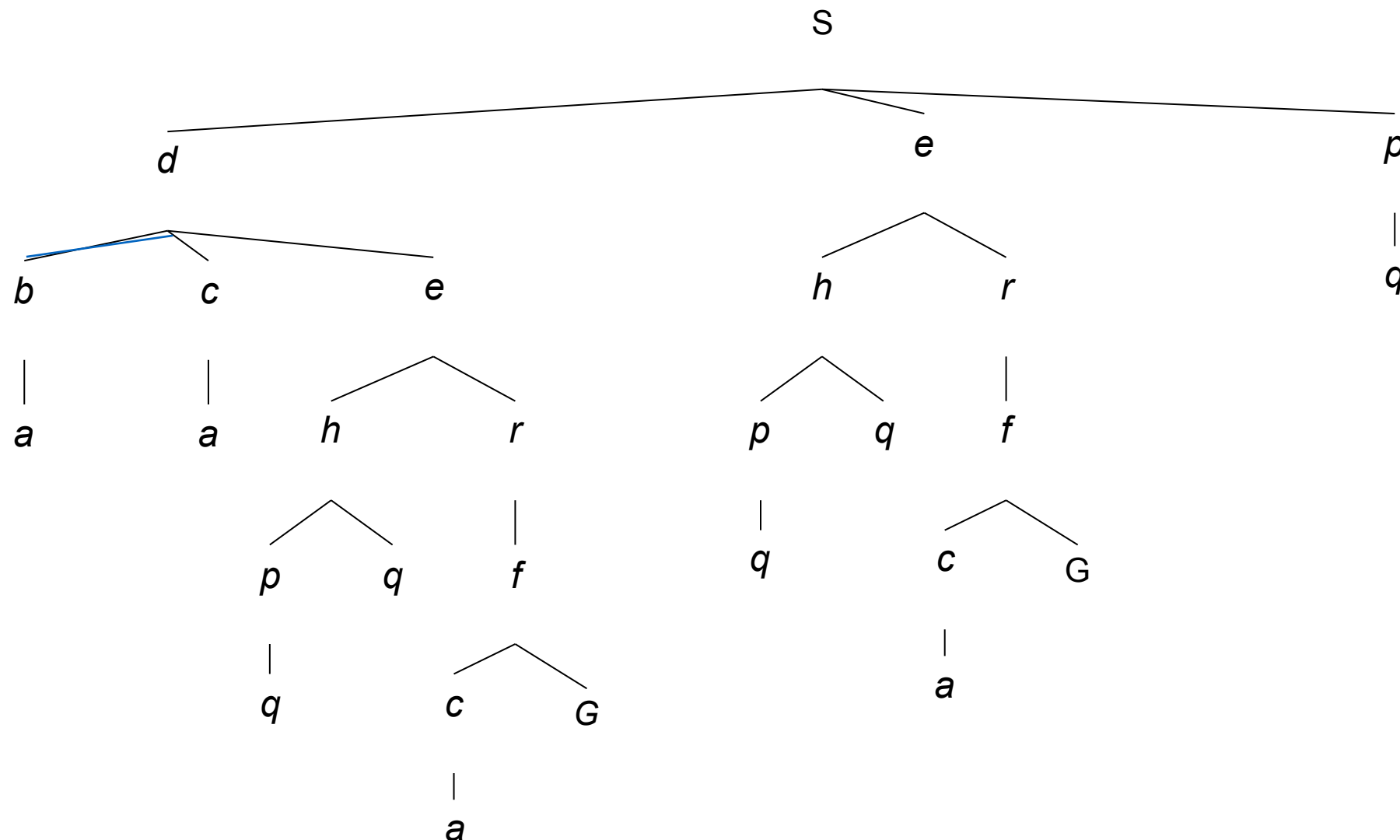
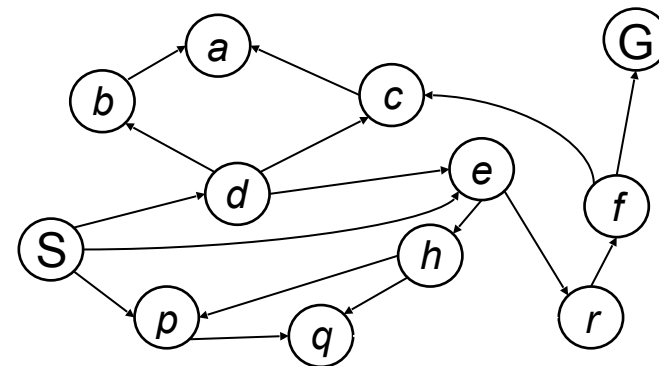
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- **Complete?**
  - No!  $m$  could be infinite (why?)
- **Optimal?**
  - No! It finds “leftmost” solution first, regardless of cost or depth
- **Time complexity**
  - It could process the entire tree! Therefore  $O(b^m)$
- **Space complexity**
  - Only has siblings on path to root! Therefore  $O(bm)$ !



# Breadth-First Search

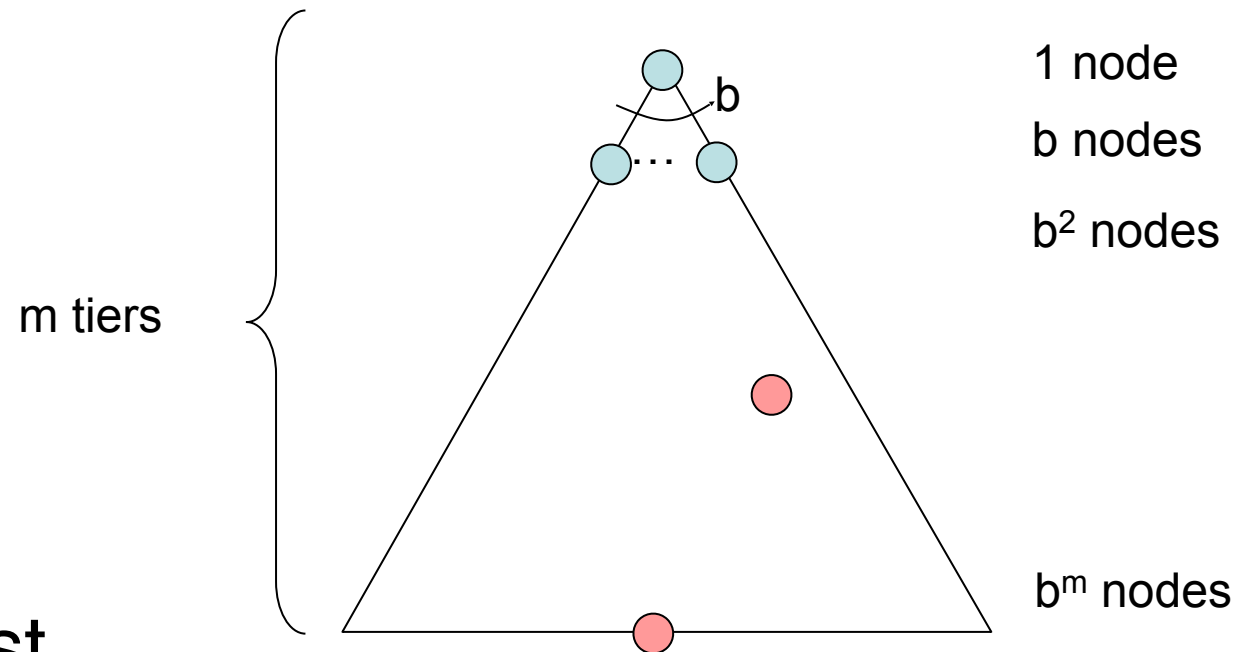
**Strategy:** Expand shallowest node first  
**Implementation:** FIFO queue





# BFS Properties

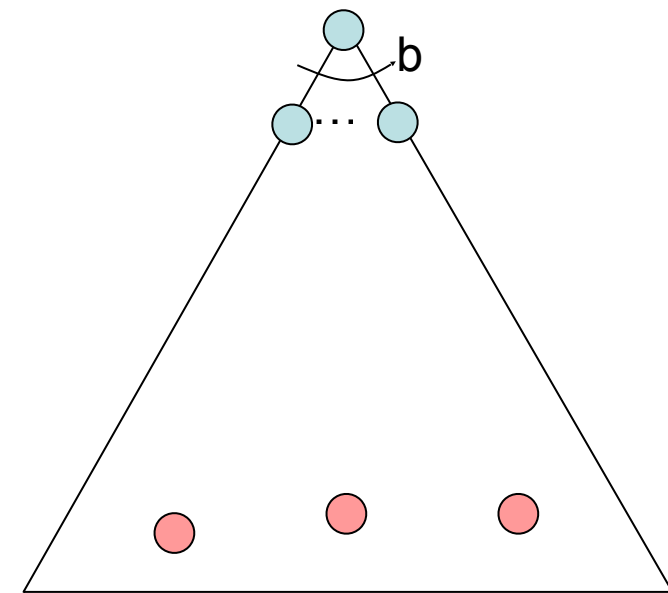
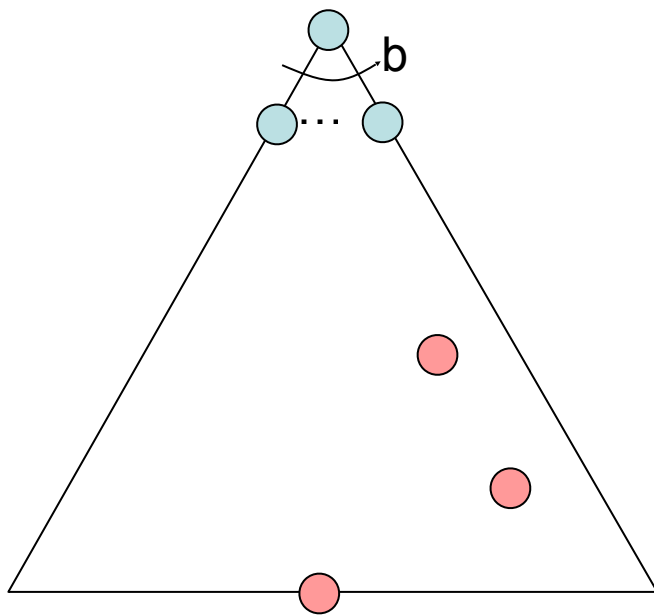
- **Complete?**
  - Yes!  $d$  must be finite is a solution exists
- **Optimal?**
  - Maybe! If costs are all 1
- **Time complexity**
  - It could process the tree until it finds the shallowest goal! Therefore  $O(b^d)$
- **Space complexity**
  - $O(b^d)$



# Quiz: DFS vs BFS

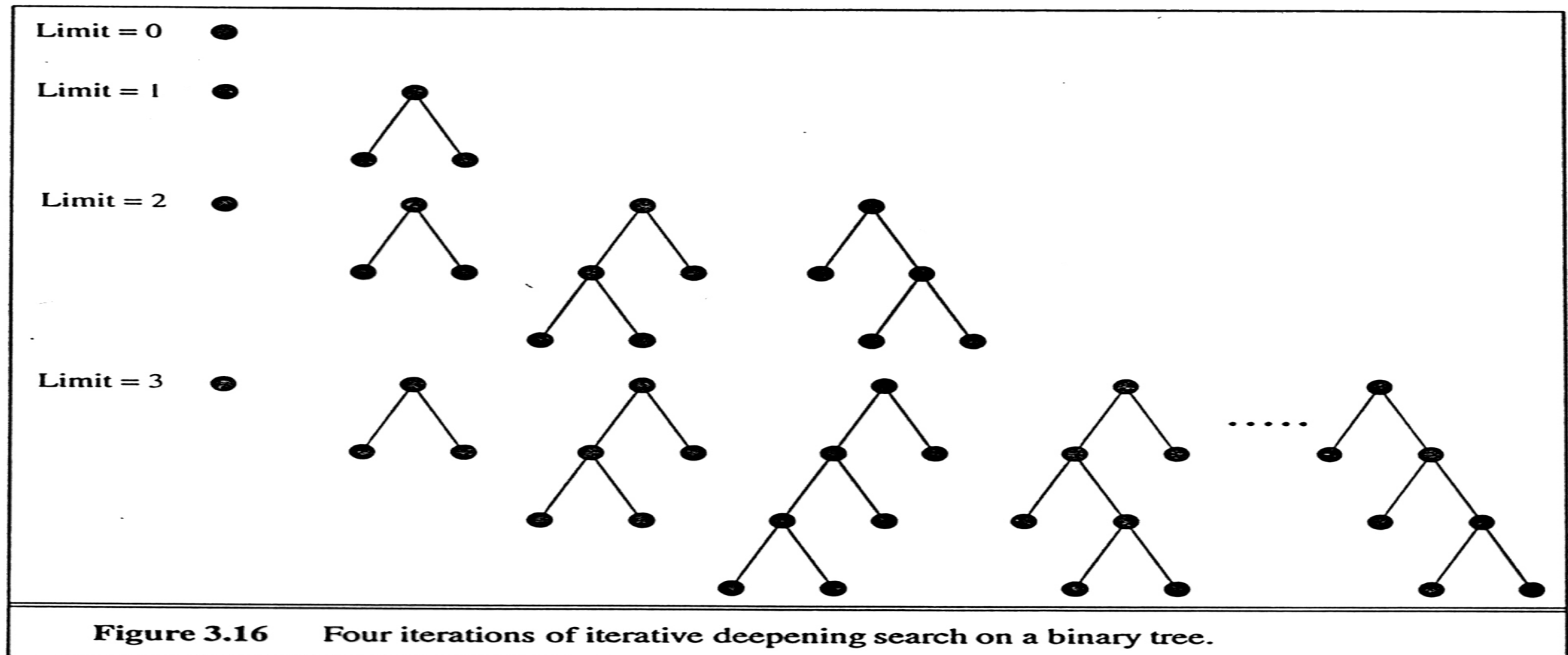
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# Iterative Deepening Search

- Can we combine search methods to take advantage of DFS space complexity and BFS completeness/shallow solution advantage?



# IDS Properties

- **Complete?**

- Yes!  $d$  must be finite is a solution exists (like BFS)

- **Optimal?**

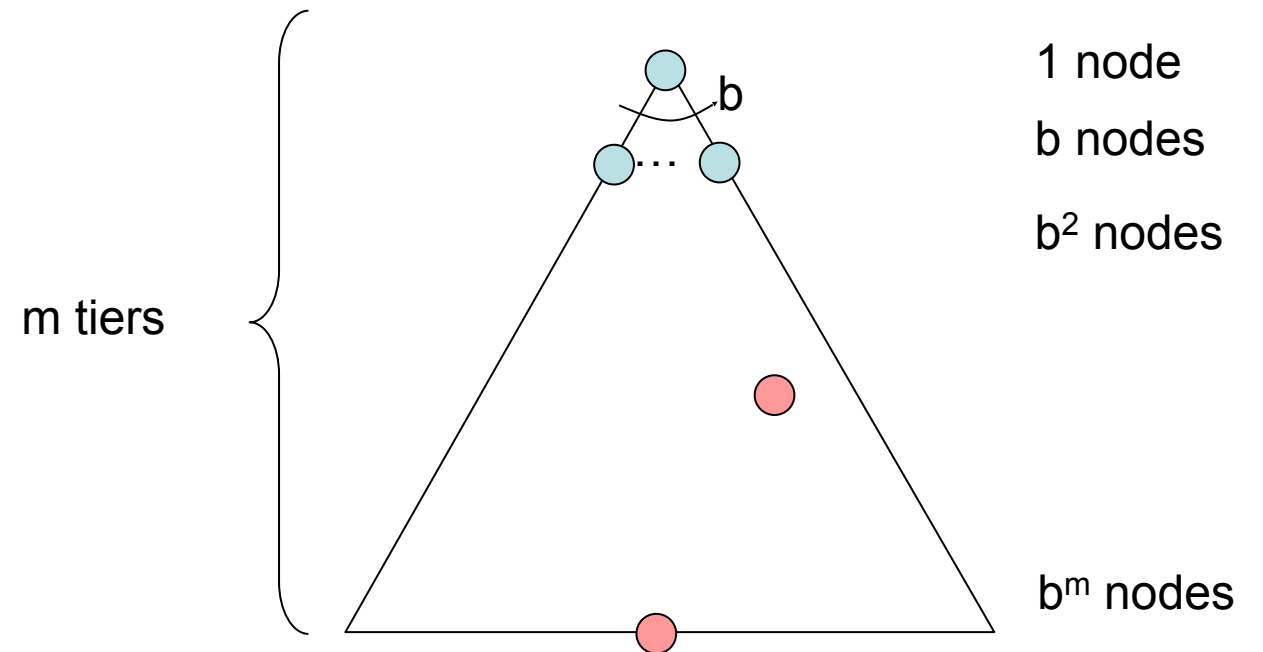
- Maybe! If costs are all 1

- **Time complexity**

- It could process the tree until it finds the shallowest goal! Therefore  $O(b^d)$

- **Space complexity**

- $O(bd)$

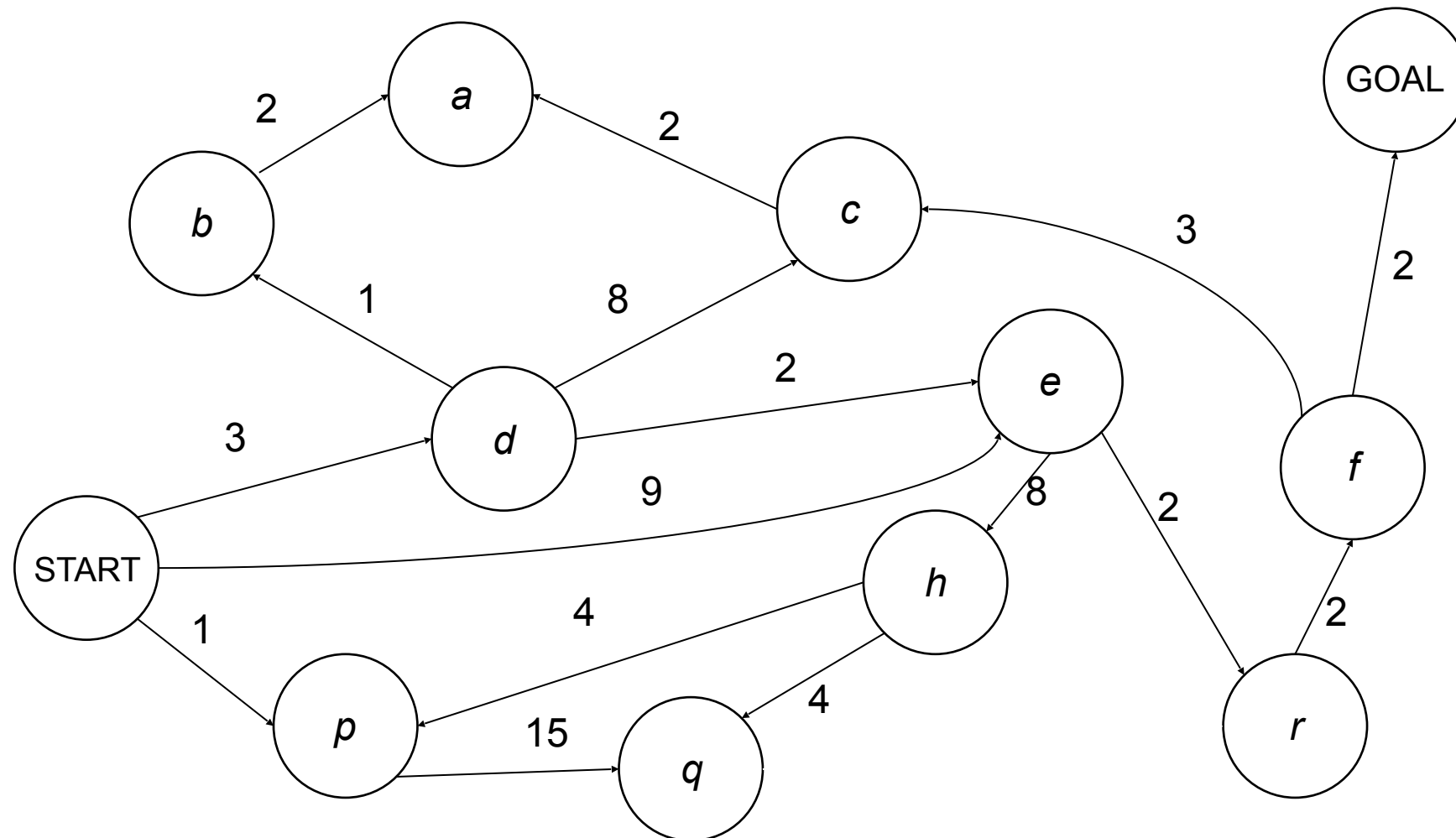


**Wasteful?** Most nodes found in lowest level of search so not too bad

# Cost-Sensitive Search

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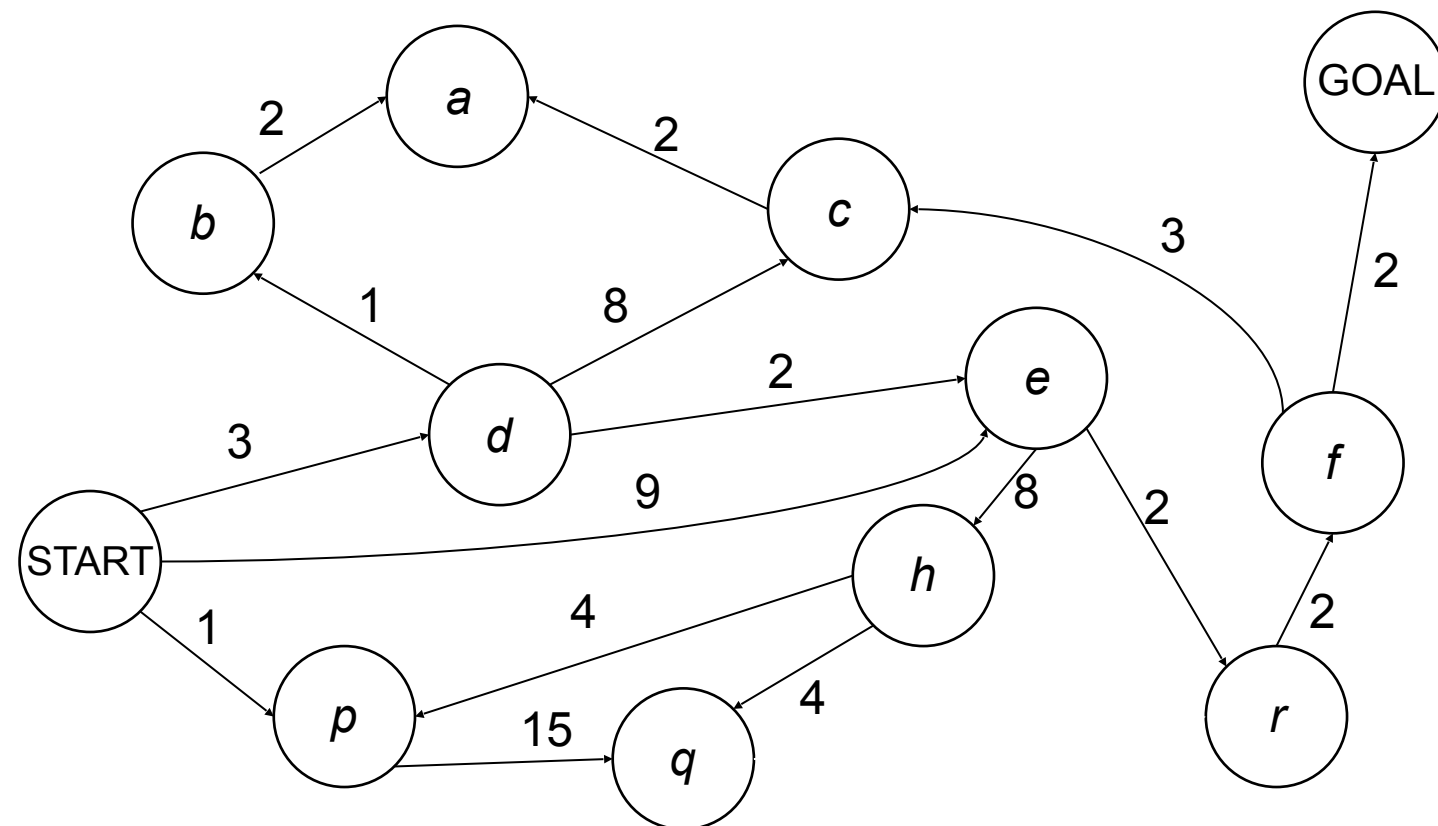
Recall that BFS was only optimal under some conditions (i.e. we only cared about number of actions taken). What can we do if actions have different costs?

# Uniform Cost Search

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**Strategy:** Expand cheapest node first  
**Implementation:** Priority queue



# UCS Properties

- **Complete?**

- Yes! (assuming min cost is positive and best solution has finite cost)

- **Optimal?**

- Yes!

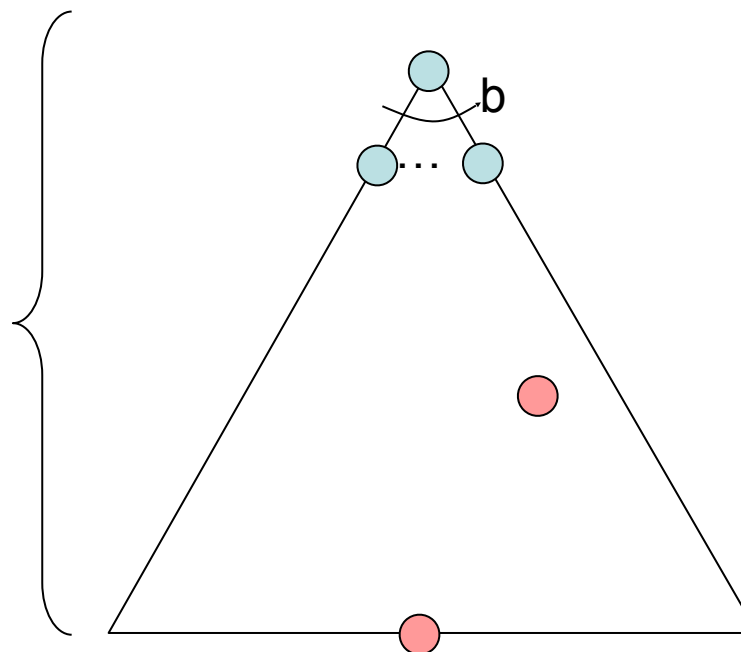
- **Time complexity**

- Processes all nodes with cost less than cheapest solution
- If cheapest solution cost  $C^*$  and edges cost at least  $\epsilon$  then “depth” is approximately  $C^*/\epsilon$ . Thus time  $O(b^{C^*/\epsilon})$

- **Space complexity**

- $O(b^{C^*/\epsilon})$

$C^*/\epsilon$  tiers





# Summary

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- These algorithms are basically the same except for the order in which they expand nodes
- Basically all priority queues with different ways to determining priorities
- How successful the search is depends heavily on your model!

# Questions?

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- Next class: Informed search