

# CPSC 481

## Artificial Intelligence

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# What we will cover today

- Uninformed search
  - Iterative deepening
  - Uniform cost search

Textbook: Chapter 3.4

# Review of DFS and BFS

- DFS
  - Advantages
    - Space complexity – less memory needed compared to BFS (linear vs exponential)
  - Disadvantages
    - Not complete – does not guarantee to find a solution even if there is one
    - Not optimal – does not guarantee to find least-cost path
    - Infinite loops – can get stuck in infinite loops

# Review of DFS and BFS

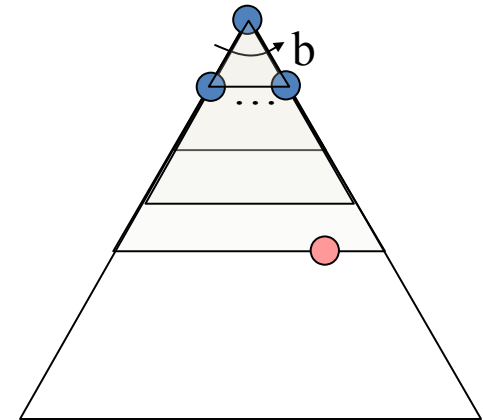
- BFS
  - Advantages
    - Optimality – guaranteed to find shortest path (in unweighted graphs)
  - Disadvantages
    - Space complexity – needs to keep track of all the nodes in the frontier and explored set

# Depth limited DFS

- DFS is not complete for infinite spaces
- How can we adapt DFS for infinite spaces?
- Limit depth to
- Assumes: maximum depth of solution is known
- DFS but treat nodes at depth as if they have no children
- Note:
  - Depth limited DFS fails if we incorrectly set
- Time complexity:
- Space complexity:

# Iterative Deepening

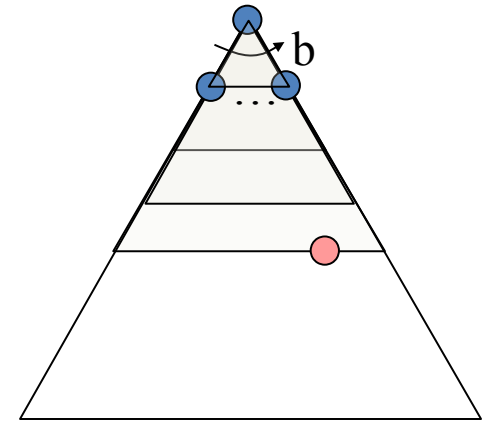
- What is the biggest advantage of DFS?
- What is the biggest advantage of BFS?
- Idea: get the best of both worlds
  - DFS's space advantage with BFS's time / shallow-solution advantages
  - Run a DFS with depth limit 1. If no solution...
  - Run a DFS with depth limit 2. If no solution...
  - Run a DFS with depth limit 3. ....
- Most of the nodes are on the bottom of the search tree, it not a big waste to iteratively re-generate the top



# Complexity of Iterative Deepening

- Time complexity:
  - Same as BFS!
- Space complexity:  $O(bm)$ 
  - Linear - has the space complexity benefits of DFS

Some redundancy but the benefits (completeness and memory efficiency) are worth it!



*In general, iterative deepening is **the preferred uninformed search method** when the search space is large and the depth of the solution is not known.*

# Time vs Space complexity

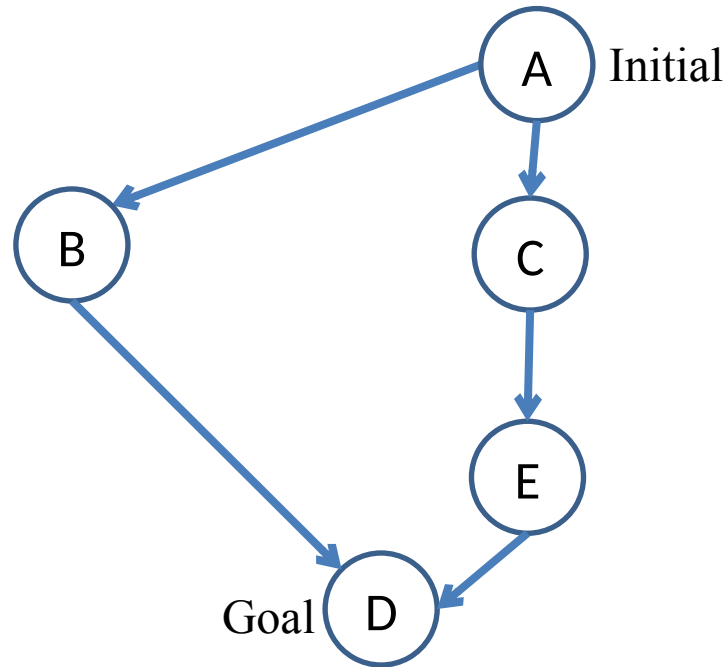
Depth	Nodes	Time	Memory
2	110	0.11ms	107KB
4	11,110	11ms	10.6MB
6		1.1s	1GB
8		2 minutes	103GB
10		3 hours	10TB
12		13 days	1PB
14		3.5 years	99PB
16		350 years	10 exabytes

$b=10$ , computer generates 1 million nodes/second, 1KB per node in memory

*Space requirement is a much more serious issue than time requirement*



# Cost-Sensitive Search

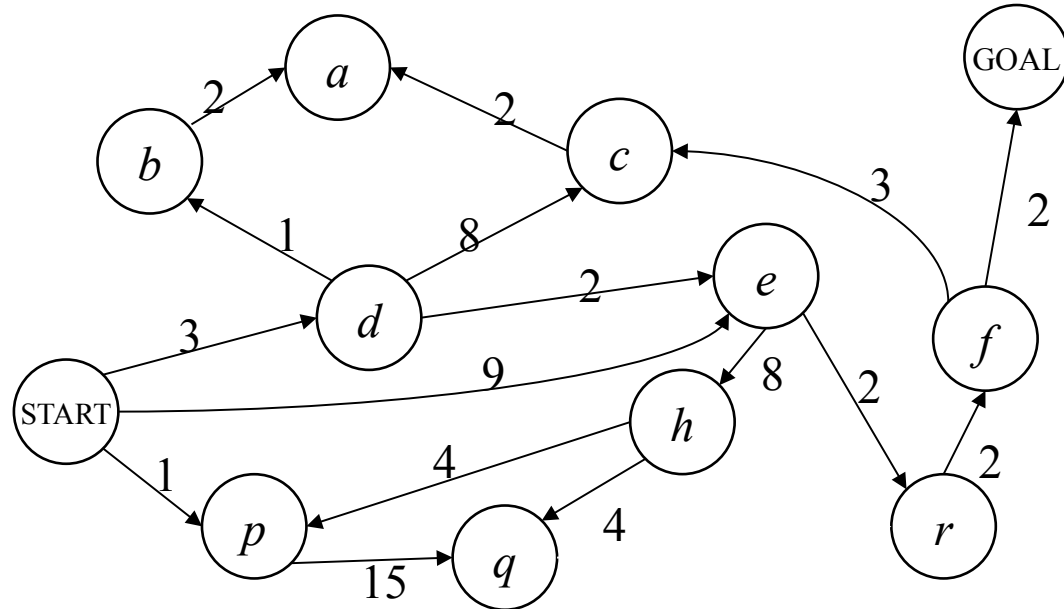


- BFS finds the shortest path in terms of **number of actions**
- It does not consider the **length/cost of an action**
- **Cost**: total cost of all actions on the path
- Can modify BFS to find the least-cost path: **uniform cost search** or **Dijkstra's algorithm**

# Uniform Cost Search/Dijkstra's

Activity: List nodes in increasing **path cost**

Path Cost: length of shortest path from START node

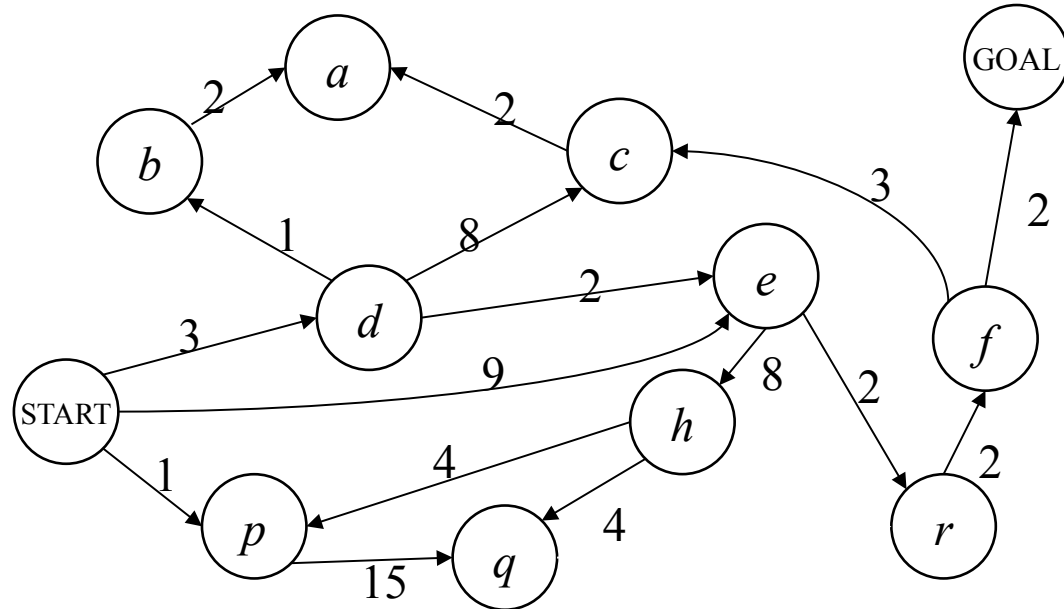


# Uniform Cost Search

Strategy: expand the “cheapest” node first

Frontier is a **priority queue**

priority = cumulative cost



# Uniform cost search

- Input: A problem
- Data structures:
  - **Frontier** (also called “open”)
    - Priority Queue, ordered by path cost
  - **Explored** (also called “closed”)
    - **Set**, for efficiency

Initialize frontier with initial state

Initialize explored to empty

Loop do

    IF the frontier is empty RETURN FAILURE

    Choose lowest cost node from frontier and remove it

    IF lowest cost node is goal RETURN SUCCESS

    Add node to explored

    FOR every child node of node

        IF child not already on frontier or explored

            insert child node to frontier

        ELSE IF child is in frontier with higher path cost

            replace existing frontier node with child node

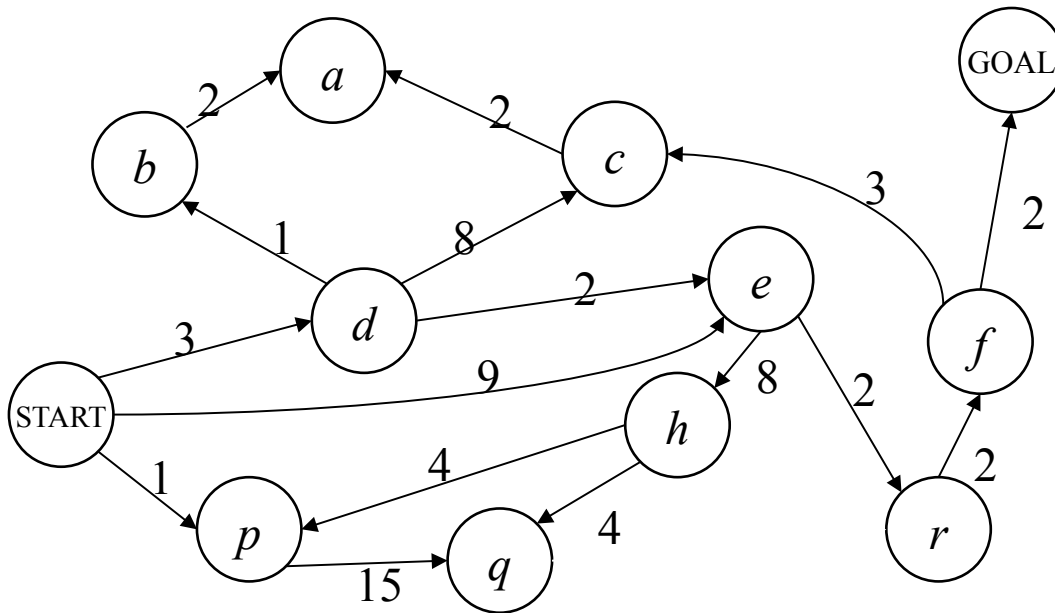
# Uniform Cost Search

Strategy: expand the “cheapest” node first

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Explored	Frontier - Priority Queue
-	S(0)

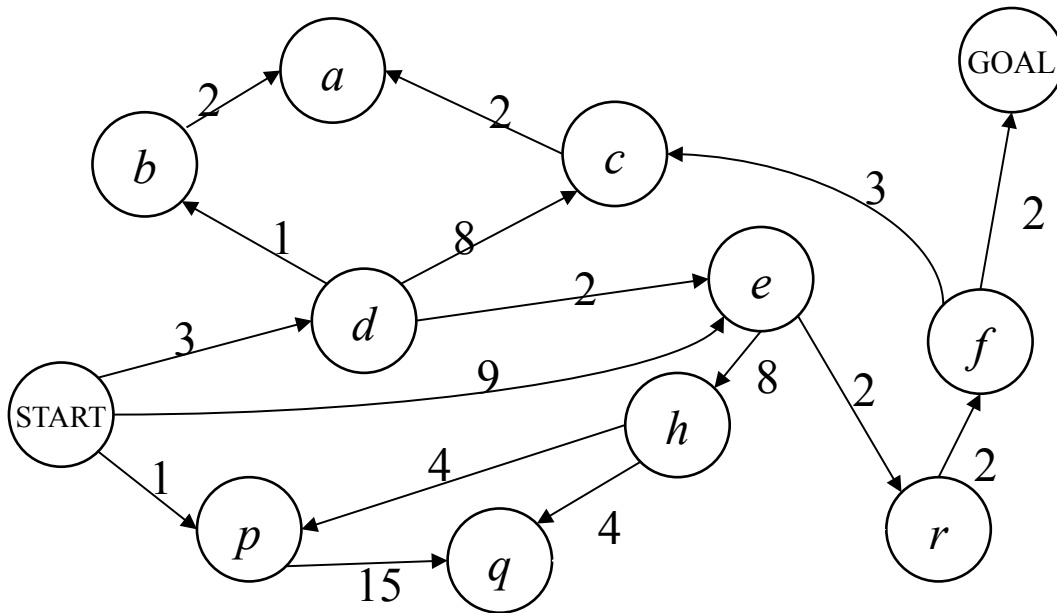


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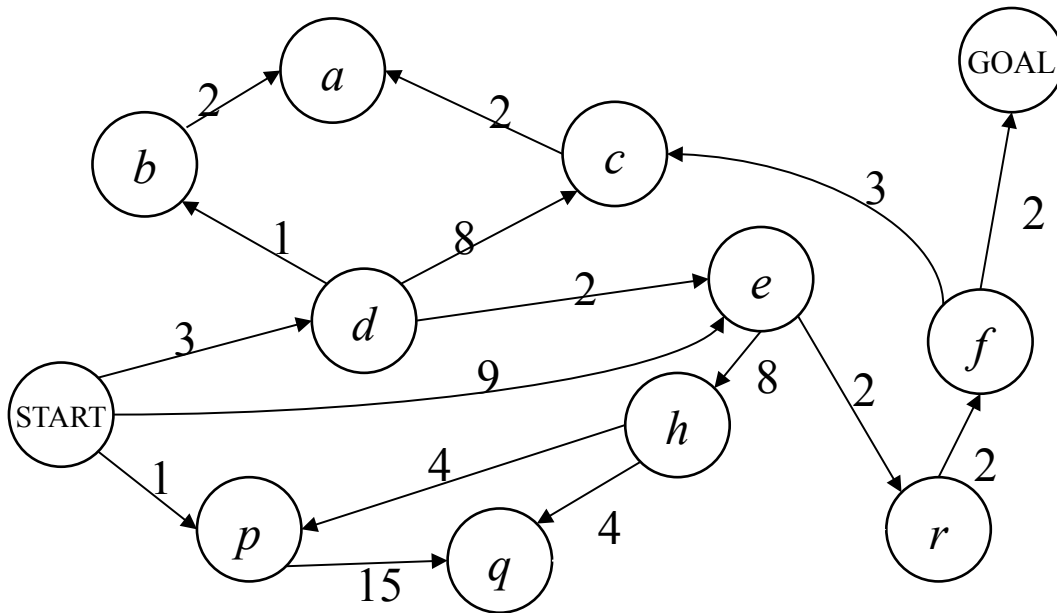
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-	S(0)
S	p(1), d(3), e(9)

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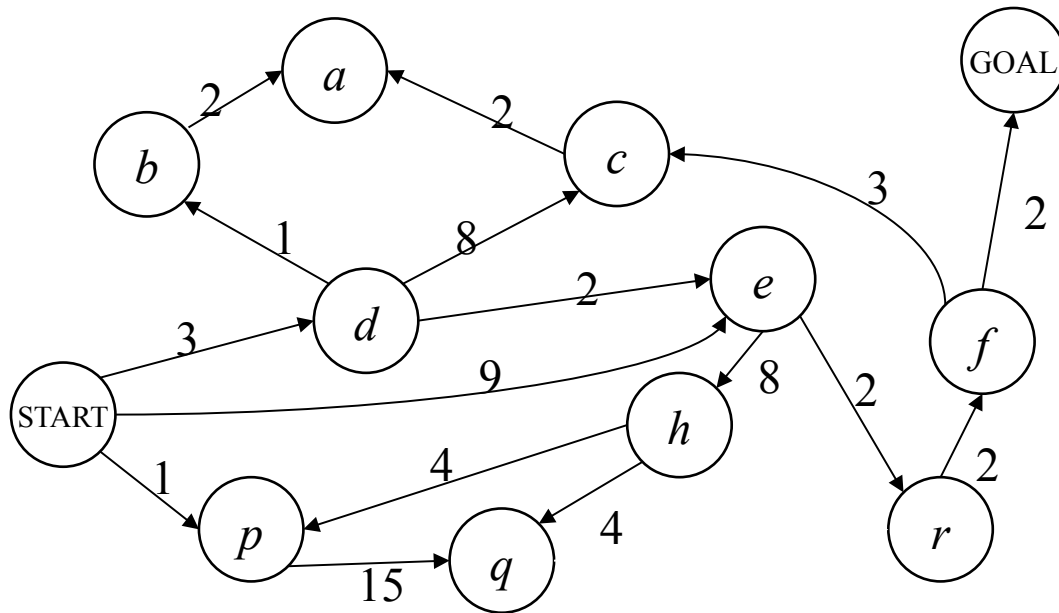
Explored	Frontier – Priority Queue
-	S(0)
S	p(1), d(3), e(9)
S, p	d(3), e(9), q(16)

# Uniform Cost Search

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Explored	Frontier – Priority Queue
-	S(0)
S	p(1), d(3), e(9)
S, p	d(3), e(9), q(16)
S, p, d	e(5), q(16), b(4), c(11)

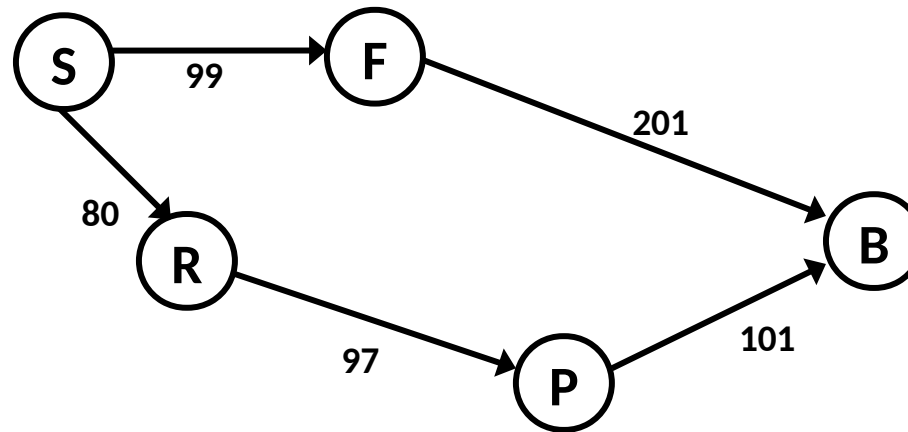


# In-class exercise

- Work on the rest of the iterations for the graph
  - Show frontier (priority queue) and explored node in a table using Uniform Cost Search

# When should uniform cost terminate?

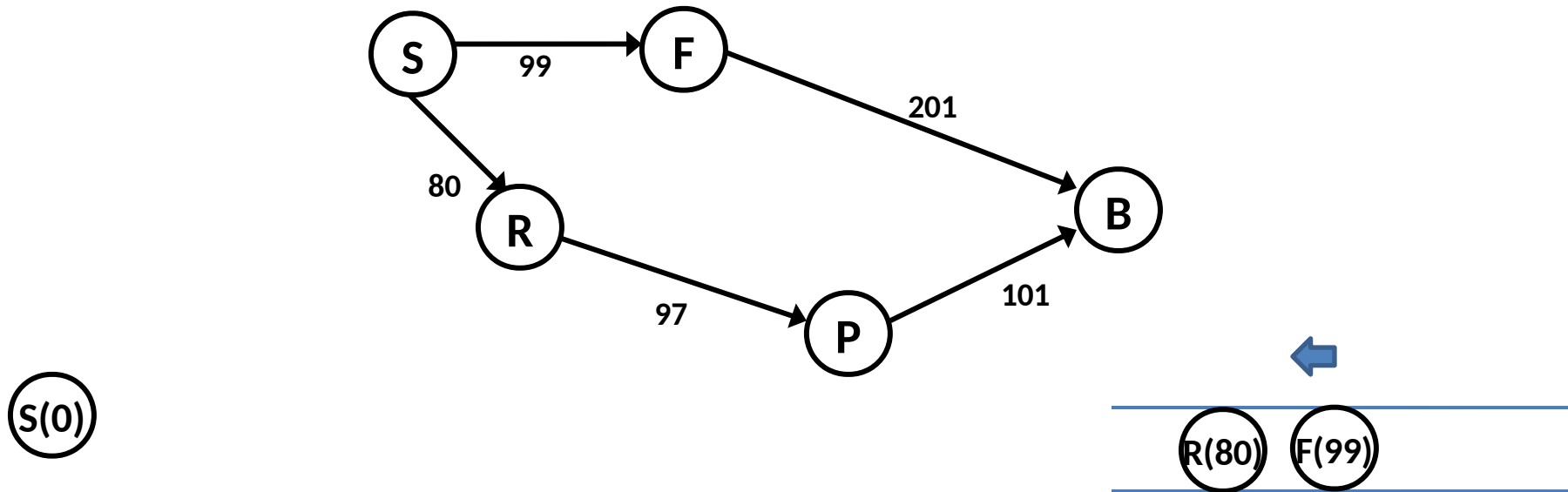
- Should we stop when we **discover** a goal node?



- No: only stop when we **expand** a goal node

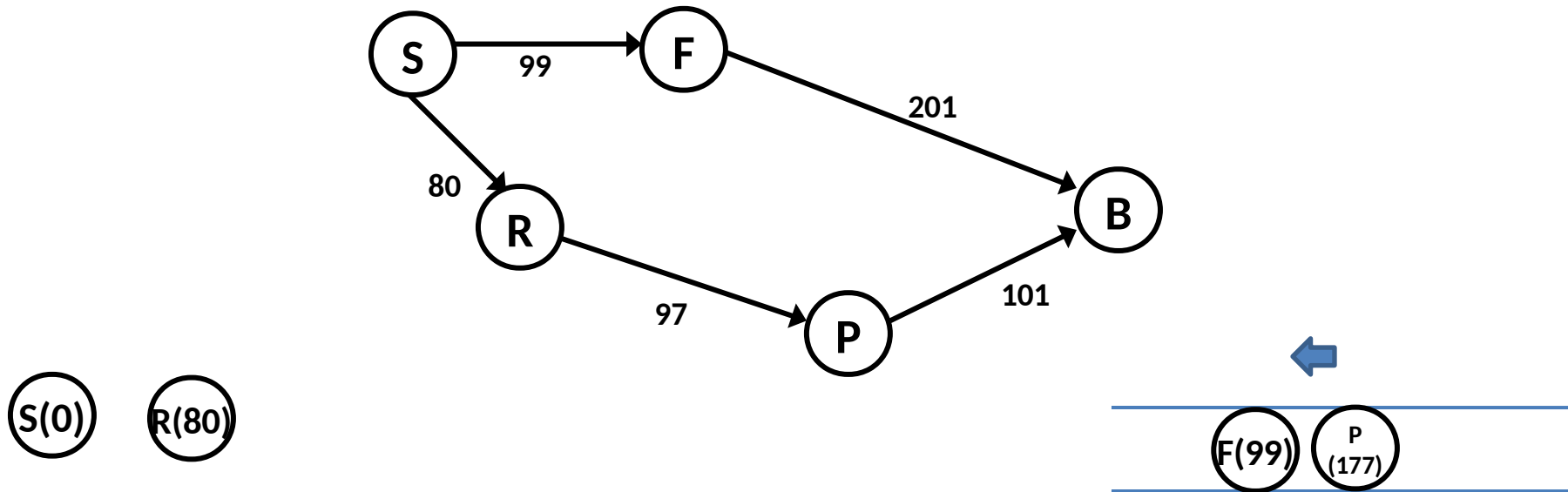
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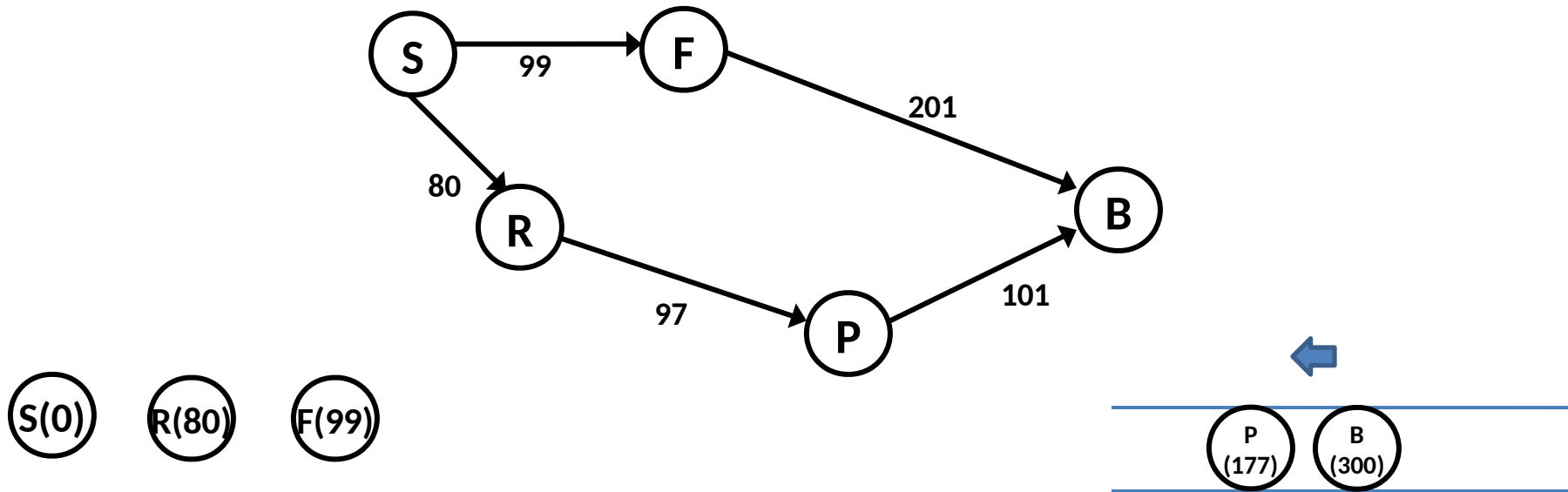
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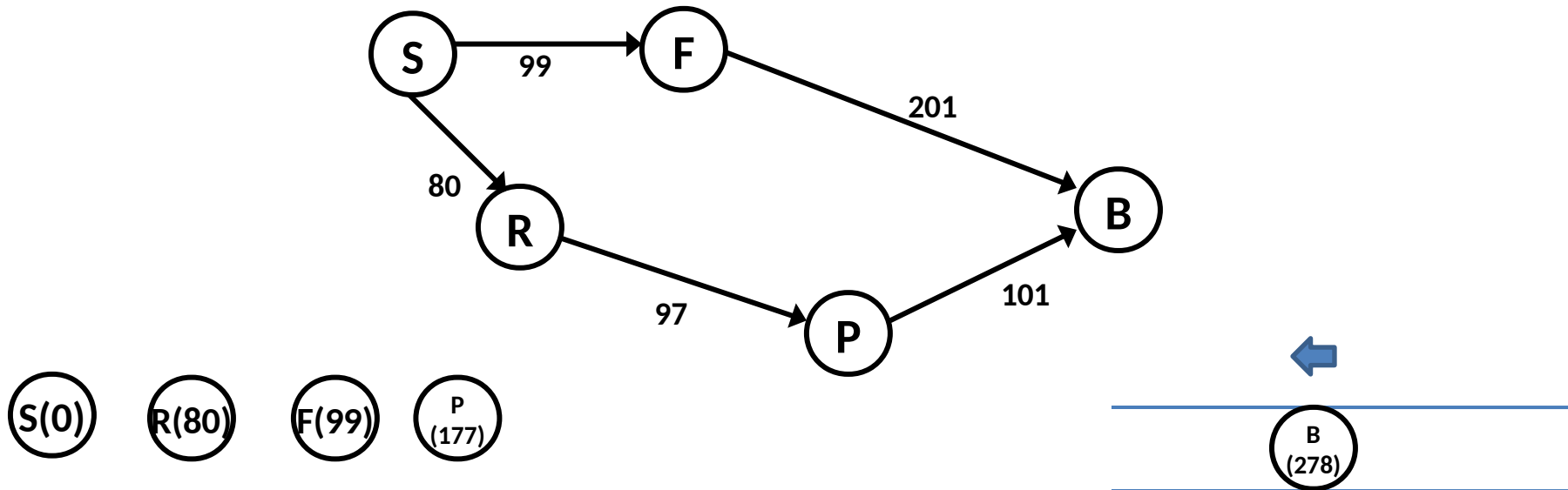
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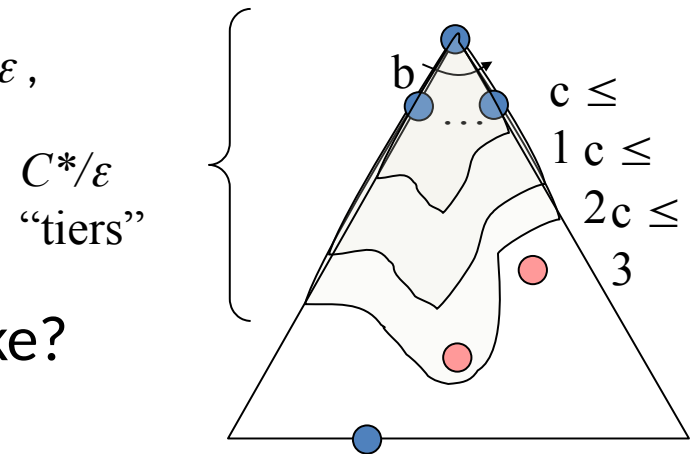
- No: only stop when we **expand** a goal node

# Uniform cost search (UCS)

- Same as Dijkstra's shortest paths algorithm
  - Dijkstra's algorithm has no "goal"
  - Shortest paths to *all* nodes
- Implementations of Dijkstra's algorithm assume all vertices and edges are known before-hand
  - In UCS, vertices and edges are discovered during the search
  - Works for infinite graphs also

# Uniform Cost Search (UCS) Properties

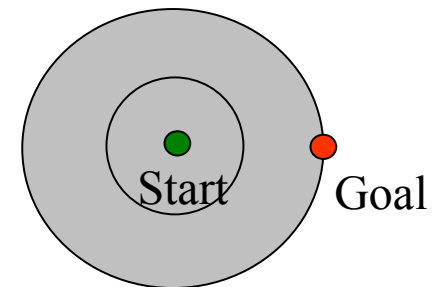
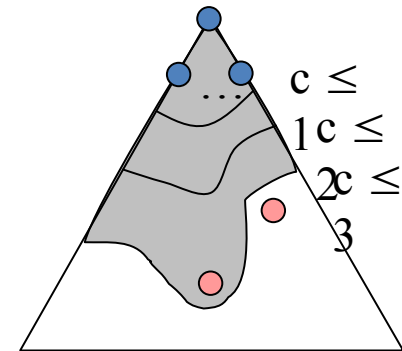
- What nodes does UCS expand?
  - Processes all nodes with cost less than cheapest solution!
  - If that solution costs  $C^*$  and arcs cost at least  $\epsilon$ , then the “effective depth” is roughly  $C^*/\epsilon$
  - Takes time  $O(b^{C^*/\epsilon})$ 
    - exponential in effective depth
- How much space does the frontier take?
  - Has roughly the last tier, so  $O(b^{C^*/\epsilon})$
- Is it complete?
  - Assuming best solution has a finite cost and minimum edge cost is positive, yes!
- Is it optimal?
  - Yes!





# Uniform Cost Issues

- The good: UCS is complete and optimal!
- The bad:
  - Explores options in every “direction”
  - No information about goal location
- Solution: consider **distance from goal** too



# Summary of uninformed search

- Breadth-first search (BFS) - Expand the shallowest node
- Depth-first search (DFS) - Expand the deepest node
- Depth-limited search (DLS) - Depth first search with a depth limit
- Iterative-deepening search (IDS) - DLS with increasing limit
- Uniform-cost search (UCS) - Expand the least cost node

# Acknowledgement

- <https://inst.eecs.berkeley.edu/~cs188/su20/>

# References

- Russel and Norvig, Artificial Intelligence: A Modern Approach, 4<sup>th</sup> edition, Prentice Hall, 2010.