### EECS 391: Introduction to Al

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#### Announcements

HW due next Thursday

# Today

Goal-Directed Search (Chapter 3)

## **Environment Type**

- We'll assume the environment is:
  - Fully observable (to track the state)
  - Static (shouldn't change while agent is searching)
  - Deterministic (agent needs to be able to precisely predict states resulting after each action)

Some search algorithms also need discrete environments

## **Problem Setup**

- Our agent is currently in some state of the world
  - Call this the *initial state*

- It wants to get to a different state of the world
  - Call this the goal state
  - In general, the desired target may be defined by a logical predicate (goal test) that encompasses a set of goal states
  - In this case the agent wants to get to any goal state satisfying the goal test

# Problem Setup (2)

- To change the state of the world, the agent has actions
  - These will be called "search operators"
  - Also called "successor functions", same thing

- The search operators applied successively to the initial state generate a sequence of states
  - This is the "search space"

# Problem Setup (3)

Each search operator has an associated cost

 The search objective is to discover a sequence of operators that takes the agent from the initial state to any goal state with minimum cost

### Checklist

- Initial state
- Goal Test
- Search Operator (agent "action"/successor fn)
- Operator/Step Cost
- Objective: Find a sequence of actions that get from initial state to goal with minimum cost

## Basic Steps of Search Algorithms

- Add initial state to open list (list of unvisited states)
- While open list is not empty

Search algorithms differ in order of node removal

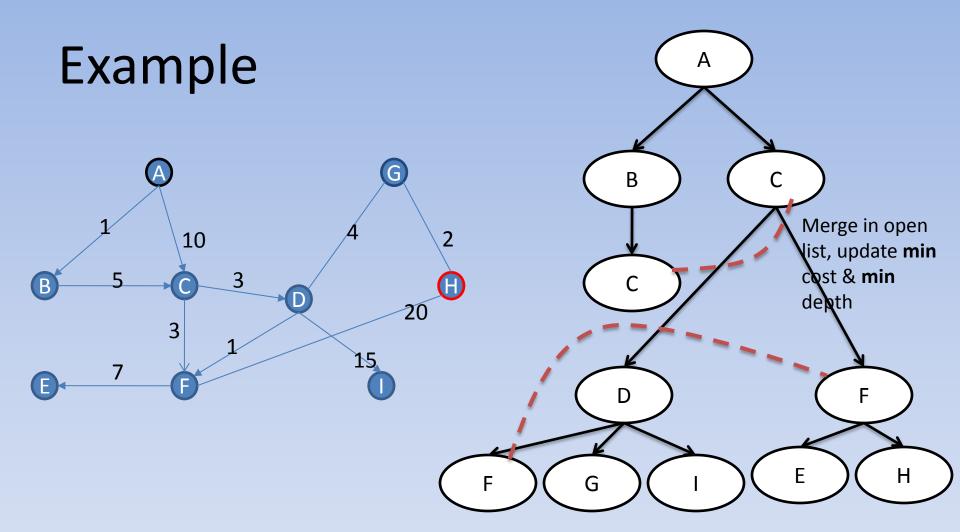
- Remove node from the open list
- If this is the goal, solution found, return path
- Else
  - Find the successors of this node ("expanding a state")
  - Add the current state to the list of visited (expanded) states (closed list)
  - Add the new states to the open list (if they do not appear in the closed list)
    - State could already be in open list, set parent pointer correctly (based on minimum path cost)

### Blind Search 1: Breadth First Search

 Shallowest (lowest depth) nodes on open list are expanded first

 First expand successors of initial state, then their successors, etc

Usually, the open list will be implemented via a queue



### **Uniform Cost Search**

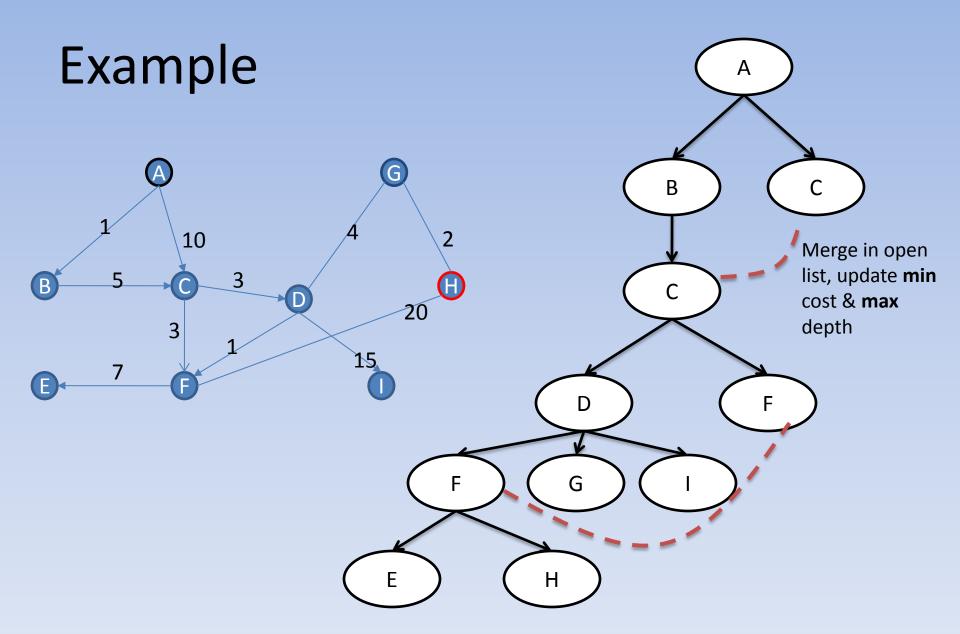
- Expand the node on the open list with the lowest path cost
  - otherwise same as BFS

Can be implemented using a priority queue

## Depth First Search

Expands deepest nodes on open list first

Can be implemented using a stack



# Iterative Deepening (ID-DFS)

- DFS may go down long, useless paths
  - We can parameterize it with a depth limit
  - If limit is reached, it will not expand further

- We can iteratively increase the depth parameter
  - Start with zero
  - If DFS with current depth fails, increment depth and restart

### **Bidirectional Search**

 Why not search from both the initial state and the goal state?

- Idea: run simultaneous searches, checking for intersections between the open lists
  - If nonempty, path found
  - If using BFS at each end, and goal depth is d, time and space complexity will be reduced to  $O(b^{d/2})$

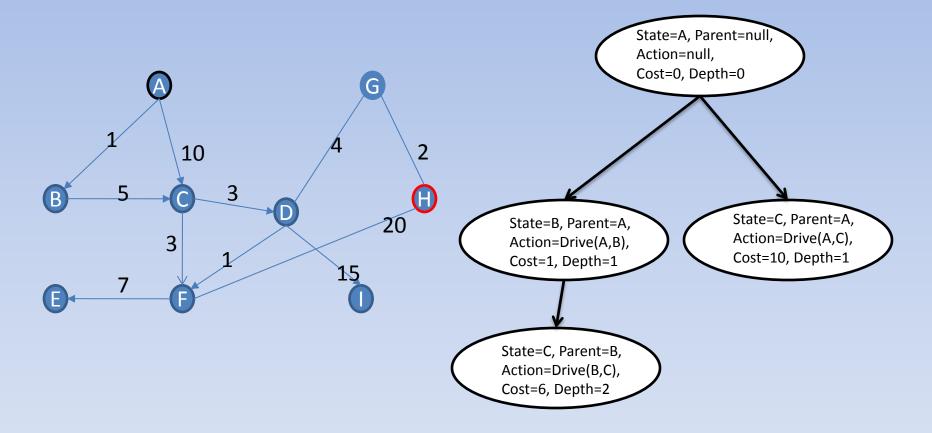
#### But...

- What if the goal is defined in terms of a predicate?
  - Could have lots of satisfying states, or could be hard to satisfy (SAT problem)
- Also constrains the operators
  - Note when searching from goal, need to find "predecessors"---could be tricky!
    - "All states that led to this checkmate configuration"

## Search Algorithm Analysis

- As it searches, the agent generates a "search tree"
- Each node in the search tree represents some state in the search space, with extra bookkeeping information
  - The parent node
  - The action that was applied at the parent
  - Path cost
  - Depth
- NOTE: The search tree is only meant to visualize the flow of computation. It does not correspond to a data structure you would maintain in practice.

### Example: Search Tree



Different search algorithms can be compared using characteristics of the search tree they generate.

### Characteristics of the Search Tree

- Branching factor b
  - Maximum number of successors of any node

- Goal depth d
  - Depth of the shallowest goal in the search tree

- Max Path Length m
  - Maximum length of a path in the search space

## Algorithm Performance

- Completeness
  - Algorithm always finds a solution if it exists?
- Optimality
  - Algorithm always finds minimum cost solution?
- Time Complexity
  - Time taken to find a solution?
- Space Complexity
  - Memory required to find a solution?

### **BFS Performance**

Complete?

Yes

Optimal?

Sometimes (when?)

Time Complexity?

•  $O(b^{d+1})$ 

- Space Complexity?
- $O(b^{d+1})$

### **DFS Performance**

Complete?

Yes, assuming no infinite paths

Optimal?

Sometimes

Time Complexity?

 $\bullet$   $O(b^m)$ 

- Space Complexity?
- $\bullet$   $O(b^m)$

### Uninformed vs. Informed Search

 Previous search methods use various methods to pick which node to expand

- But which node would we really like to expand, path costs being equal?
  - The one that is really the closest to the goal

- But we don't know this
  - If we did, wouldn't need to search

### "Informed" Search

- Uninformed or Blind Search
  - These algorithms only use the information in the problem setup to find a solution
- Informed or Heuristic Search
  - These algorithms also use an extra function, a search heuristic, to find a solution
  - The search heuristic is not part of the problem definition---it is up to the agent designer to specify it (some recent work on *learning* the heuristic)