

EECS492 January 13, 2011

General Tree Search

function Tree-search(problem)
returns a solution, or failure

fringe = new Set();
fringe.put(problem.initialState)

loop do

if fringe.isEmpty() then return failure
node ← fringe.get()
if problem.isGoalState(node)
then return node;
fringe.putAll(problem.expand(node))

A problem is specified by:

- initialState
- actions/results →
- expand()
- isGoalState

Which node in the fringe does get() return?

Measuring Search Performance

- Completeness
 - Is the algorithm guaranteed to find a solution if it exists?
- Optimality
 - Does the strategy find the minimum path cost solution?
- Time Complexity
 - How long does it take to find a solution?
- Space Complexity

How much memory is needed to perform the search?

Our search strategy will affect all of the above!

Breadth-First Search (BFS)

 General tree-search where queue is first-in-first-out (FIFO)

get operation returns oldest item on fringe



corresponds to a *level-order* traversal of search tree

□ All nodes at level *d* expanded before any at *d*+1

BFS in Vacuum World



Starting in state 1, generate search tree.



BFS again

What does BFS look like from the perspective of General Tree Search?

Search Performance Criteria: BFS

Completeness: Guaranteed to find a solution if it exists?

YES

Optimality: Does the strategy find the minimum path cost solution?

YES if uniform action cost

- Time Complexity: How long does it take to find a solution?
- Space Complexity: How much memory is needed to perform the search?

BFS Time Complexity

- Assume uniform search space
 - Each node has same # successors
 - branching factor, b
- □ *d*: Depth of shallowest solution
- BFS generates
 - complete search trees at depth $\leq d$
 - Worst case: b^{d+1} nodes at depth d+1
 - Total nodes:

 $b + b^2 + b^3 + \dots + b^d + b^{d+1} = O(b^{d+1})$

BFS Space Complexity

- □ Same as time complexity: $O(b^{d+1})$
- Must store entire fringe: all nodes at deepest level
- In typical computer configurations, will run out of space before running out of time

BFS and sub-optimal solutions



Uniform-Cost Search (UCS)

General tree-search where queue is priority-first
 get operation returns *least-cost* item on fringe



- All nodes at cost less than c expanded before any at cost c
 - Same as BFS if all actions have same cost, different otherwise

UCS Properties

- Complete?
 - Yes
- Time and space complexity
 - Uniform cost:
 - Same as BFS: O(b^{d+1})
 - In general, with minimal path cost C* and minimal action cost ε:
 - O(*b*^{C*/ε + 1})
- Optimal as long as cost monotonic along path
 Guaranteed by each edge cost >= 0

Depth-First Search (DFS)

 General tree-search where queue is last-in-first-out (LIFO, aka stack)

get operation returns newest item on fringe



- often implemented recursively using function-call stack
- Always expand deepest node on fringe

NOTE REGARDING NEXT SLIDE

The nodes should really be expanded on the right side of the tree, so that the most recently added node is expanded.



Recursive implementation

- function search_recursive(state)
 - if (is_goal(state))
 - return state;
 - for (child : children(state))
 - v = search_recursive(child)
 - if (v != null)
 - return v;
 - return null;

Performance of Depth-First

Completeness

Only for finite depth trees, and so in general: No

Optimality

No

Time Complexity

 $O(b^m)$; where *m* is the maximum depth of tree

Space Complexity

O(b m)

Depth-Limited Search

- Problem: unbounded trees in DFS
- Solution:
 - Predetermine a depth limit L
 - Run DFS, cut off search at depth L
- Complete iff exists solution within L steps
- Optimal?
- □ Time complexity: O(*b*^{*L*})
- □ Space complexity: O(*bL*)
- How do we choose *L*?

Iterative Deepening DFS

function Iterative-deepening-search(problem)
returns a solution, or failure

loop for depth from 0 to infinity
 if Depth-limited-search(problem,depth) succeeds
 then return its result
 end loop
return failure

IDS Properties

- Complete?
- Optimal?
- Time Complexity?
- Space Complexity?

IDS Complexity

□ Time is same as running DLS for depth = 1,...,d

$$\sum_{l=1}^{d} O(b^{l}) = O(b) + O(b^{2}) + \dots + O(b^{d}) = O(b^{d})$$

□ Space is same as DLS for depth *d*: O(*bd*)

Analysis Summary

Criterion	Breadth- First	Uniform- Cost	Depth- First	Depth- Limited	Iterative Deepening
Complete?	Yes	Yes	No	No	Yes
Optimal?	Yes	Yes	No	No	Yes
Time complexity	$O(b^{d+1})$	$O(b^{C^{*/\epsilon+1}})$	O(b ^m)	O(b ^L)	O(b ^d)
Space compexity	O(b ^{d+1})	$O(b^{C^{*/\epsilon+1}})$	O(bm)	O(bL)	O(bd)

Exponential in depth!

Linear in depth!

Your turn!



Show that:

$$b + b^2 + b^3 + \dots + b^n = O(b^n)$$

 (by finding a polynomial of order bⁿ with constant coefficients that is greater than the sum)

7 Queens:

- Goal: Place 7 queens on 7x7 chess board so that no two attack each other
- Formulate the problem carefully
 - What state space?
 - What actions do you consider at each step?
- Which search strategy to use?
 - Find a solution using your strategy.



7 queens, DFS



The importance of problem formulation

- Problem formulation has huge impact on complexity
 - State space
 - Actions
- □ Consider 7-queens problem:
 - Naïve state space: branching factor of roughly ~49
 - One queen per column: branching factor of 7.

Path Planning Example

- Consider an agent trying to find *the best* route from one place to another.
 - Actions = {N, S, E, W}
 DFS is out. (Why?)
- The shortest path is 50 moves.Complexity of BFS/IDS?



- How many distinct states are there?
 - **25**² << 4⁵⁰ (by a factor of 10²⁷!)
 - What are we doing wrong?
 - Repeated states!

Avoiding repeated states

- Idea: don't re-expand nodes that we've already expanded.
 - Closed list: set of all states previously visited
 - Memory usage?

General Graph Search

function Tree-search(problem) returns a solution, or failure

> closed = new Set(); closed.add(problem.initialState);

fringe = new Set();
fringe.put(problem.initialState)

loop do

if fringe.isEmpty() then return failure
node ← fringe.get()
if problem.isGoalState(node)
then return node;

for each child in problem.expand(node) if !set.contains(child) closed.add(child) fringe.put(child)

General Graph Search: Analysis

- Time complexity?
 O(|V| + |E|)
- Memory complexity?
 O(|V|)
- Optimality?
 - BFS/IDS?
 - DFS?
- What about DFS's infinite loop problem?
 Fixed for finite worlds!
- □ Can we guarantee optimality, regardless of the policy?
 - For finite worlds, if we replace old bad paths with new good paths rather than discarding the new good paths.
 - Some bookkeeping...

Graph Search: Summary

- Graph Search
 - Maintains list of states already visited
 - Terminates searches that revisit the same states.
- □ When do we want to use graph search?
 - When repeated states are likely
 - We can afford the memory

Next Time: Informed Search

- Employ additional information about node states in deciding which to expand
- Questions:
 - What criteria?
 - How to exploit?
 - Properties?