

Problem Spaces & Search

CSE 473

473 Topics

Agents & Environments

Problem Spaces

Search & Constraint Satisfaction

Knowledge Repr'n & Logical Reasoning

Machine Learning

Uncertainty: Repr'n & Reasoning

Dynamic Bayesian Networks

Markov Decision Processes

Weak Methods

“In the knowledge lies the power...”
[Feigenbaum]

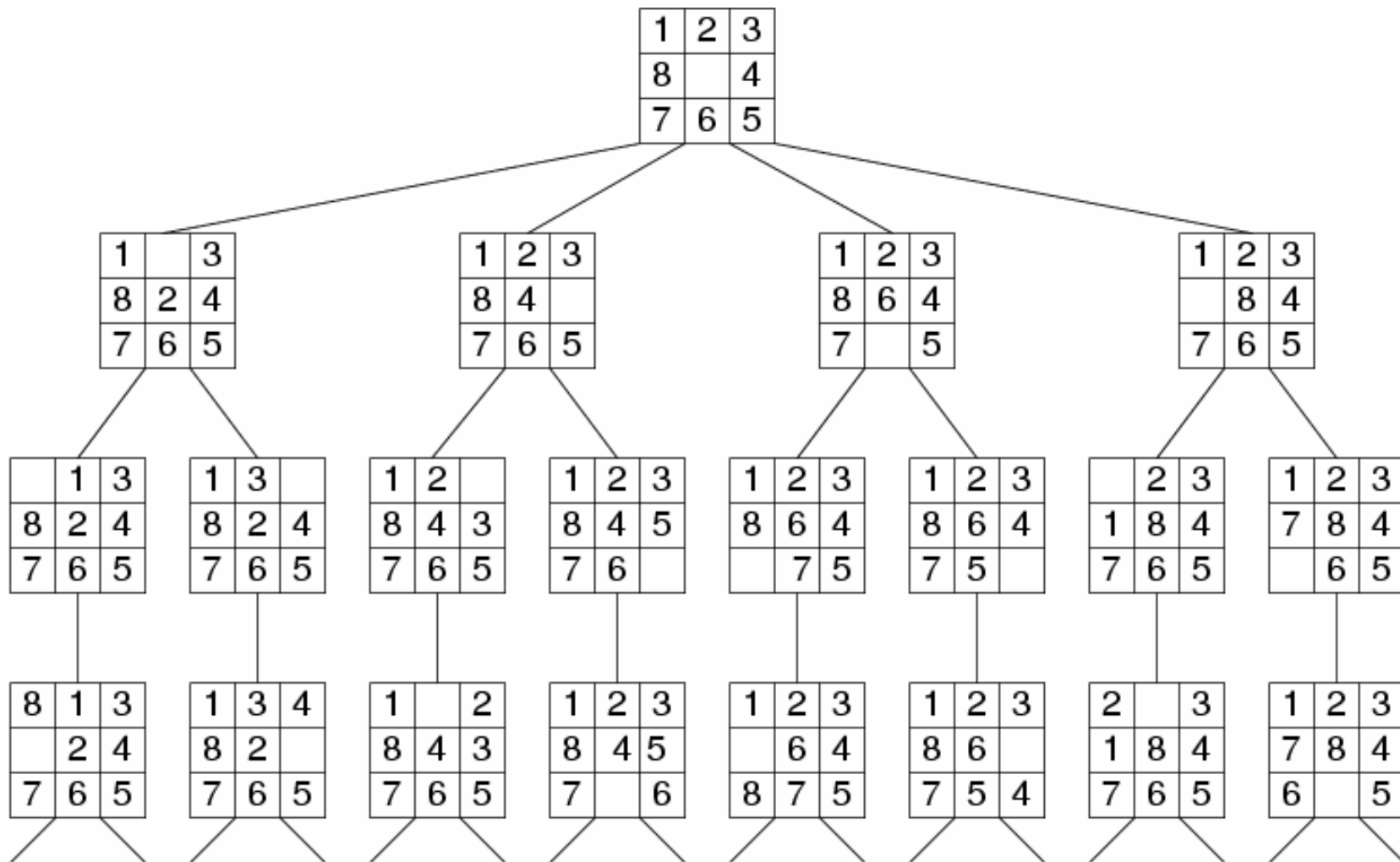
But what if no knowledge????

Generate & Test

As weak as it gets...

Works on semi-decidable problems!

Example: Fragment of 8-Puzzle Problem Space



Search thru a Problem Space / State Space

Input:

- Set of states
- Operators [and costs]
- Start state
- Goal state [test]

Output:

- Path: start \Rightarrow a state satisfying goal test
- [May require shortest path]

Example: Route Planning

Input:

- Set of states
- Operators [and costs]
- Start state
- Goal state (test)

Output:



Example: N Queens

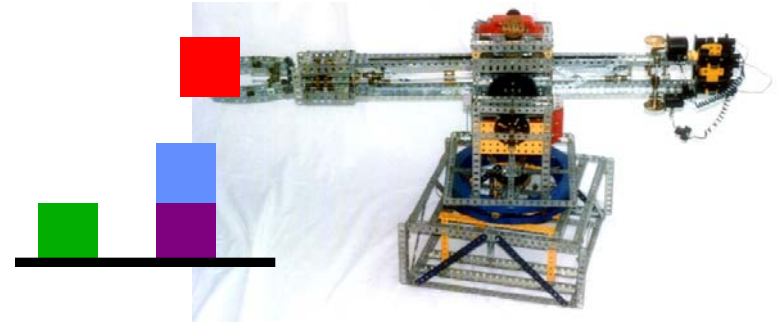
Input:

- Set of states
- Operators [and costs]
- Start state
- Goal state (test)

		Q	
Q			
			Q
	Q		

Output

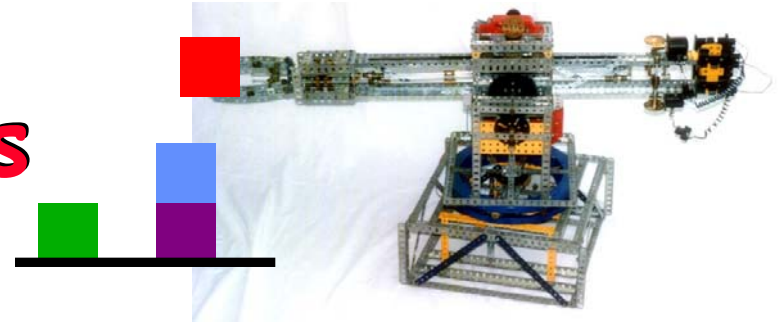
Example: Blocks World



Input:

- Set of states
 - Partially specified plans
- Operators [and costs]
 - Plan modification operators
- Start state
 - The null plan (no actions)
- Goal state (test)
 - A plan which provably achieves
 - The desired world configuration

Multiple Problem Spaces



Real World

States of the world (e.g. block configurations)

Actions (take one world-state to another)

Robot's Head

Problem Space 1

PS states =

models of world states

Operators =

models of actions

Problem Space 2

PS states =

partially spec. plan

Operators =

plan modification ops

Classifying Search

GUESSING ("Tree Search")

- Guess how to extend a partial solution to a problem.
- Generates a tree of (partial) solutions.
- The leafs of the tree are either "failures" or represent complete solutions

SIMPLIFYING ("Inference")

- Infer new, stronger constraints by combining one or more constraints (without any "guessing")

Example:

$$\begin{array}{rcl} X+2Y & = & 3 \\ X+Y & = & 1 \\ \text{therefore} & & Y = 2 \end{array}$$

WANDERING ("Markov chain")

- Perform a (biased) random walk through the space of (partial or total) solutions

Guessing - State Space Search

1. BFS
2. DFS
3. Iterative Deepening
4. Bidirectional
5. Best-first search
6. A*
7. Game tree
8. Davis-Putnam (logic)
9. Cutset conditioning (probability)

Simplification - Constraint Propagation

1. Forward Checking
2. Path Consistency (Waltz labeling, temporal algebra)
3. Resolution
4. "Bucket Algorithm"

Wandering - Randomized Search

1. Hillclimbing
2. Simulated annealing
3. Walksat
4. Monte-Carlo Methods

**Constraint
Satisfaction**

Search Strategies v2

Blind Search

- Depth first search
- Breadth first search
- Iterative deepening search
- Iterative broadening search

Informed Search

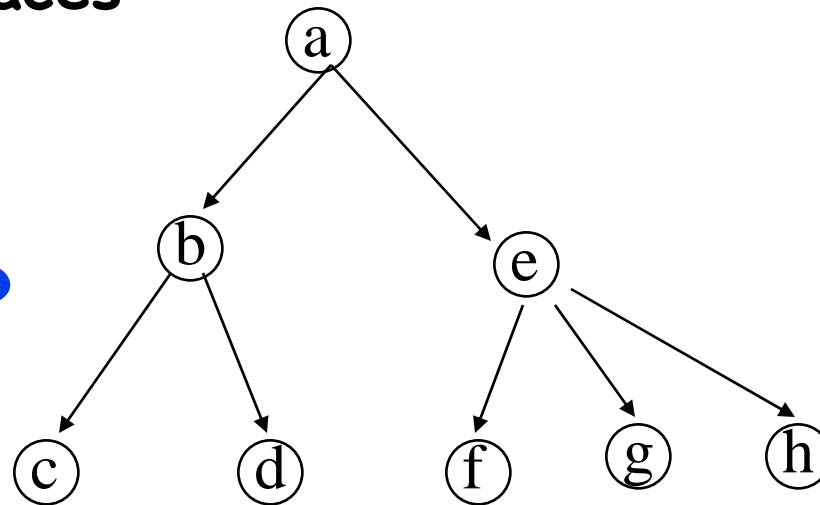
Constraint Satisfaction

Adversary Search

Depth First Search

Maintain stack of nodes to visit
Evaluation

- **Complete?**
Not for infinite spaces
- **Time Complexity?**
 $O(b^d)$
- **Space Complexity?**
 $O(d)$



Breadth First Search

Maintain queue of nodes to visit

Evaluation

- Complete?

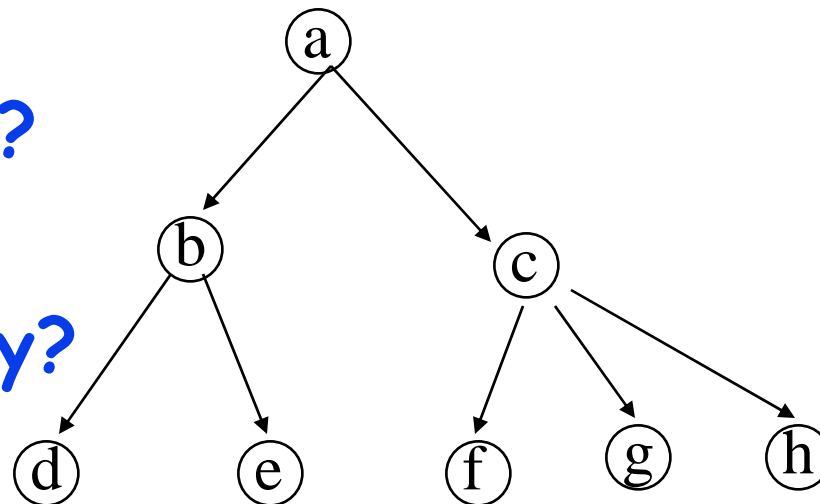
Yes

- Time Complexity?

$O(b^d)$

- Space Complexity?

$O(b^d)$



Memory a Limitation?

Suppose:

2 GHz CPU

1 GB main memory

100 instructions / expansion

5 bytes / node

200,000 expansions / sec

Memory filled in 100 sec ... < 2 minutes

Iterative Deepening Search

DFS with limit; incrementally grow limit

Evaluation

- Complete?

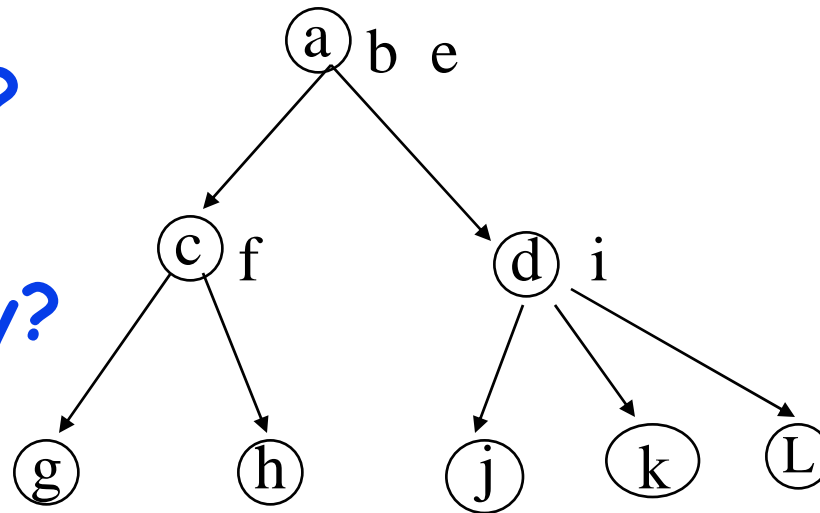
Yes

- Time Complexity?

$O(b^d)$

- Space Complexity?

$O(d)$



Cost of Iterative Deepening

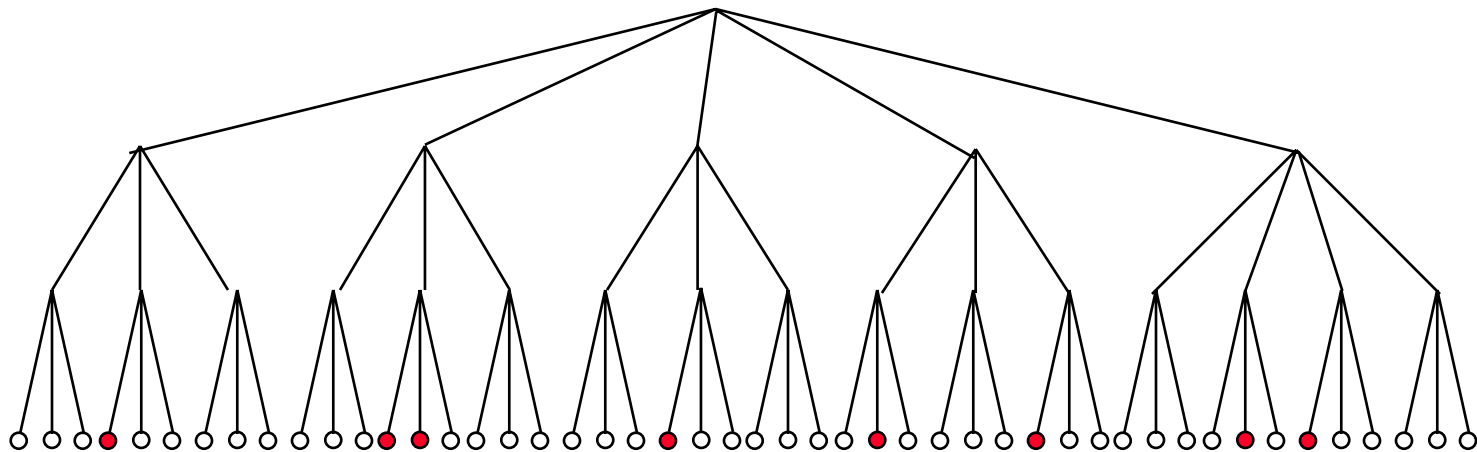
b	ratio ID to DFS
2	3
3	2
5	1.5
10	1.2
25	1.08
100	1.02

When to Use Iterative Deepening

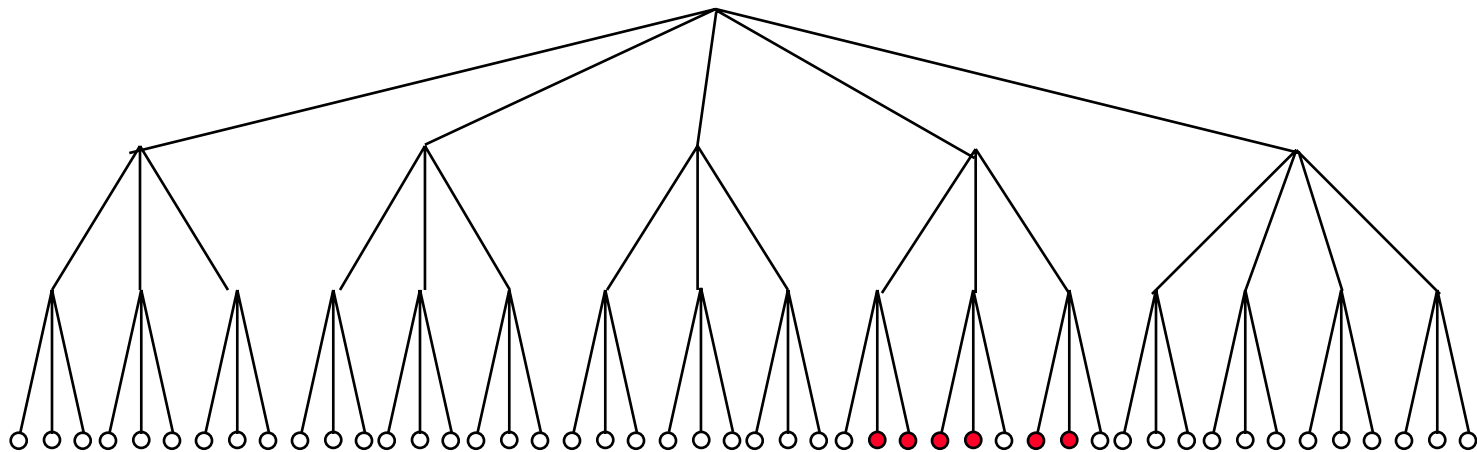
N Queens?

		Q	
Q			
			Q
	Q		

Search Space with Uniform Structure



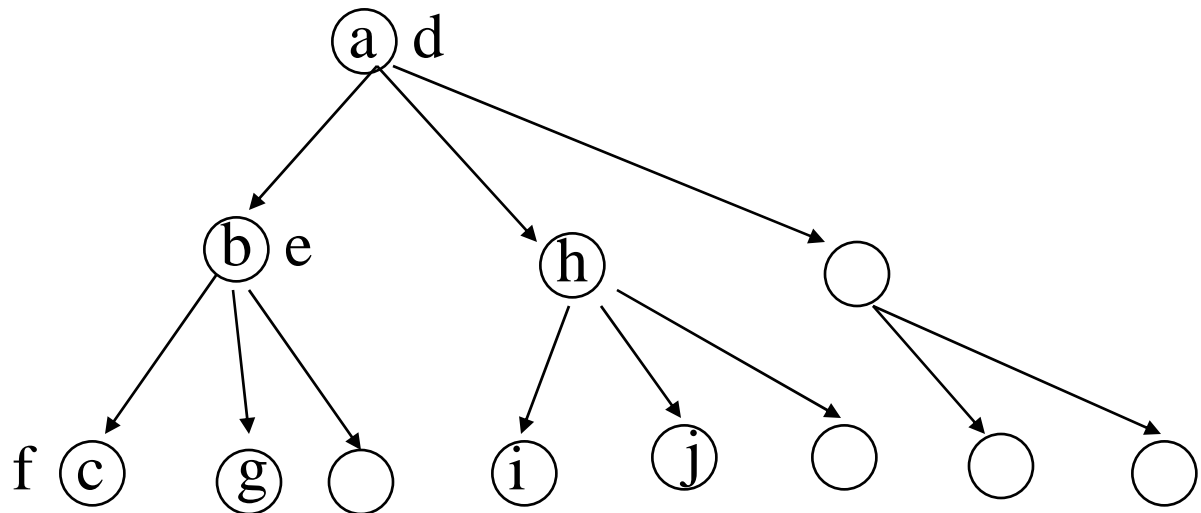
Search Space with Clustered Structure



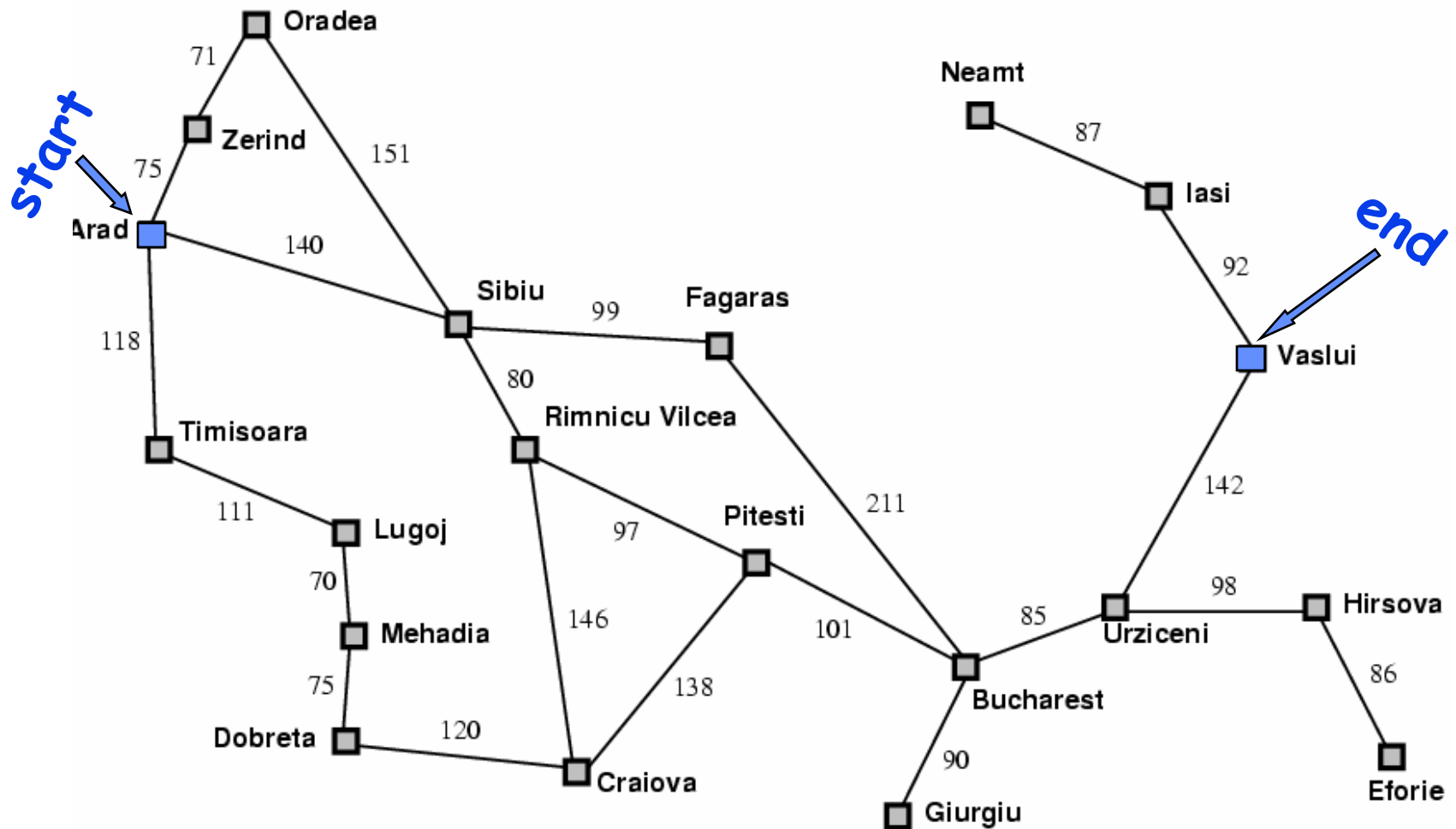
Iterative Broadening Search

What if know solutions lay at depth N?

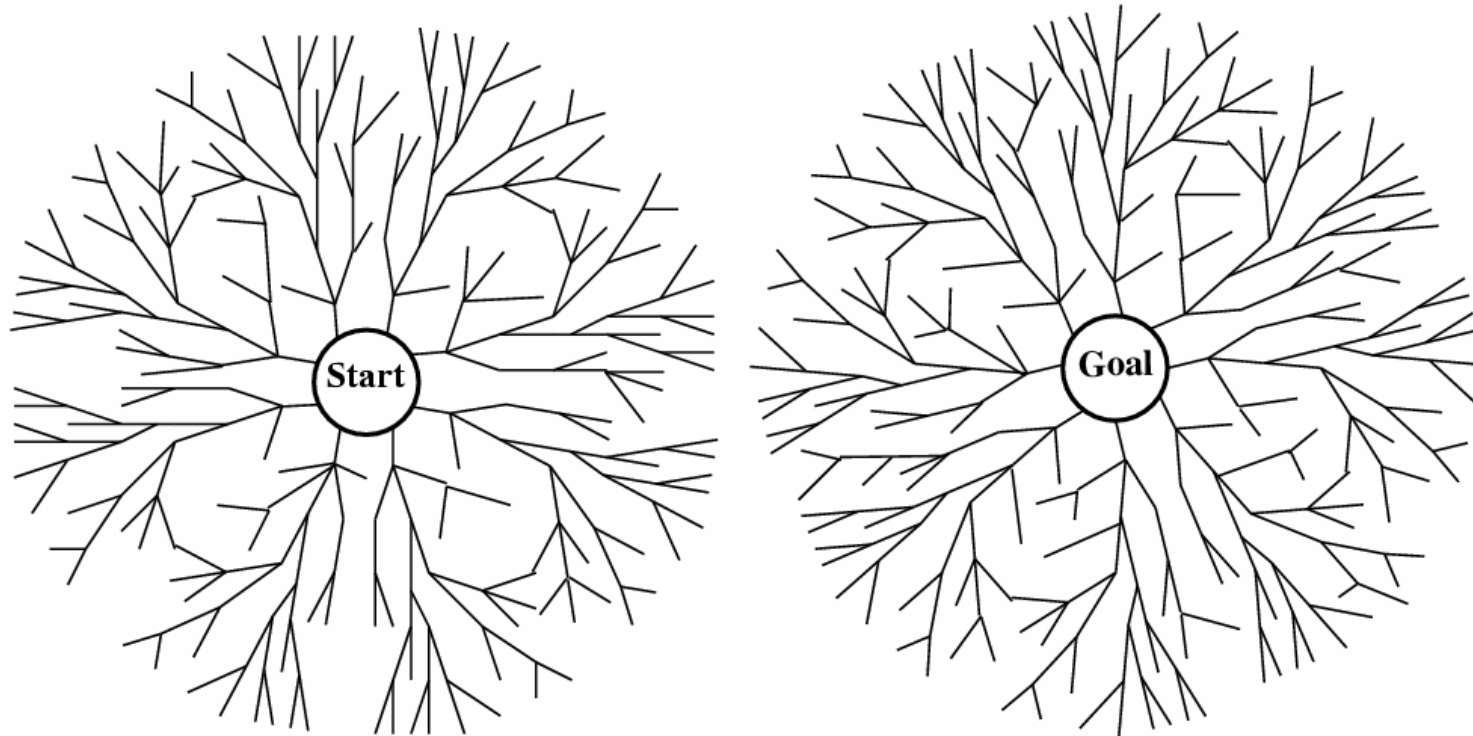
No sense in doing iterative *deepening*



Forwards vs. Backwards



vs. Bidirectional



Problem

All these methods are slow (blind)

Solution → add guidance (“heuristic estimate”)
→ “informed search”

... next time ...

Recap: Search thru a Problem Space / State Space

Input:

- Set of states
- Operators [and costs]
- Start state
- Goal state [test]

Output:

- Path: start \Rightarrow a state satisfying goal test
- [May require shortest path]

Cryptarithmic

Input:

- Set of states
- Operators [and costs]
- Start state
- Goal state (test)

SEND
+ MORE

MONEY

Output:

Concept Learning

Labeled Training Examples

<p1,blond,32,mc,ok>

<p2,red,47,visa,ok>

<p3,blond,23,cash,ter>

<p4,...

Output: $f: \langle p_n \dots \rangle \rightarrow \{ok, ter\}$

Input:

- Set of states
- Operators [and costs]
- Start state
- Goal state (test)

Output:

Symbolic Integration

E.g. $\int x^2 e^x dx = e^x(x^2 - 2x + 2) + C$

Operators:

Integration by parts

Integration by substitution

...