

Information on paper presentations

- Find and read a recent (2002 or later) paper on a topic that interests you:
 - [Google Scholar](#)
- If there are things in the paper you don't understand, look them up, ask me or our TA, or ask your friends!
- Presentation
 - About 15 minutes
 - Summarize paper, show pictures, answer questions
 - Use Powerpoint slides or equivalent
 - Anything you still don't understand, say "I didn't understand this part"

- Let me know if there are any dates when you **cannot** present a paper in class
- Schedule will be put together by next class

Team projects

Second half of today's class will be for project brainstorming and matchmaking.

- **Reading for next two classes:**
Textbook, Chapter 2 pp. 21-26; Chapter 3 pp. 49-80;
Chapter 4, p. 90-112.
- **Optional reading:**
Textbook, Chapter 4 pp. 112-139
- Next homework will be assigned on Monday.

Problem-solving as search

Some classic AI search problems

“Toy problems”

1. 8-puzzle
2. Missionaries and cannibals

Solving algebraic equations

Proving theorems

Robotic path planning

Game-playing

8-puzzle

initial
state

4	5	
6	1	8
7	3	2

goal
state

1	2	3
4	5	6
7	8	

Can use search to:

- find any solution
- find solution with minimal number of moves

What is size of state space for 8-puzzle?

Assume that from any possible configuration of the 8-Puzzle we can get to any other possible configuration.

What is size of state space for 8-puzzle?

Assume that from any possible configuration of the 8-Puzzle we can get to any other possible configuration.

Size of state space $\propto 9! = 181,440$

Size of 15-puzzle state space?

What is size of state space for 8-puzzle?

Assume that from any possible configuration of the 8-Puzzle we can get to any other possible configuration.

Size of state space $\propto 9! = 181,440$

Size of 15-puzzle state space? $\propto 16! = 2 \times 10^{13}$

What is size of state space for 8-puzzle?

Assume that from any possible configuration of the 8-Puzzle we can get to any other possible configuration.

Size of state space $\propto 9! = 181,440$

Size of 15-puzzle state space? $\propto 16! = 2 \times 10^{13}$

Size of 24-puzzle state space?

What is size of state space for 8-puzzle?

Assume that from any possible configuration of the 8-Puzzle we can get to any other possible configuration.

Size of state space $\propto 9! = 181,440$

Size of 15-puzzle state space? $\propto 16! = 2 \times 10^{13}$

Size of 24-puzzle state space? $\propto 25! = 1.5 \times 10^{25}$

What is size of state space for 8-puzzle?

Assume that from any possible configuration of the 8-Puzzle we can get to any other possible configuration.

Size of state space $\propto 9! = 181,440$

Size of 15-puzzle state space? $\propto 16! = 2 \times 10^{13}$

Size of 24-puzzle state space? $\propto 25! = 1.5 \times 10^{25}$

Can't do exhaustive search!

Approximate number of states

Tic-Tac-Toe: 3^9

Checkers: 10^{40}

Rubik's cube: 10^{19}

Chess: 10^{120}

How to solve a problem by searching

1. Define search space
 - Initial, goal, and intermediate states
2. Define operators for expanding a given state into its possible successor states
3. Apply search algorithm to find path from initial to goal state, while avoiding repeating a state during the search.

Search methods

Uninformed search:

1. Breadth-first
2. Depth-first
3. Depth-limited
4. Iterative deepening depth-first
5. Bidirectional

Informed (or heuristic) search:

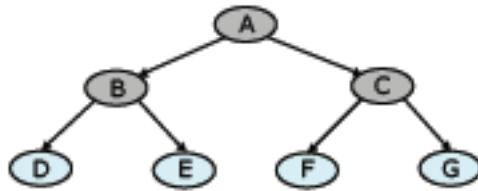
1. Greedy best-first
2. A* (and many variations)

Adversarial search:

1. Minimax with alpha-beta pruning

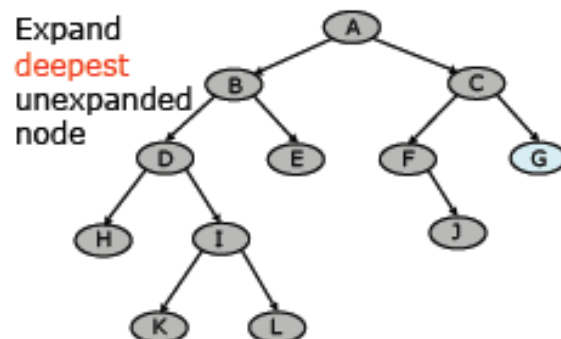
Breadth-first search

Expand all nodes at depth d before proceeding to depth $d+1$



Depth-first search

Expand deepest unexpanded node



Example: 8-puzzle

Informed (heuristic) Search

- What is a “heuristic”?
- Examples:
 - 8 puzzle
 - Missionaries and Cannibals
 - Tic Tac Toe

Heuristic Search

Best-first greedy search:

1. *current state = initial state*
2. Expand *current state*
3. Evaluate offspring states s with heuristic $h(s)$, which estimates cost of path from s to goal state
4. *current state = argmin_s h(s) for s ∈ offspring(current state)*
5. If *current state ≠ goal state*, go to step 2.

Search Terminology

Completeness

- *solution will be found, if it exists*

Optimality

- *least cost solution will be found*

Admissible heuristic h

$\forall s, h$ never overestimates true cost from state s to goal state

Best first greedy search: Complete? Optimal?

8-puzzle heuristics: admissible?

A* Search

Uses evaluation function $f = g + h$

1. **g is a cost function**
 - Total cost incurred so far from initial state
2. **h is an admissible heuristic**

Best first search is A* with $g = 0$.

$h_1(n)$ = number of misplaced tiles

$h_2(n)$ = total Manhattan distance

(i.e., no. of squares from desired location of each tile)

5	4	
6	1	8
7	3	2

Start State

1	2	3
8		4
7	6	5

Goal State

$h_1(\text{start state}) =$

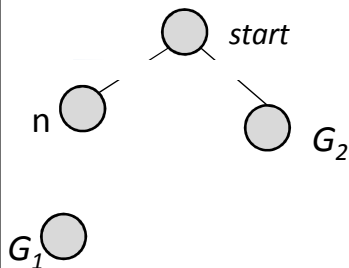
$h_2(\text{start state}) =$

A* search is optimal and complete

Proof of Optimality of A*

Suppose a suboptimal goal G_2 has been generated and is in the OPEN list.

Let n be an unexpanded node on a shortest path to an optimal goal G_1 .



$$f(G_2) = g(G_2) \text{ since } h(G_2) = 0$$

$$> g(G_1) \text{ since } G_2 \text{ is suboptimal}$$

$$f(G_2) > f(n) \text{ since } h \text{ is admissible}$$

Since $f(G_2) > f(n)$, A* will never select G_2 for expansion

Variations of A*

- IDA* (iterative deepening A*)
- ARA* (anytime repairing A*)
- D* (dynamic A*)

Applications?

Simulated Annealing

Given starting state S:

1. Set Temperature $T = \text{max Temperature}$
2. Calculate the energy $E(S)$.
Here, $E(S) = f(S) + h(S)$
3. Until ($T = 0$ or solution found)
 - $S' = \text{random-perturbation}(S)$
 - $\Delta E = E(S') - E(S)$
 - $p = \exp(-\Delta E / T)$
 - if ($p > \text{random}[0,1]$)
 - $S = S'$
 - $T = T - T_increment$

Simulated Annealing

Given starting state S:

1. Set Temperature $T = \text{max Temperature}$
2. Calculate the energy $E(S)$.
Here, $E(S) = f(S) = g(S) + h(S)$
 What happens if $T = 0$ and $T_increment = 0$?
 What happens if $T = \text{max } T$ and $T_increment = 0$?
3. Until ($T = 0$ or solution found)
 $S' = \text{random-perturbation}(S)$
 $\Delta E = E(S') - E(S)$
 $p = \exp(-\Delta E / T)$
 if ($p > \text{random}[0,1]$)
 $S = S'$
 $T = T - T_increment$
 What happens when $T_increment$ is large?
 What happens when $T_increment$ is small?

Example of Simulated Annealing

Simulated Annealing is complete (if you run it for a long enough time!)

Also covered in textbook:

Hill climbing

Tabu search