

## Week 20: Search I

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(based on slides from Raul Santos Rodriguez)

Have a look at ...

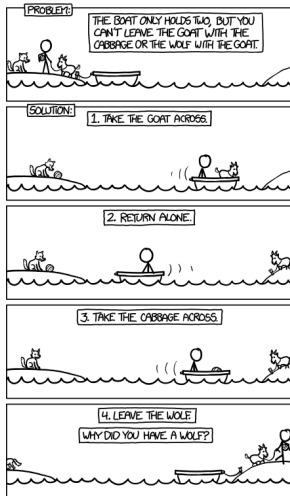
... Russell and Norvig (Ch. 3)

A farmer wants to get his cabbage, goat, wolf across a river. He has a boat that only holds two. He cannot leave cabbage and goat alone or goat and wolf alone.

How many river crossings does he need?

- 4
- 5
- 6
- 7
- No solution

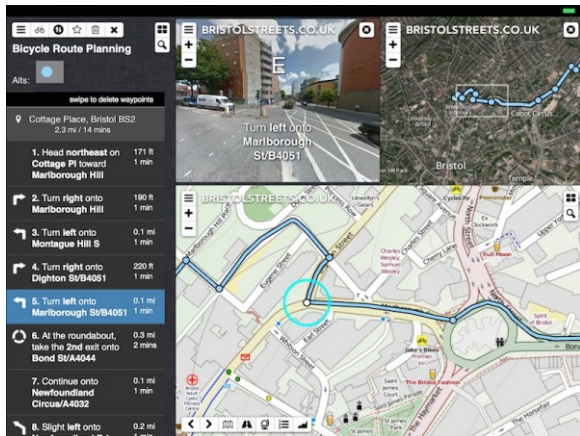
# One solution...



Search or how to find a sequence of actions that achieves a goal when no single action will do. We will cover

- Backtracking search
- Depth-first search
- Breadth-first search
- DFS with iterative deepening

# Application: route finding



**Actions:** go straight, turn left, turn right

**Objective:** shortest? fastest? most scenic?

## Application: solving puzzles

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7	2	4
5		6
8	3	1

Start State

	1	2
3	4	5
6	7	8

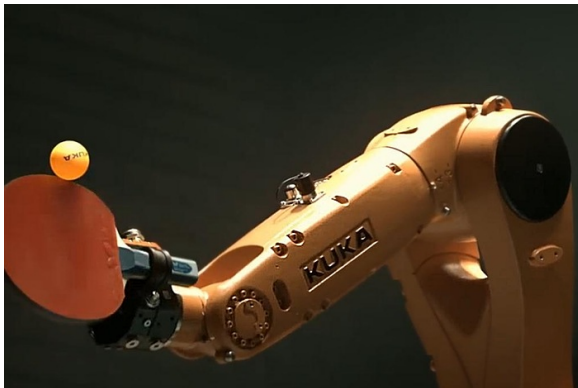
Goal State

**Actions:** move pieces

**Objective:** reach a certain configuration

8-puzzle

## Application: robot planning



**Actions:** translate and rotate joints

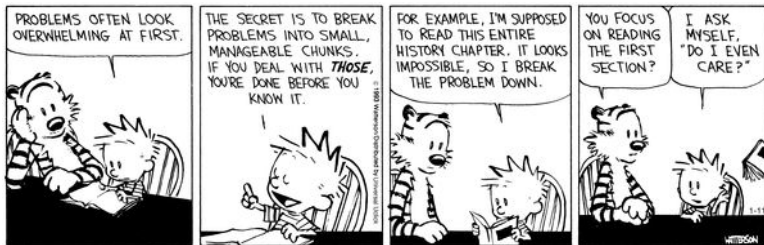
**Objective:** fastest? most energy efficient? safest?



In all of these examples → sequence of actions

## Idea

Decompose our very complex problem into small problems



# Tree search: example



Farmer   Cabbage   Goat   Wolf

**Actions:**

F▷

F◁

FC▷

FC◁

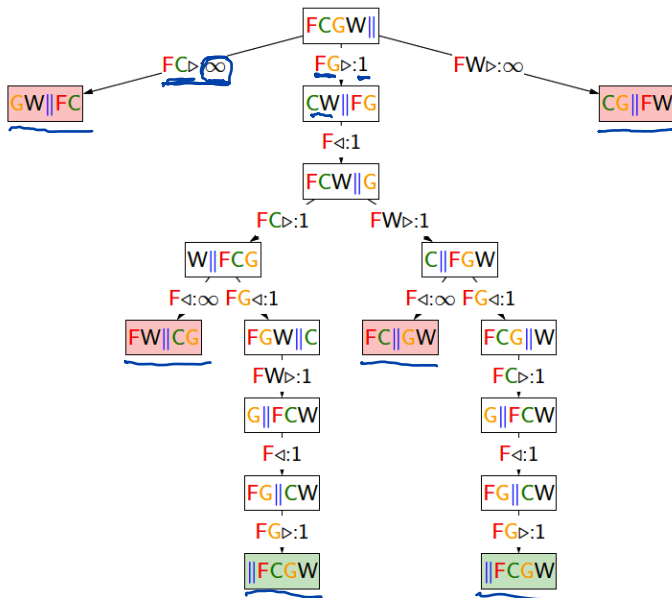
FG▷

FG◁

FW▷

FW◁

# Tree search: example



Search algorithms require a structure to keep track of the search tree that is being constructed:

## Search

- $s_{start}$ : starting state
- Actions(s): possible actions
- Cost(s,a): action cost
- Succ(s,a): successors
- Goal(s): found solution?

**Completeness:** Is the algorithm guaranteed to find a solution when there is one?

**Optimality:** Does the strategy find the optimal solution?

**Time complexity:** How long does it take to find a solution?

**Space complexity:** How much memory is needed to perform the search?

## Complexity

Complexity is expressed in terms of three quantities:

- $b$ , the branching factor or maximum number of successors of any node;
- $d$ , the depth of the shallowest goal node (i.e., the number of steps along the path from the root);
- $D$ , the maximum length of any path in the state space.

## BacktrackingSearch(s,path)

**If** Goal(s): update minimum cost path  
**Else for each** action  $a \in \text{Actions}(s)$ :  
    Extend path with Succ(s,a) and Cost(s,a)  
    **Call** BacktrackingSearch(Succ(s,a), path)  
**Return** minimum cost path

If  $b$  actions per state, maximum depth is  $D$  actions:

- Memory:  $O(D)$  (small)
- Time:  $O(b^D)$  (huge)

$$1 + b + b^2 + \dots + b^D$$

$$b^D$$

# Depth-first search

**Idea:** Backtracking search + stop when find the first goal state

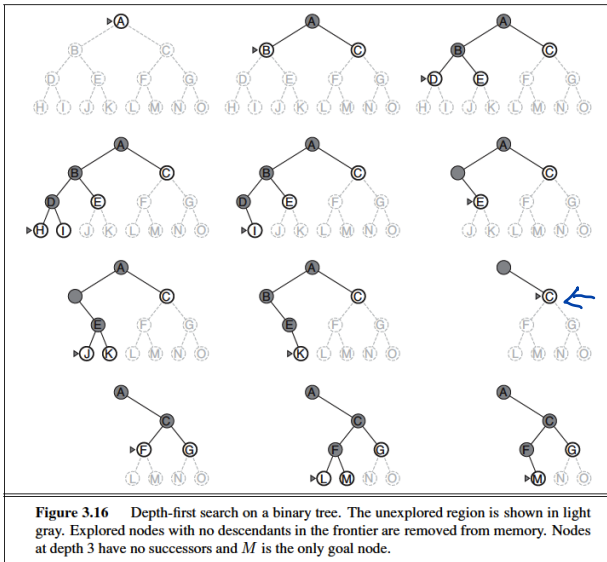
**Assumption:** Action costs  $\text{Cost}(s,a) = 0$

If  $b$  actions per state, maximum depth is  $D$  actions:

- Memory:  $O(D)$  (small)
- Time:  $O(b^D)$  (huge) but that is just for the worst case (could be much better if solutions are easy to find)

DFS is great when there are an abundance of solutions

# Depth-first search





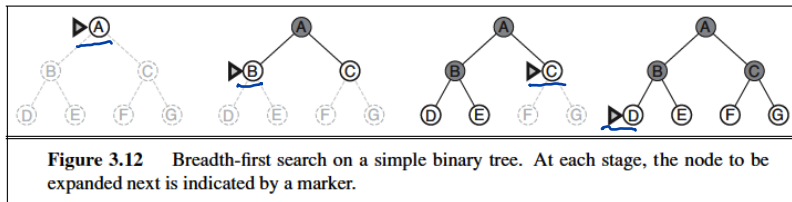
**Idea:** explore all nodes in order of increasing depth

**Assumption:** Action costs  $\text{Cost}(s,a)=c$  for some  $c \geq 0$

If  $b$  actions per state, maximum depth is  $d$  actions:

- Memory:  $O(b^d)$  (**worse**)
- Time:  $O(b^d)$  (depends on  $d$  instead of  $D$ )

# Breadth-first search



# DFS with iterative deepening

**Idea:** Modify DFS to stop at a maximum depth

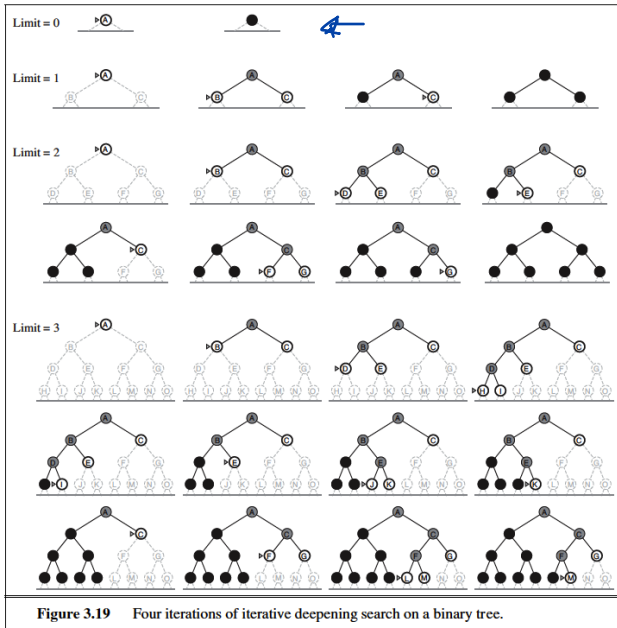
**Idea:** Call DFS for maximum depths  $1, 2, \dots$

**Assumption:** Action costs  $\text{Cost}(s, a) = c$  for some  $c \geq 0$

If  $b$  actions per state, solution size  $d$ :

- Memory:  $O(d)$  (better!)
- Time:  $O(b^d)$  (same as BFS)

# DFS with iterative deepening



# Comparison

Algorithm	Action costs	Space	Time
DFS	zero	$O(D)$	<u><math>O(b^D)</math></u>
BFS	constant	$O(b^d)$	<u><math>O(b^d)</math></u>
DFS-ID	constant	$O(d)$	<u><math>O(b^d)</math></u>
Backtracking	any	$O(D)$	<u><math>O(b^D)</math></u>

$b$  actions per state, solution depth  $d$ , maximum depth  $D$

- Backtracking search - traverse all nodes of the graph to find the optimal route to the goal
- Depth first search - traverse a search tree by going deeper first
- Breadth-first search - traverse a tree by going broader first
- Depth first search with iterative deepening - increase the depth of the tree step by step
- Think about whether the algorithms are complete, optimal, and their complexity in time and space