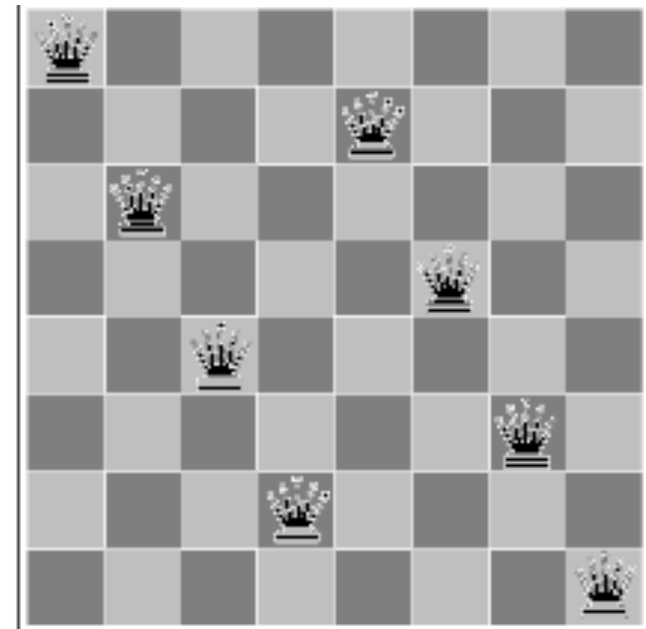
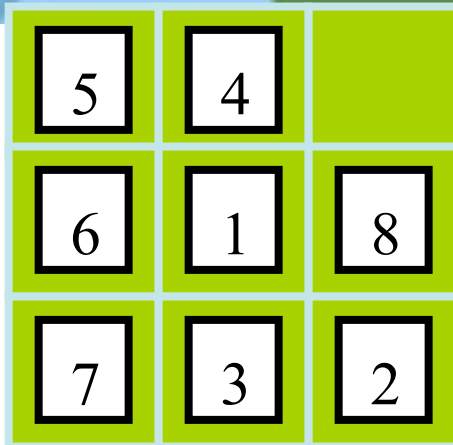


# Problem Solving by Search



# Readings for this class

- Chapter 3

# Learning Objectives

- understand how to formulate a problem in AI terms
- review basics of blind search methods
- recognize benefits of iterative deepening
- know how to design heuristics and apply them in A\* search

# Problem Formulation

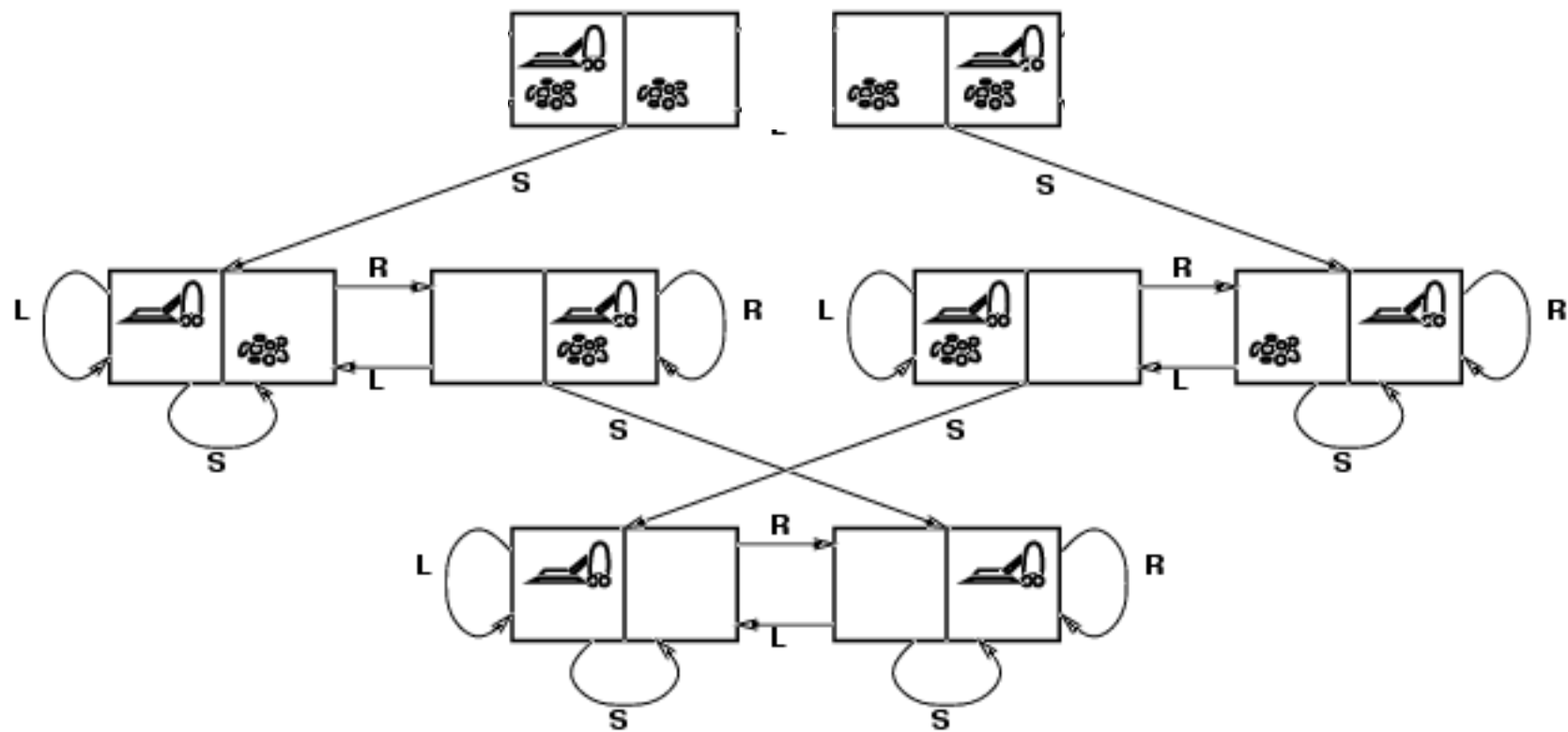
- **states**: description of “world of interest”
- **initial state**
- **successor function**: generates set of legal next states from available actions
- **goal test**: how do we know we’re done?
- **path cost**: way of choosing between multiple solutions (e.g., shortest route)

# Vacuum World Problem

- **successor function:**
  - move left (L), move right (R), suck (S)
- **goal test:**
  - no dirt left in any square
- **path cost:**
  - each step costs 1



# State Tree for the Vacuum World



# Missionaries & Cannibals



- 3 missionaries and 3 cannibals need to cross crocodile-infested river
- boat can hold 1 or 2 people
- can't leave any missionaries outnumbered by cannibals

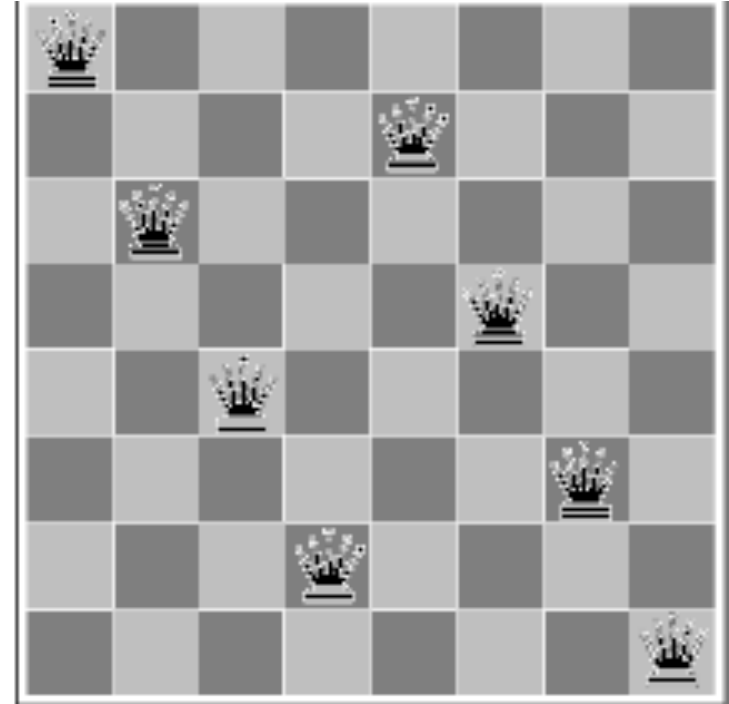
# Missionaries & Cannibals: Formulation

- **states:** (# missionaries, # cannibals, # of boats) on left bank of river
- **initial state:** (3,3,1)
- **successor function:** move (# missionaries, # cannibals) from one bank to other
- **goal test:** (0,0,0)
- **path cost:** # of river crossings



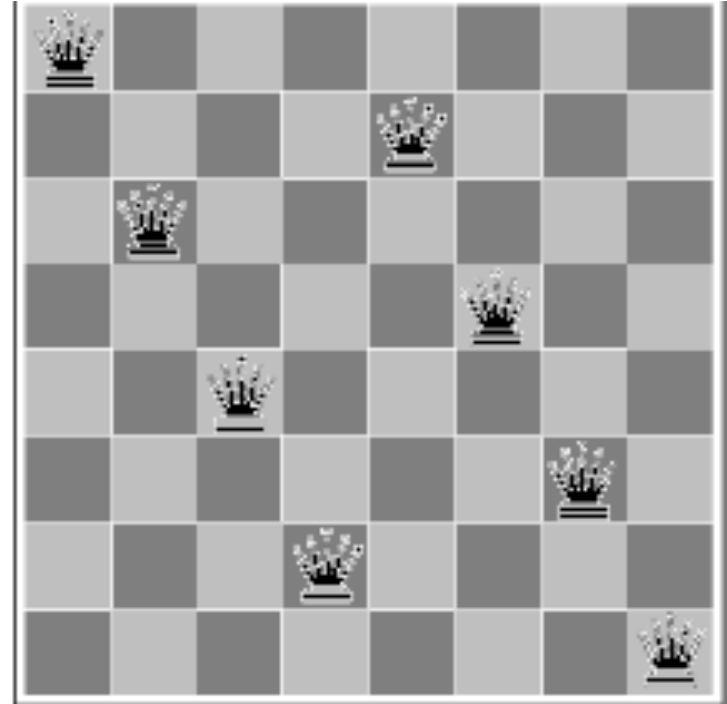
# 8-Queens problem

- arrange 8 queens on a chessboard so that no two queens are on the same row, column or diagonal (i.e., attack each other)
- applications to parallel memory storage, VLSI testing, traffic control, and deadlock prevention



# Naïve approach

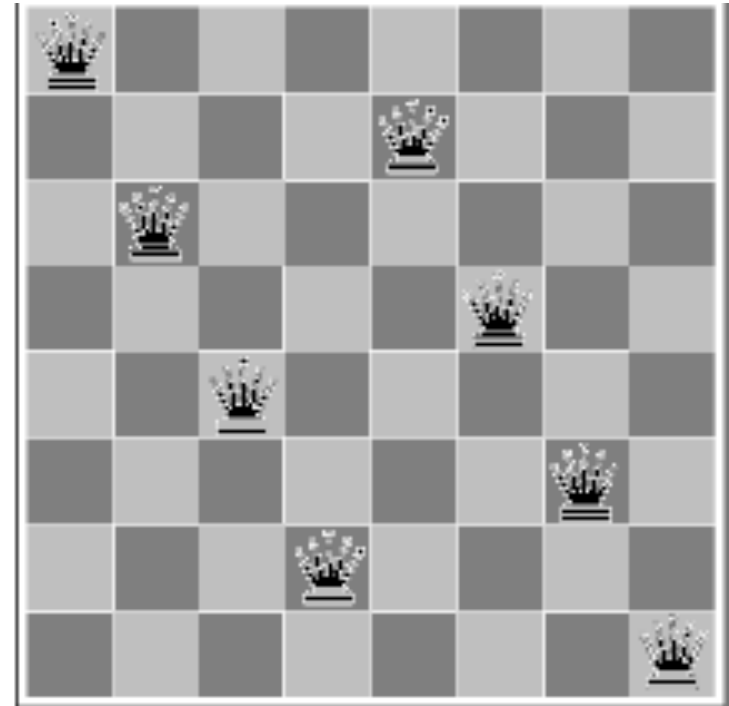
- **state**: any arrangement of [0,8] queens on the board
- **successor function**: add a queen to any empty square



State space:  $3 \times 10^{14}$

## Better approach

- **state**: any arrangement of  $n=[0,8]$  queens, one per column in the leftmost  $n$  columns, with no queen attacking another
- **successor function**: add a queen to any square in the leftmost empty column such that it is not attacked by any other queen



State space: 2057

# Search Methods

- use to explore state space for solution to a problem
- can be uninformed (blind) or use some reasonable knowledge (heuristics) to guide search

# Uninformed Search

- breadth-first
  - expand shallowest nodes first (FIFO)
- depth-first
  - expand deepest nodes first (LIFO)
- depth-limited search
  - depth-first with cutoff
- iterative-deepening
  - combines benefits of BFS and DFS
- bidirectional
  - applicable when operators are reversible

## Breadth-first search

- Expand *shallowest* unexpanded node
- Put successors at end of FIFO queue

# Breadth-first search

Complete?	Yes (if $b$ is finite)
Time complexity	$1+b+b^2+b^3+\dots +b^d = O(b^d)$
Space complexity	$O(b^d)$ (every node kept in memory)
Optimal?	Yes (if cost = 1 per step)

$b$ : maximum branching factor of search tree

$d$ : depth of the least cost solution

Exponential time/memory requirements make breadth-first search unsuitable for large problems

# Depth-first search

- Expand *deepest* unexpanded node
- Put successors at end of LIFO queue (or push on stack)



# Depth-first search

Complete?	No (fails in infinite-depth spaces or spaces with loops)
Time complexity	$O(b^m)$ (bad if $m \gg d$ )
Space complexity	$O(bm)$ (linear in space)
Optimal?	No

b: maximum branching factor of search tree

d: depth of the least cost solution

m: maximum depth of state space

## How to get best of both worlds?

- i.e., how to combine completeness of breadth first & space complexity of depth-first search?
- start with depth-limited search
  - solves the infinite depth problem

# Depth-limited search

- depth-first search with depth limit  $\ell$

Complete?                      only if  $\ell > d$

Time complexity                 $O(b^\ell)$

Space complexity                $O(b\ell)$

Optimal?                        only if  $\ell = d$

# Iterative-deepening search

- use depth-limited search as subroutine with increasing  $\ell$
- is this efficient?

Complete?

Yes

Time complexity

$$d + (d-1)b + (d-2)b^2 + \dots + b^d = O(b^d)$$

Space complexity

$$O(bd)$$

Optimal?

Yes (if cost = 1 per step)

# 8-squares problem

What's a good state description and successor function?

5	4	
6	1	8
7	3	2

initial state

1	2	3
8		4
7	6	5

goal state

# Informed Search: Greedy Search

- minimize estimated cost to goal,  $h(n)$
- start by expanding minimal cost node

# Informed Search: A\* search

- minimize estimated cost to goal:  $f(n) = g(n) + h(n)$ 
  - $g(n)$  = cost of solution from start to  $n$
  - $h(n)$  is estimated cost of cheapest solution from  $n$  to goal
- A\* uses a best-first search: chooses least-cost path from initial state to goal state

# Definitions

- $h(n)$  is **admissible** or **valid** if it never over-estimates true cost to reach goal
- $h(n)$  is **consistent** or **monotonic** if  $f(n)$  never increases as one follows a path from a node through its successors, toward the goal
- a consistent heuristic is also admissible



# Optimality of A\* search

- If  $h(n)$  is admissible, A\* is optimal:
  - no optimal algorithm employing the same heuristic will expand fewer nodes than A\*

# Homework

- Read **before next class:**
  - Ch. 5-5.4