



# Discussion

CS 5/7320  
Artificial Intelligence

## Solving problems by searching

AIMA Chapter 3

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Slides by Michael Hahsler  
based on slides by Svetlana Lazepnik  
with figures from the AIMA textbook.



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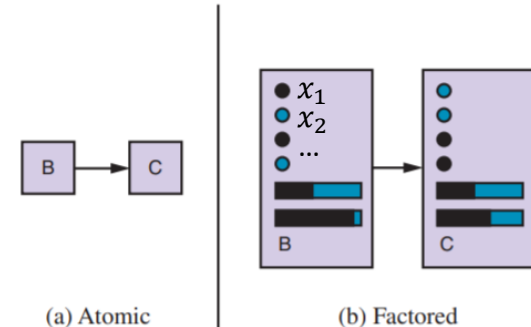
The background of the slide is a deep space image featuring a vast number of stars. A prominent, bright, yellowish-white cluster of stars is located in the upper-left quadrant, appearing as a dense, glowing nebula or star-forming region. The rest of the field is populated with numerous individual stars of varying brightness and colors, including white, blue, and yellow, scattered across the dark cosmic background.

**State Space for Search**

# State Space

- Number of different states the agent and environment can be in.
- **Reachable states** are defined by the initial state and the transition model. Not all states may be reachable from the initial state.
- **Search tree** spans the state space. Note that a single state can be represented by several search tree nodes if we have redundant paths.
- State space size is an indication of problem size.

## State representation



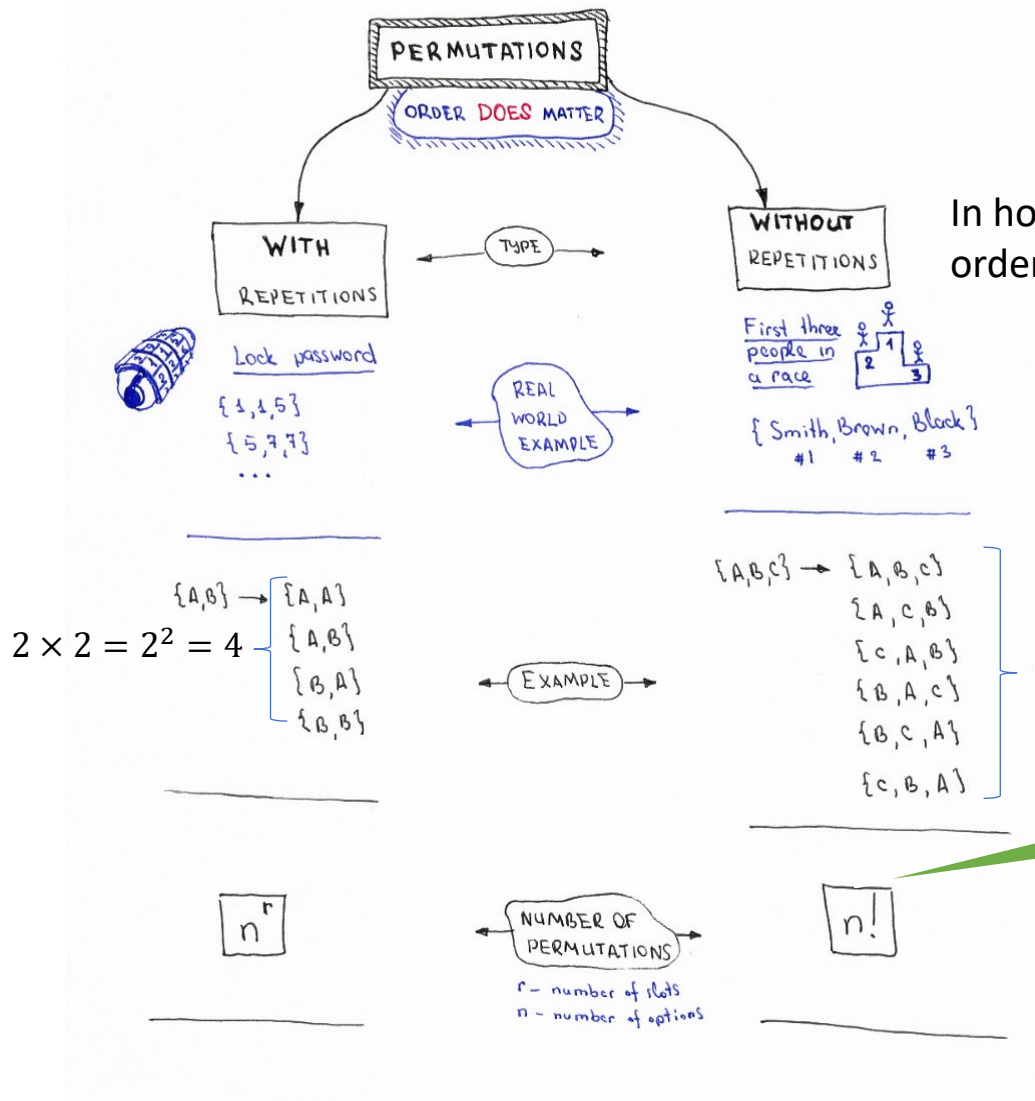
The state consists of variables called fluents that represent conditions that can change over time.

## State Space Size Estimation

- Even if the used algorithm represents the state space using atomic states, we may know that internally they have a factored representation that can be used to estimate the problem size.
- The basic rule to calculate (estimate) the state space size for factored state representation with  $n$  fluents (variables) is:

$$|x_1| \times |x_2| \times \dots \times |x_n|$$

where  $|\cdot|$  is the number of possible values.

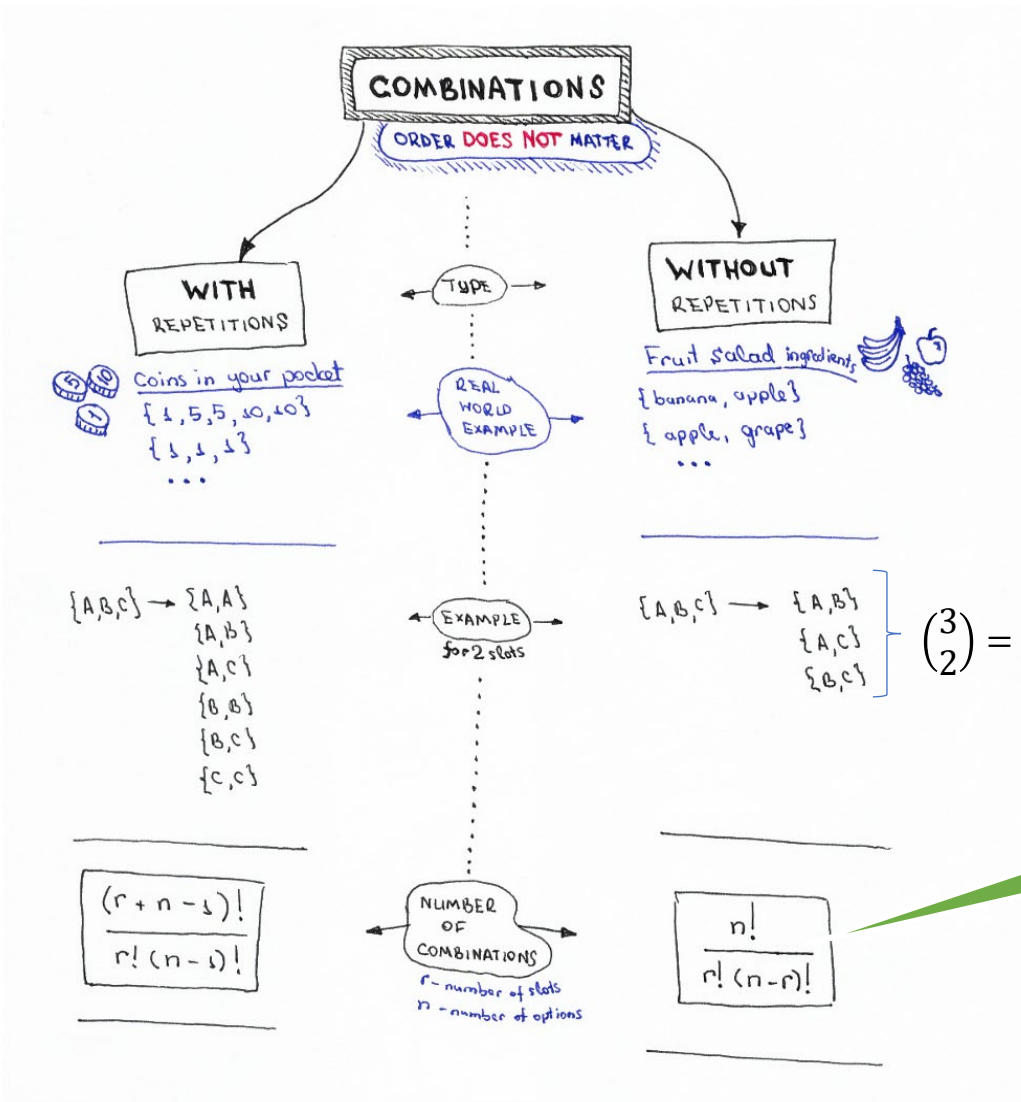


In how many ways can we order/arrange n objects?

**Factorial:**  $n! = n \times (n - 1) \times \dots \times 2 \times 1$

**#Python**  
`import math`

`print (math.factorial(23))`



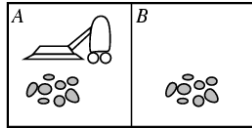
**Binomial Coefficient:**  $\binom{n}{r} = C(n, r) = {}_nC_r$   
 Read as “n choose r” because it is the number of ways can we choose r out of n objects?  
 Special case for  $r = 2$ :  $\binom{n}{2} = \frac{n(n-1)}{2}$

**#Python**  
**import scipy.special**

**# the two give the same results**  
**scipy.special.binom(10, 5)**  
**scipy.special.comb(10, 5)**



# Example: What is the State Space Size?



## Dirt

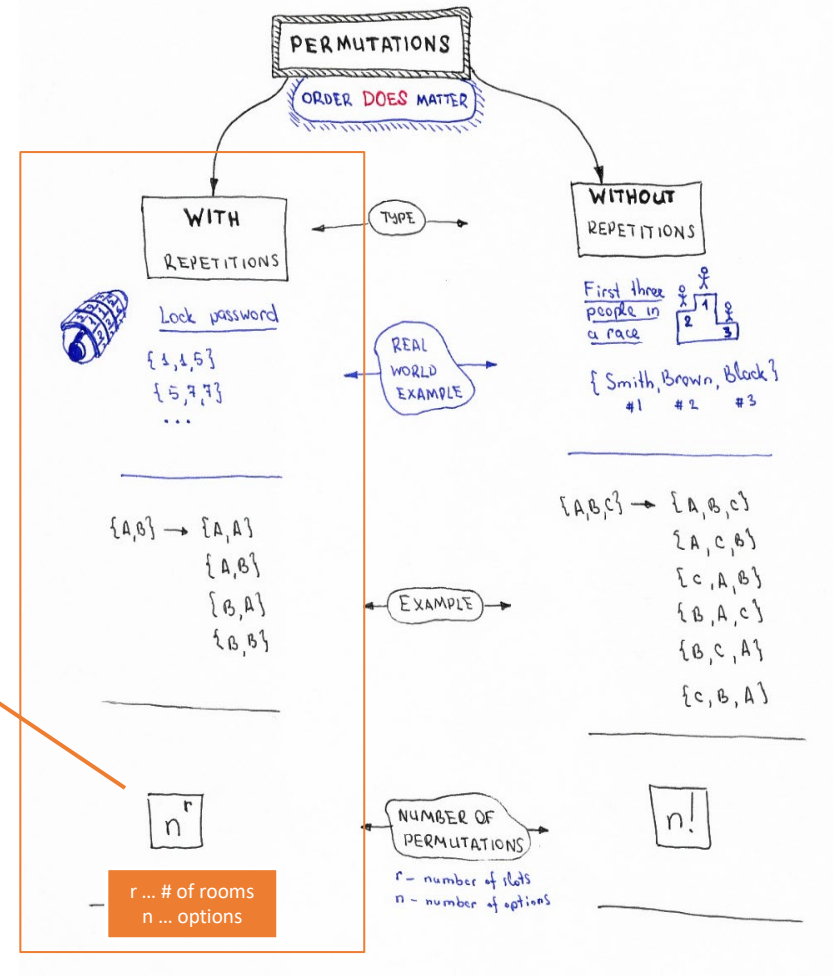
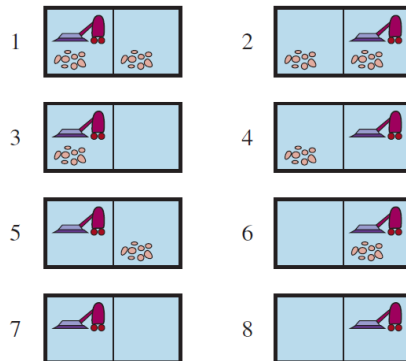
- **Permutation:** A and B are different rooms, order does matter!
- **With repetition:** Dirt can be in both rooms.
- There are 2 options (clean/dirty)

→  $2^2$

## Robot location

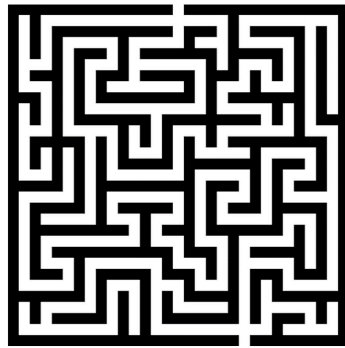
- Can be in 1 out of 2 rooms.  
→ 2

Total:  $n = 2 \times 2^2 = 2^3 = 8$

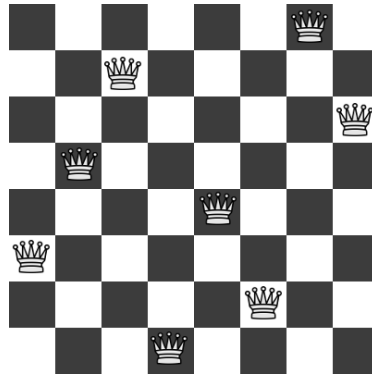


# Examples: What is the State Space Size?

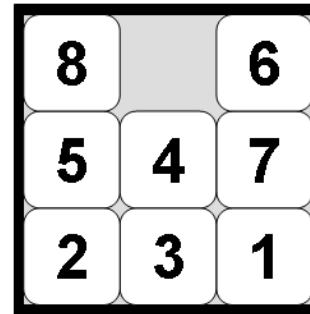
Often a rough upper limit is sufficient to determine how hard the search problem is.



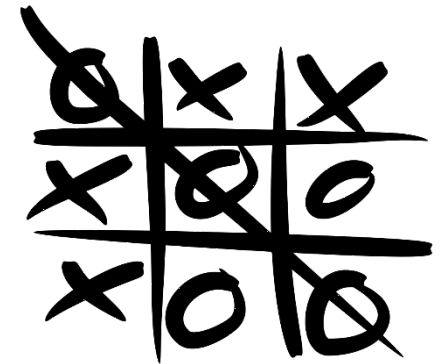
Maze



8-queens problem



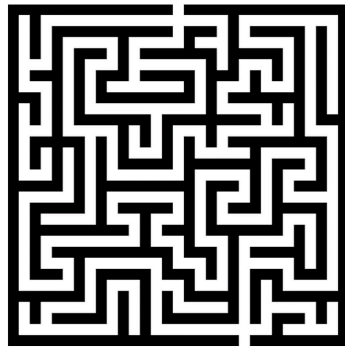
8-puzzle problem



Tic-tac-toe

# Examples: What is the State Space Size?

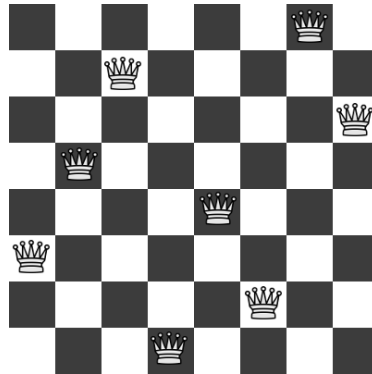
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Maze

Positions the agent can be in.

$n$  = Number of white squares.



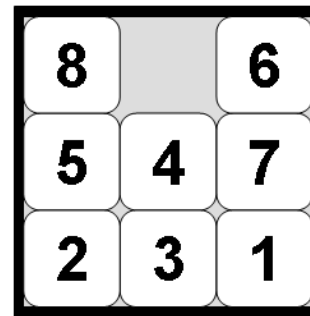
8-queens problem

All arrangements with 8 queens on the board.

$$n < 2^{64} \approx 1.8 \times 10^{19}$$

We can only have 8 queens:

$$n = \binom{64}{8} \approx 4.4 \times 10^9$$



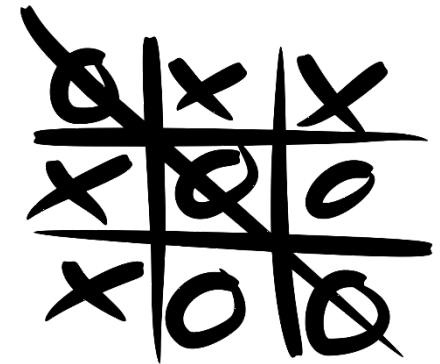
8-puzzle problem

All arrangements of 9 elements.

$$n \leq 9!$$

Half is unreachable:

$$n = \frac{9!}{2} = 181,440$$



Tic-tac-toe

All possible boards.

$$n < 3^9 = 19,683$$

Many boards are not legal (e.g., all x's)

The actual number can be obtained by a depth-first traversal of the game tree.



# Example: What is the Search Complexity?

- $b$ : maximum branching factor  
= number of available actions?

3

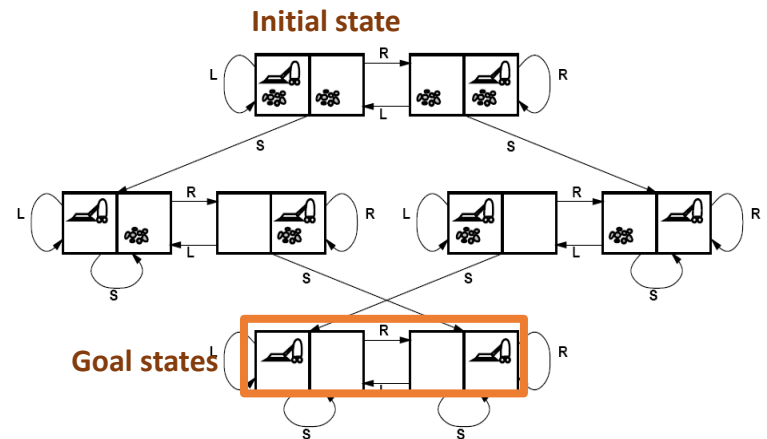
- $m$ : the number of actions in any path? Without loops!

4

- $d$ : depth of the optimal solution?

3

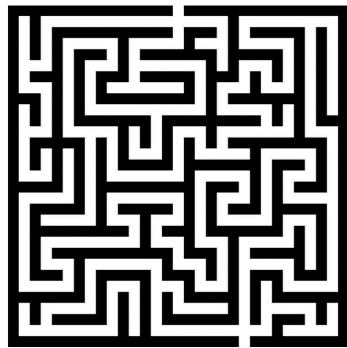
## State Space with Transition Model



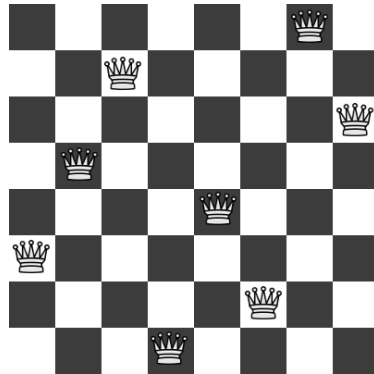
# Examples: What is the Search Complexity?

$b$ : maximum branching factor  
 $m$ : max. depth of tree  
 $d$ : depth of the optimal solution

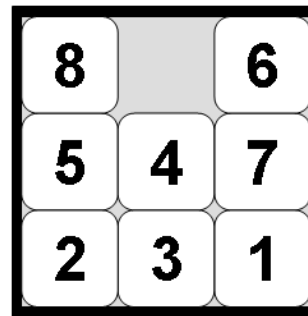
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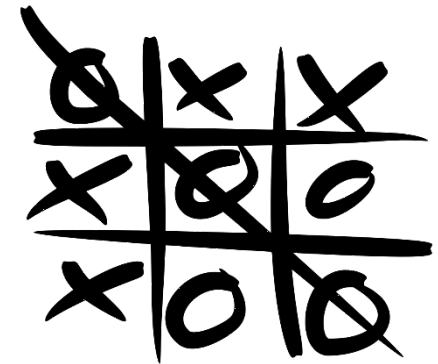
Maze



8-queens problem



8-puzzle problem



Tic-tac-toe

$b =$

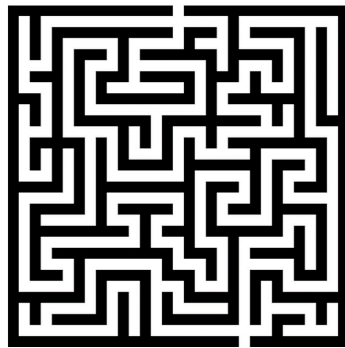
$m =$

$d =$

# Examples: What is the Search Complexity?

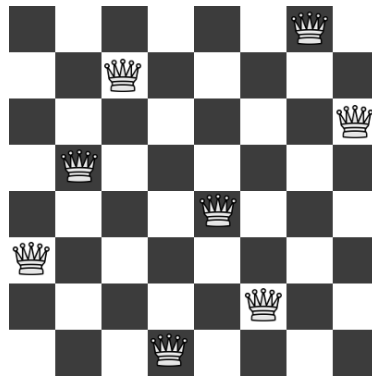
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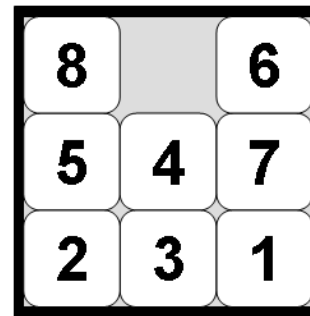
Maze

$b = 4$  actions  
 $m =$  longest path to the goal or a dead end (bounded by  $x \times y$ )  
 $d =$  shortest path to the goal (bounded by  $x \times y$ )



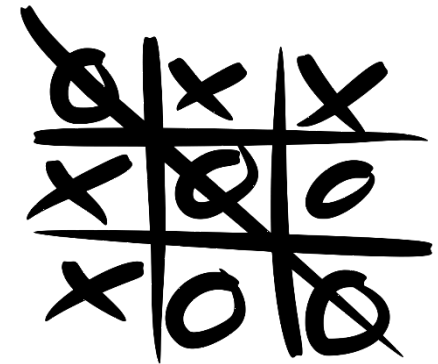
8-queens problem

$b = ?$  What are the actions? Moving one Queen:  $64 - 7 = 57$   
 $m =$  We may have to try all:  $\binom{64}{8} \approx 4.4 \times 10^9$   
 $d =$  move each queen in the right spot = 8



8-puzzle problem

$b = 4$  actions to move the empty tile.  
 $m =$  Try all  $O(9!)$   
 $d = ???$



Tic-tac-toe

$b = 9$  actions for the first move.  
 $m = 9$   
 $d = 9$  (if both play optimal)

Assignment

Q&A