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Pinned Post: AI in the news!

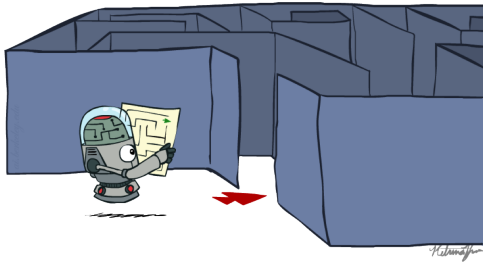
# Lecture Attendance Link

Lecture Attendance Link: <http://bit.ly/2GEMokS>



# CS 188: Artificial Intelligence

**Search.**



# Today.

Agents that Plan Ahead

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Search Problems.

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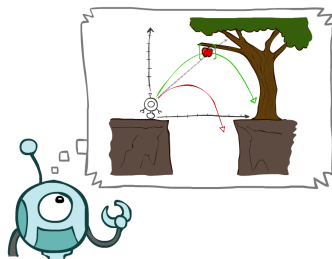
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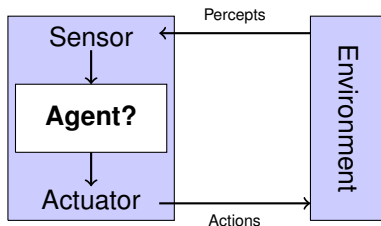
Depth-First Search

Breadth-First Search

Uniform-Cost Search

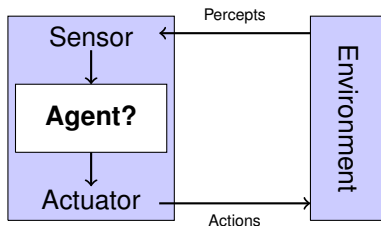


# Frame of AI



An agent **percieves** its environment with **sensors** and **acts** on environment using **actuators**.

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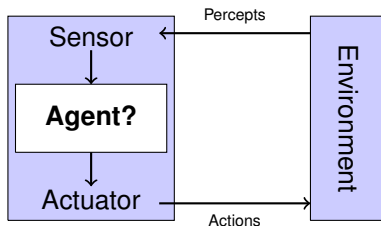


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Car:

Sensors:

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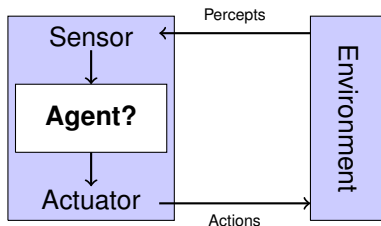


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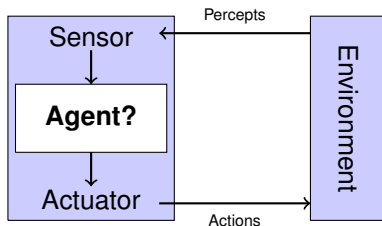


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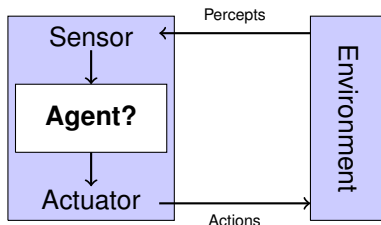


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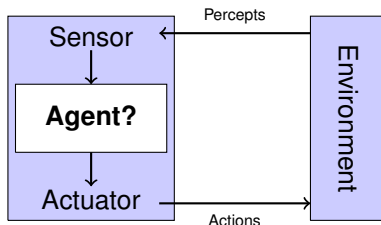
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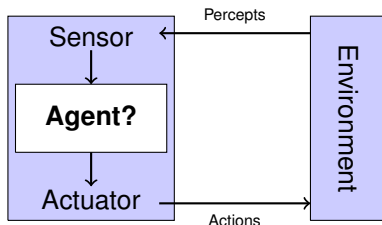
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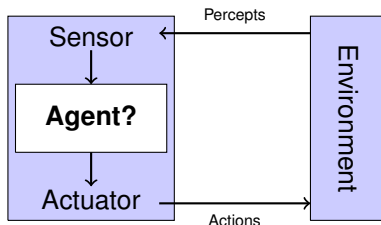
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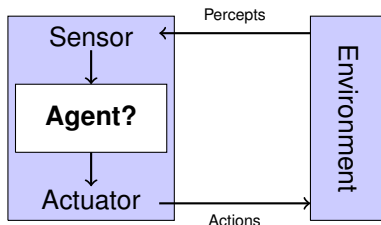
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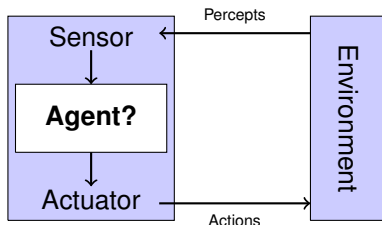
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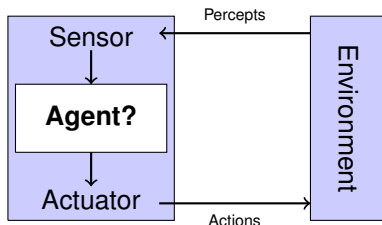
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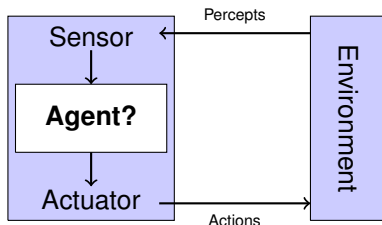
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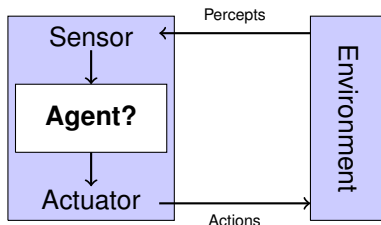
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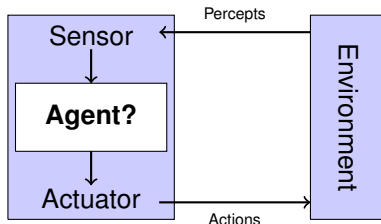
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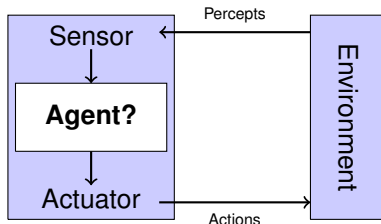
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Today: agents that have a goal, and a cost.

E.g., reach goal with lowest cost.

Later: agents have numerical utilities, rewards, etc.

E.g., takes action that maximizes total reward over time.

(Reward: largest total profit. or expected total profit.)

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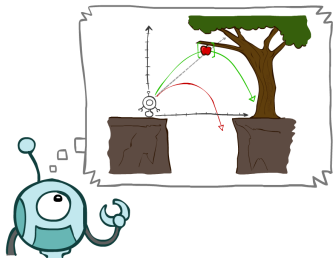
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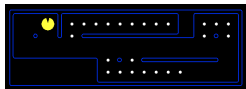
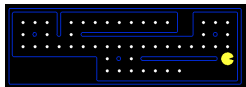
Stochastic/deterministic → agent deals with **contingencies**

Single-agent/multi-agent → agent may need to behave **randomly**.

# Agents that Plan

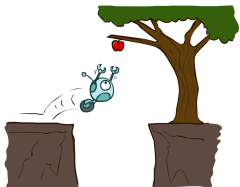


# Reflex Agents

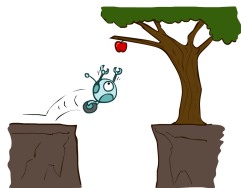
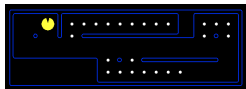
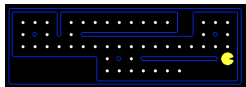


Reflex agents:

- Choose action based on current percept (and maybe memory)



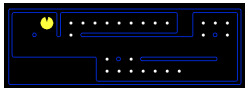
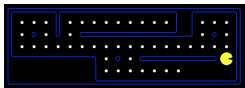
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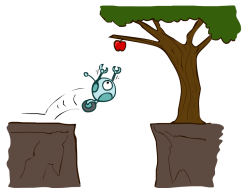
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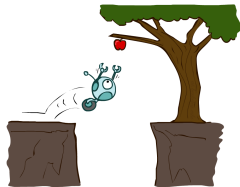
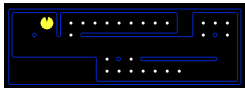
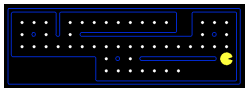


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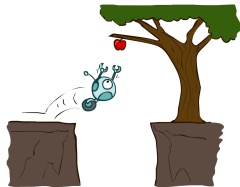
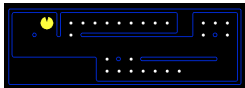
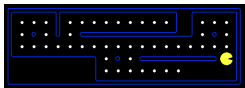
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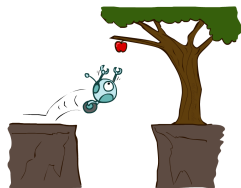
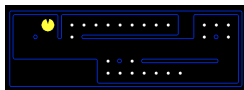
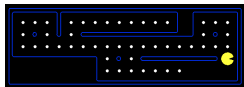


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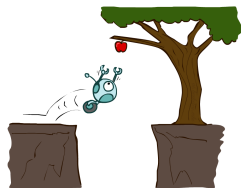
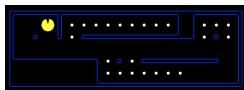
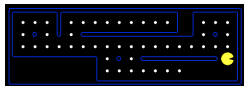


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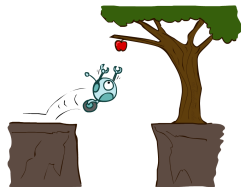
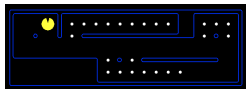
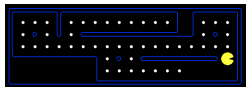
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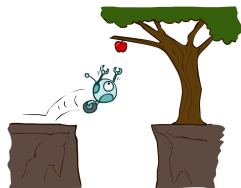
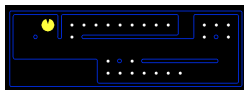
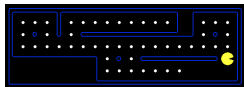
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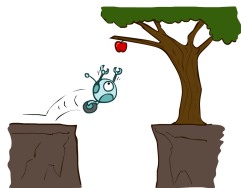
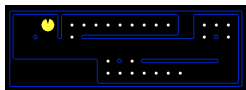
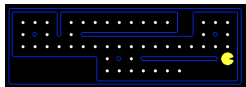
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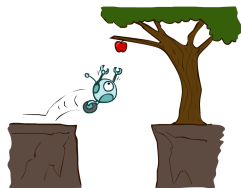
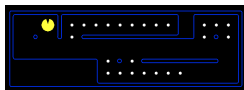
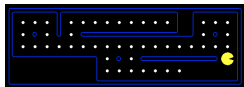
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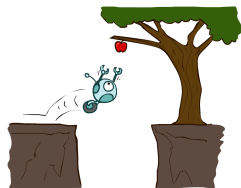
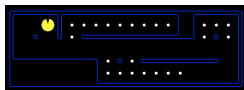
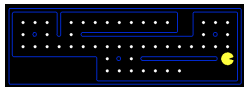
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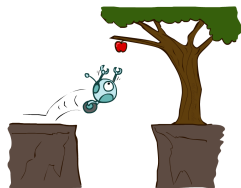
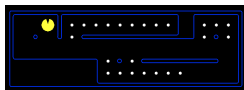
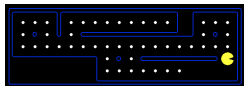
Can a reflex agent be rational?

Examples:

Stove: hot, ouch!

Car: deer,

# Reflex Agents



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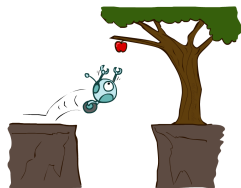
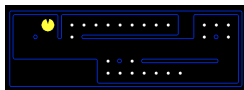
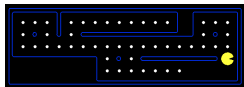
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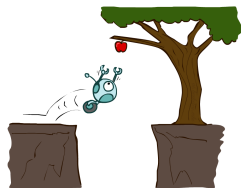
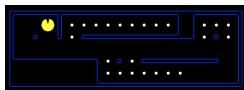
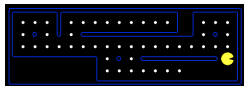
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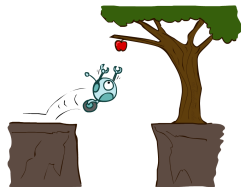
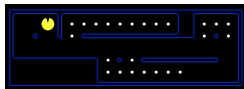
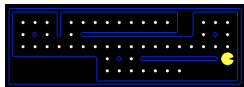
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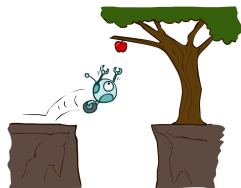
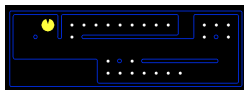
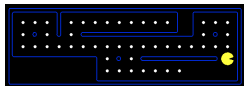
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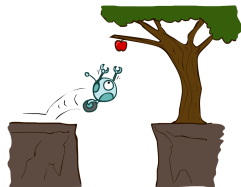
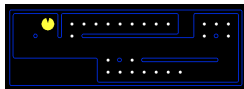
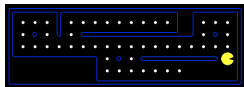
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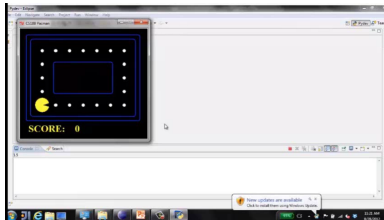
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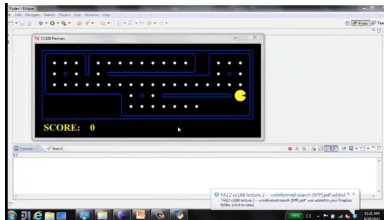
Go to Tahoe: skid in snow, ???

[Demo: reflex (L2D1 and L2D2)]

# Video of Demo Reflex Optimal

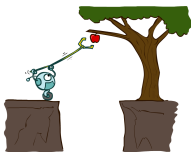
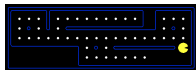


# Video of Demo Reflex Odd



# Planning Agents

**Planning agents:**

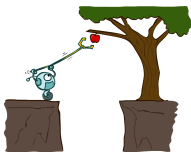
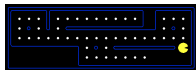




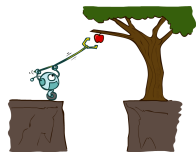
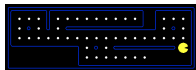
# Planning Agents

## Planning agents:

Ask “what if?”



# Planning Agents

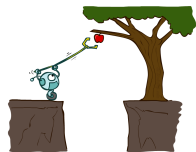
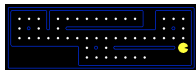


## Planning agents:

Ask “what if?”

Decisions based on (hypothesized)  
consequences of actions.

# Planning Agents



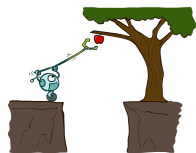
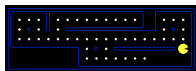
## Planning agents:

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Must have a model of how the world  
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# Planning Agents



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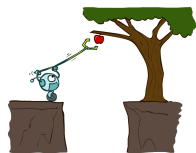
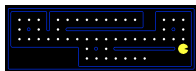
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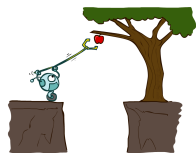
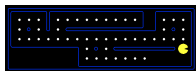
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Consider how the world WOULD BE.

# Planning Agents



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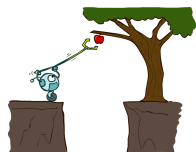
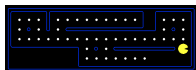
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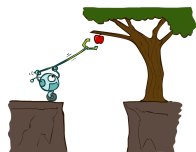
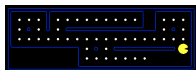
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# Planning Agents



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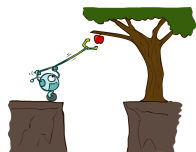
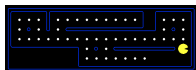
Consider how the world WOULD BE.

Optimal or not optimal.

Complete or not.



# Planning Agents



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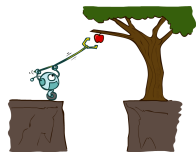
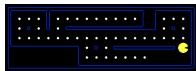
Consider how the world **WOULD BE**.

Optimal or not optimal.

Complete or not.

Planning vs. replanning

# Planning Agents



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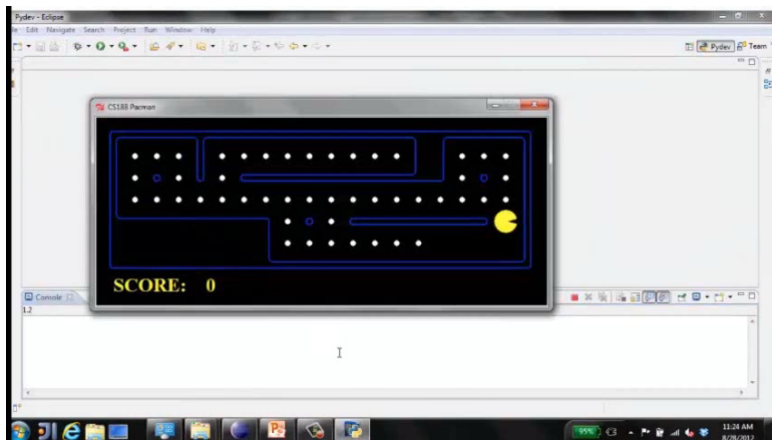
Complete or not.

Planning vs. replanning

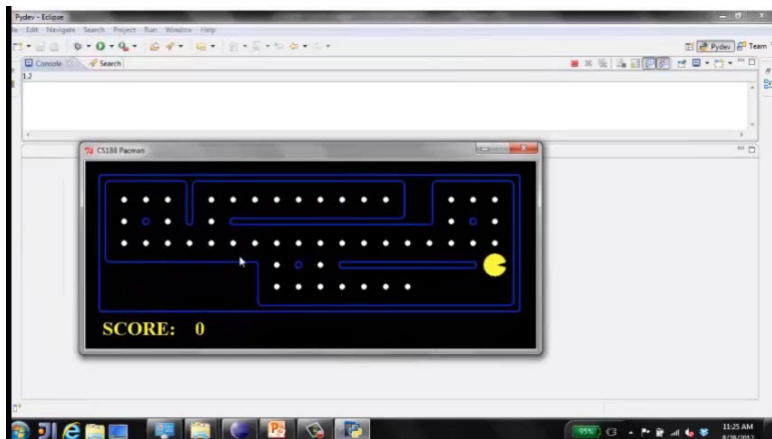
[Demo: nearest dot re-planning (L2D3),  
mastermind (L2D4)]

# Video of Demo

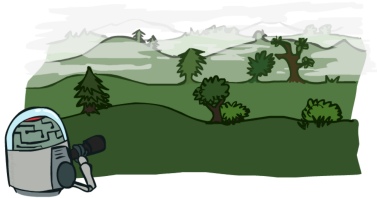
## Replanning



# Video of Demo Mastermind



# Search Problems



# Search Problems

A **search problem** consists of:

# Search Problems

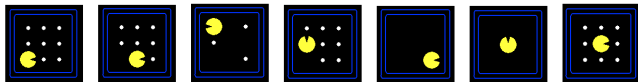
A **search problem** consists of:

A state space

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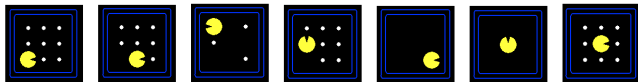




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A **search problem** consists of:

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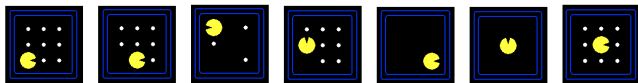


A successor function  
(with actions, costs)

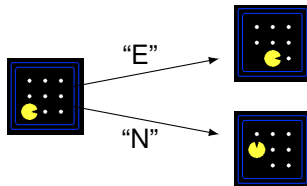
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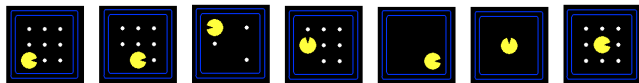
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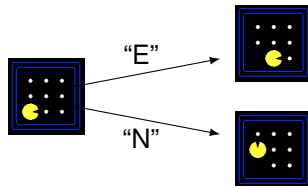
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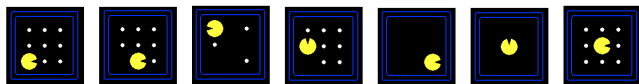


A start state and a goal test

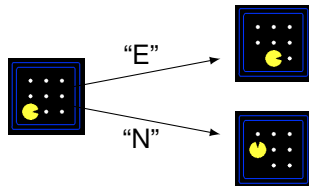
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A start state and a goal test

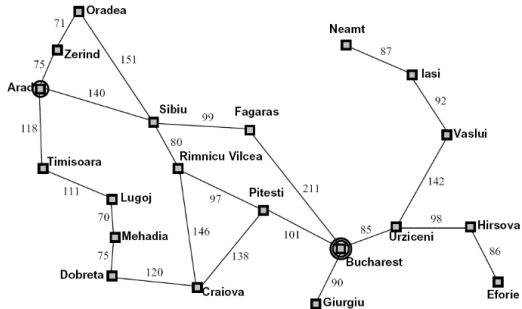
A solution is a sequence of actions (a plan) which transforms the start state to a goal state

# Search Problems Are Models

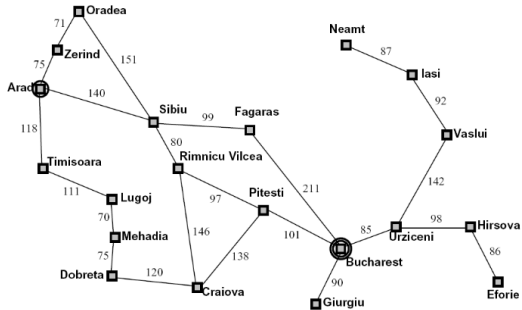


# Example: Traveling in Romania

State space:

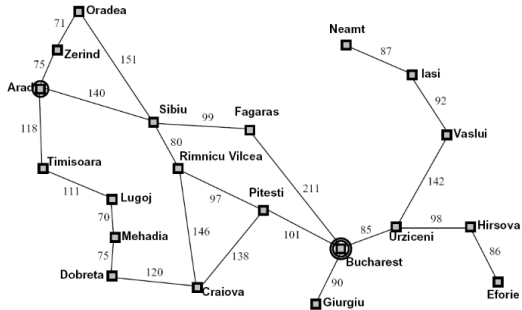


# Example: Traveling in Romania



State space:  
Cities

# Example: Traveling in Romania



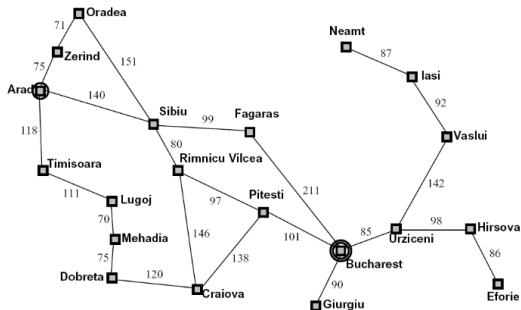
State space:

Cities

Successor function:



# Example: Traveling in Romania



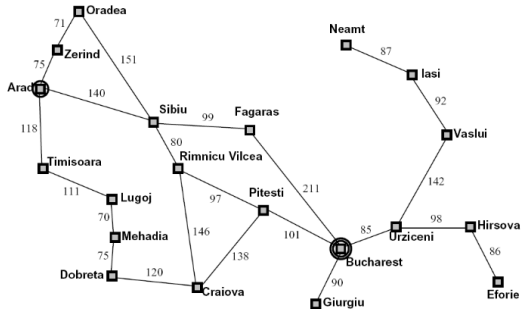
State space:

Cities

Successor function:

Roads: Neighboring city with  
cost = distance

# Example: Traveling in Romania



State space:

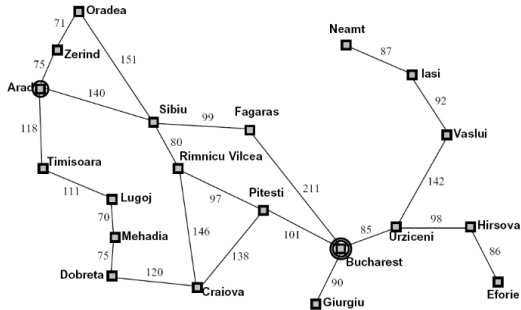
Cities

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Start state:

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State space:

Cities

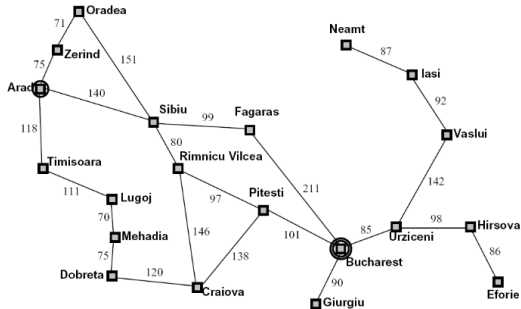
Successor function:

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Start state:

Arad

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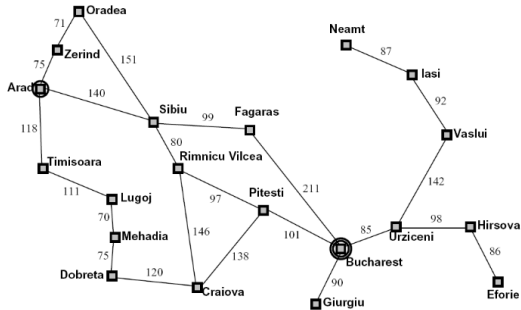
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Start state:

Arad

Goal test:

# Example: Traveling in Romania



State space:

Cities

Successor function:

Roads: Neighboring city with  
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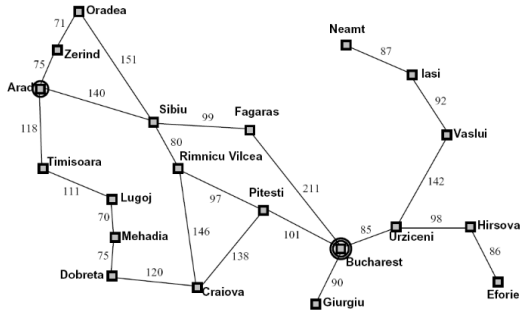
Start state:

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Goal test:

Is state == Bucharest?

# Example: Traveling in Romania



State space:

Cities

Successor function:

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Start state:

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Goal test:

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Solution?

# What's in a State Space?

The world state includes every last detail of the environment.

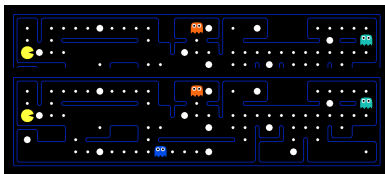
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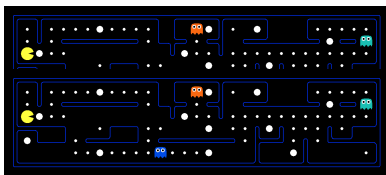
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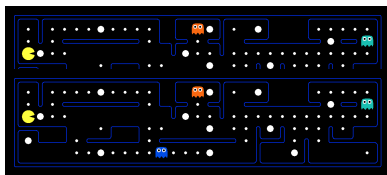
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Search state keeps only details needed for planning (abstraction).

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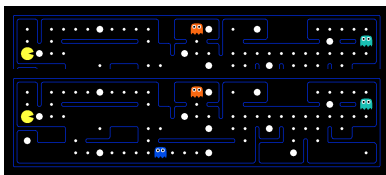


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**Problem:** Pathing

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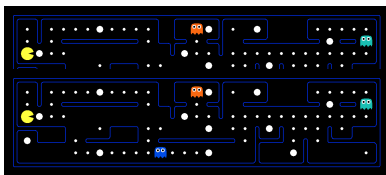
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**Problem:** Pathing

States:

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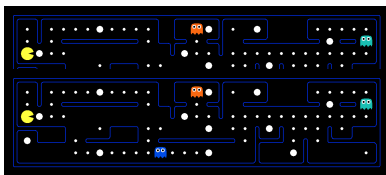
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**Problem:** Pathing

States:  $(x, y)$  location

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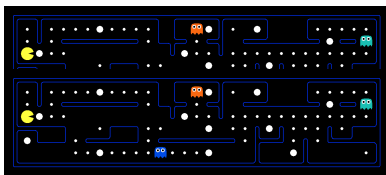
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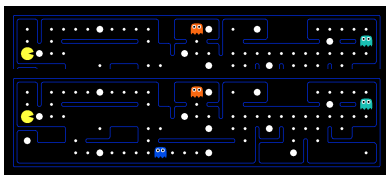
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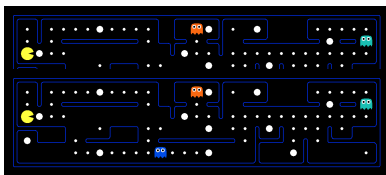
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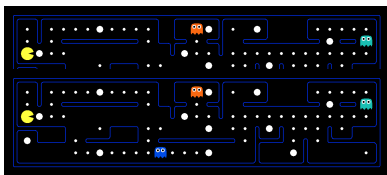
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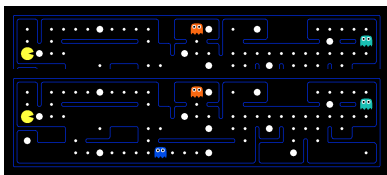
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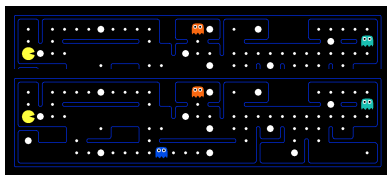
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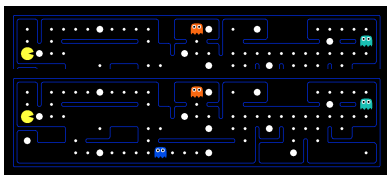
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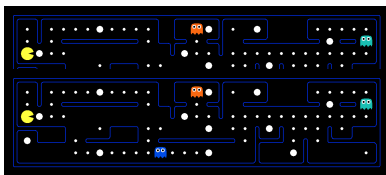
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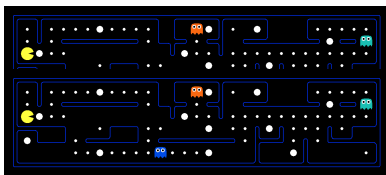
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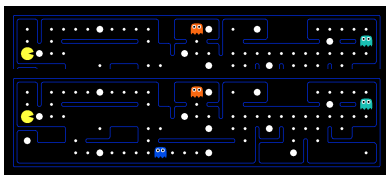
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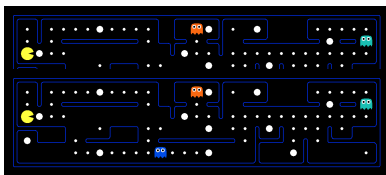
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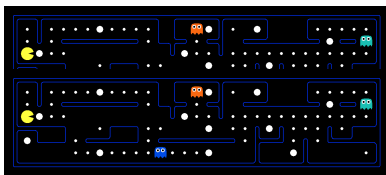
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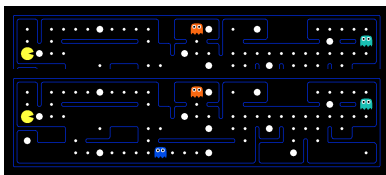
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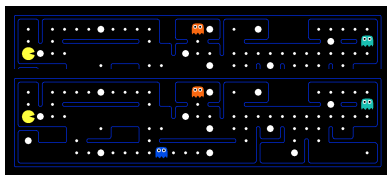
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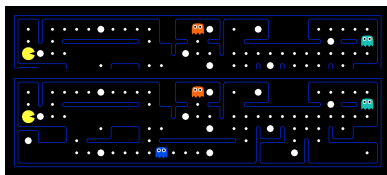
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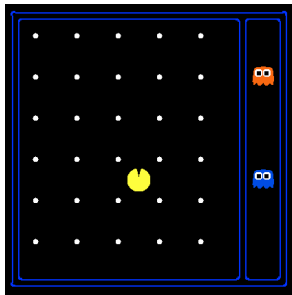
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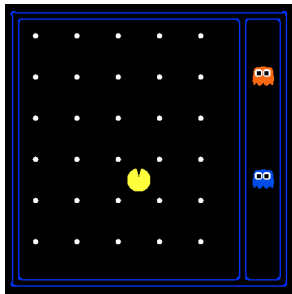
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# State Space Sizes?

World state:



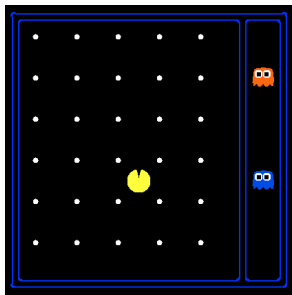
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World state:

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# State Space Sizes?

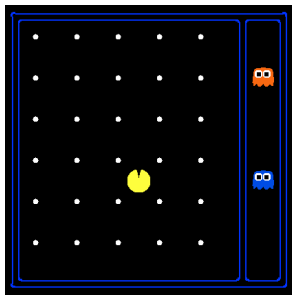


World state:

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# State Space Sizes?

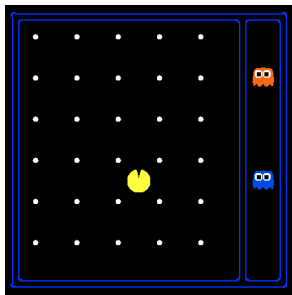


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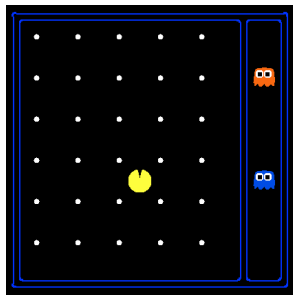


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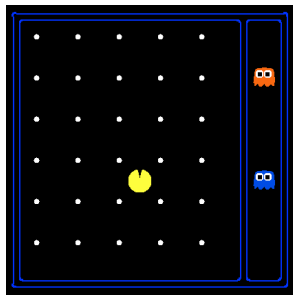
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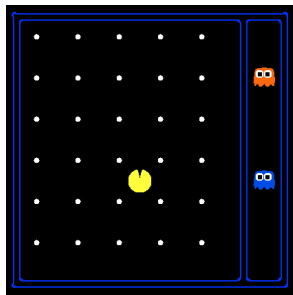
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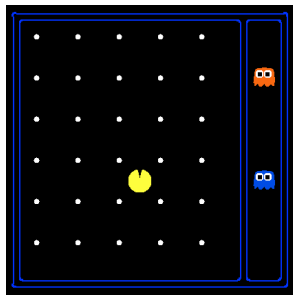
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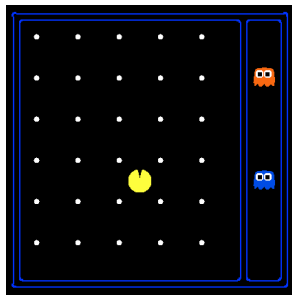
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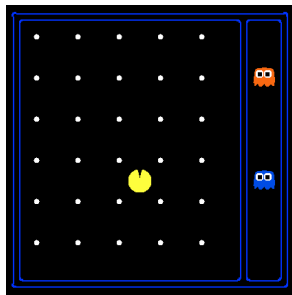
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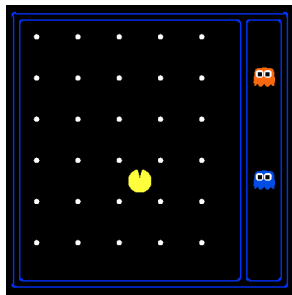
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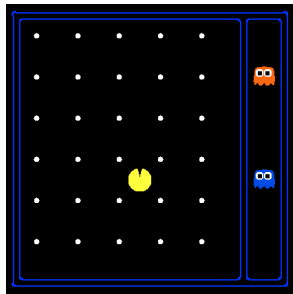
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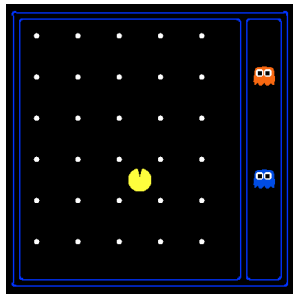
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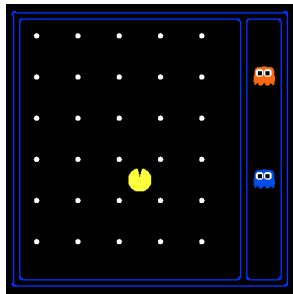
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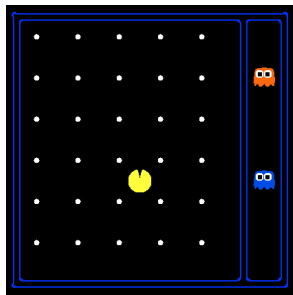
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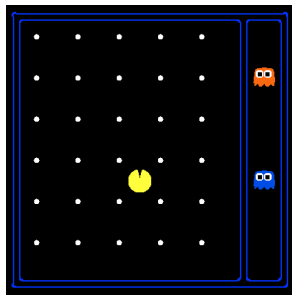
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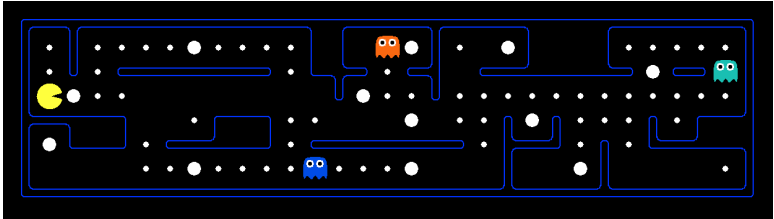
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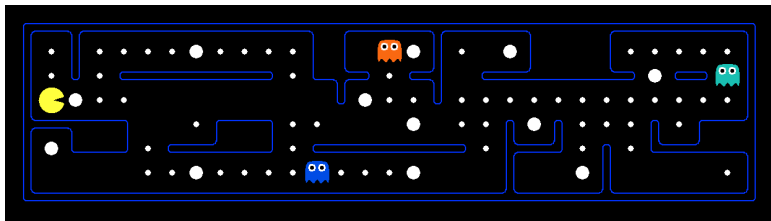
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# Problem: Safe Passage



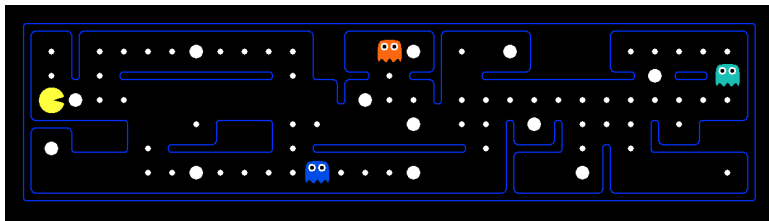
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Problem: eat all dots while keeping the ghosts perma-scared?



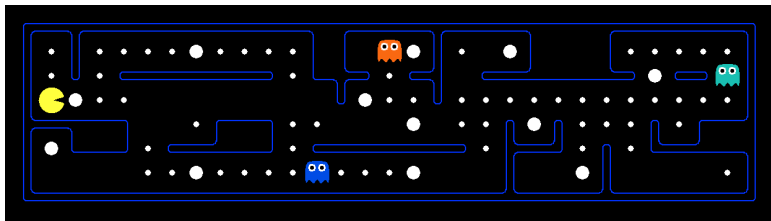
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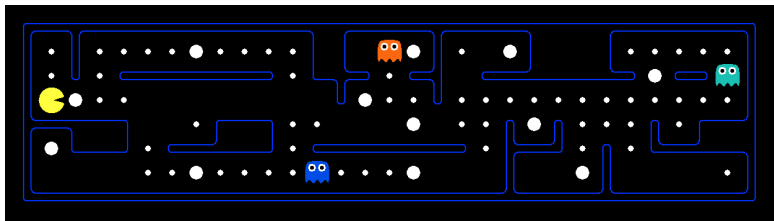


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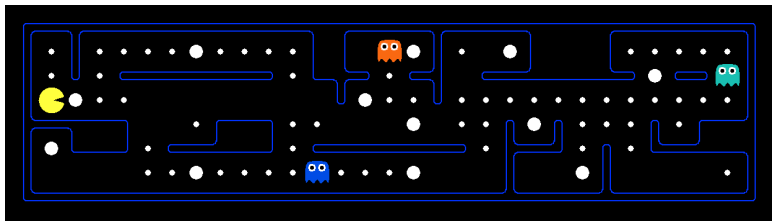
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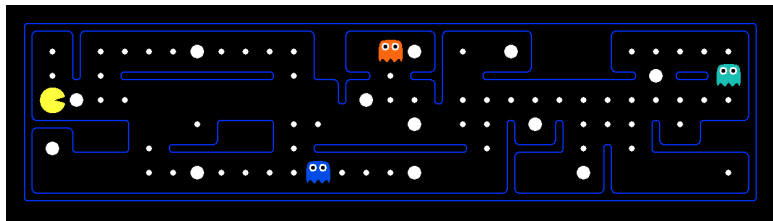
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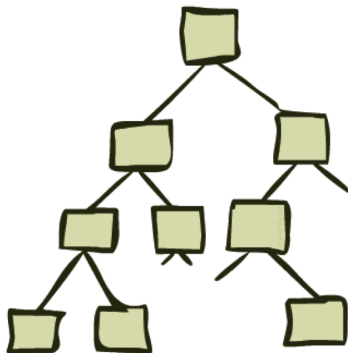
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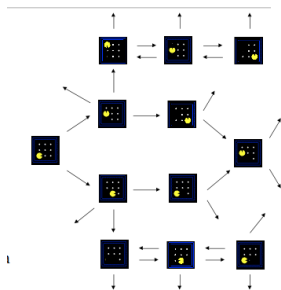
Single-agent/multi-agent → agent may need to behave **randomly**.

# State Space Graphs and Search Trees



# State Space Graphs

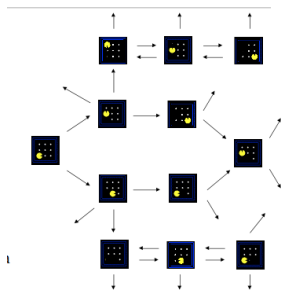
**State space graph: A mathematical representation of a search problem**



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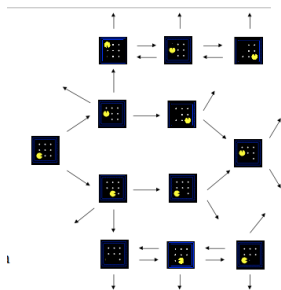
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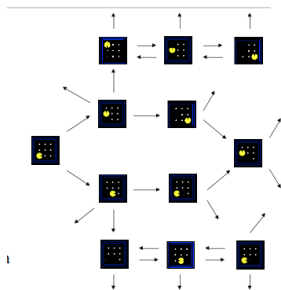
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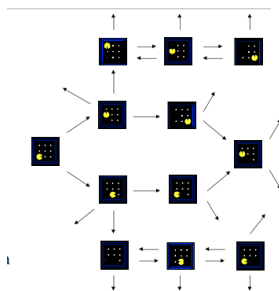
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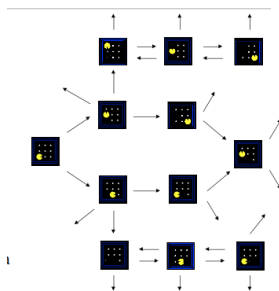
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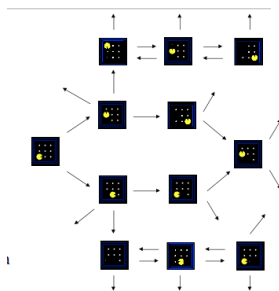
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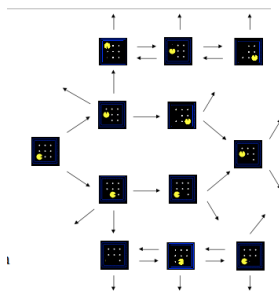
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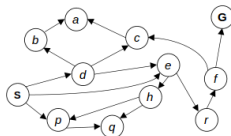
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E.g., replanning.

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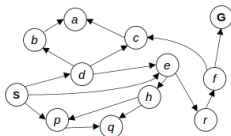


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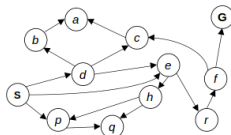


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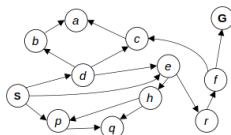


*Tiny search graph for a  
tiny search problem*

# State Space Graphs

**State space graph: A mathematical representation of a search problem**

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- ▶ The goal test is a set of goal nodes (maybe only one)

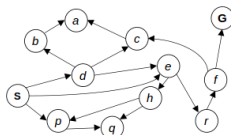


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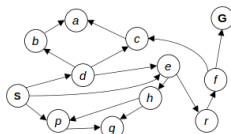
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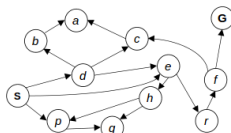
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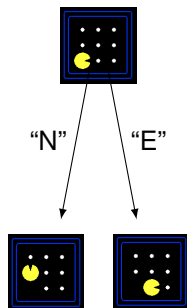
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**In a state space graph, each state occurs only once!**

We can rarely build this full graph in memory (it's too big), but it's a useful idea.

# Search Trees

This is now / start

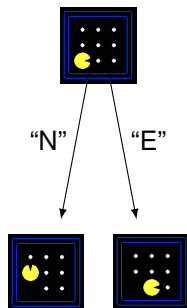


Possible futures.

A search tree:

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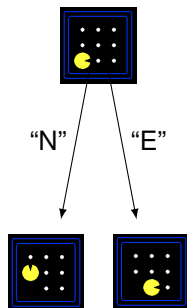
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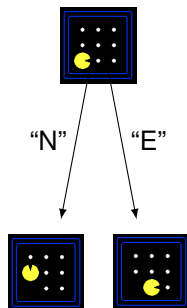
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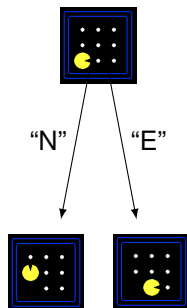
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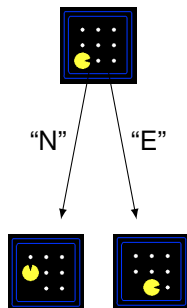
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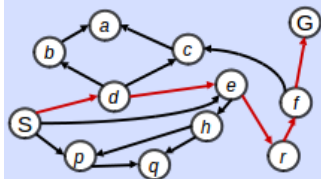
Nodes show states, but correspond to PLANS that achieve those states

For most problems, we can never actually build the whole tree

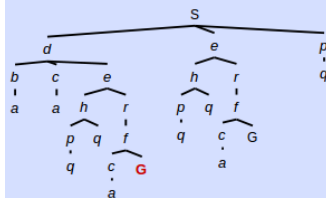


# State Space Graphs vs. Search Trees

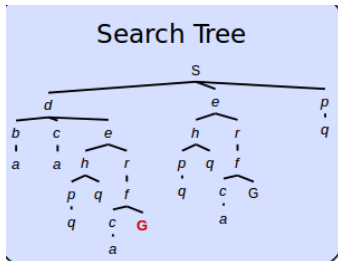
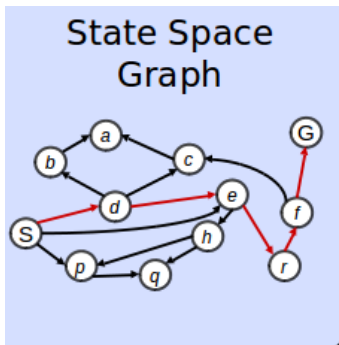
## State Space Graph



## Search Tree



# State Space Graphs vs. Search Trees

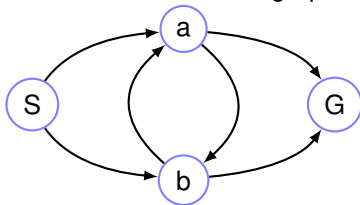


Each NODE in search tree is an entire PATH in state space graph.



## Quiz: State Space Graphs vs. Search Trees

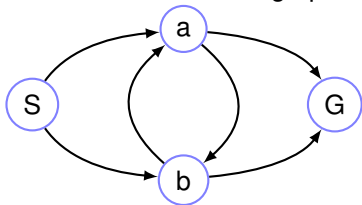
Consider this 4-state graph:



How large could search tree be?

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Consider this 4-state graph:

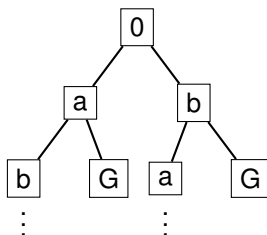
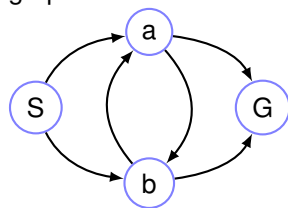


How large could search tree be?

$\infty$

## Quiz: State Space Graphs vs. Search Trees

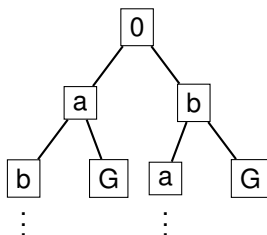
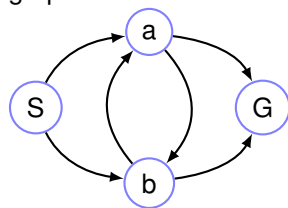
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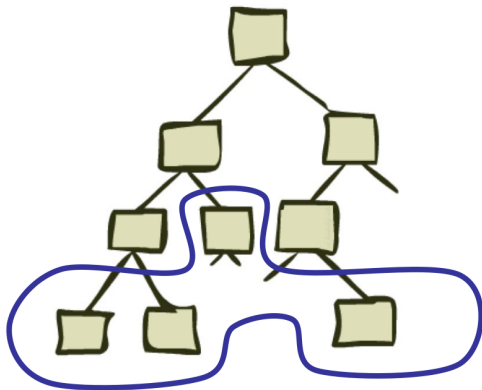
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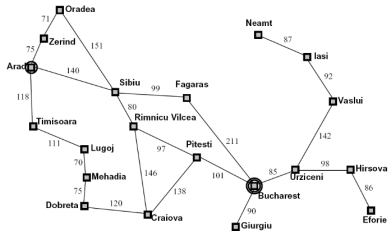
$\infty$

# Tree Search





# Search Example: Romania



# Searching with a Search Tree

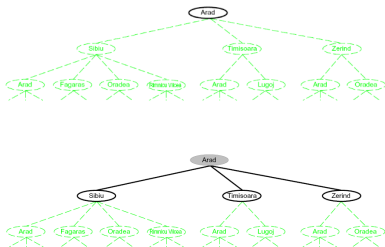
Search:

# Searching with a Search Tree



Search:  
(1) Expand out potential  
plans (tree nodes)

# Searching with a Search Tree



Search:  
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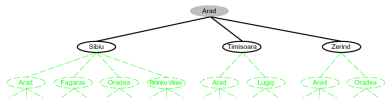
# Searching with a Search Tree



Search:

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# Searching with a Search Tree



Search:

- (1) Expand out potential plans (tree nodes)
- (2) Maintain a fringe of partial plans under consideration.
- (3) Try to expand as few tree nodes as possible

# General Tree Search

Important ideas:

# General Tree Search

Important ideas:

- Fringe



# General Tree Search

Important ideas:

- Fringe

- Expansion

# General Tree Search

Important ideas:

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- Expansion

- Exploration strategy

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Important ideas:

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Main question: which fringe nodes to explore?

# General Tree Search

Important ideas:

- Fringe

- Expansion

- Exploration strategy

Main question: which fringe nodes to explore?

```
function TREE-SEARCH(problem, strategy) returns a solution, or failure
  initialize the search tree using the initial state of problem
  loop do
    if there are no candidates for expansion then return failure
    choose a leaf node for expansion according to strategy
    if the node contains a goal state then return the corresponding solution
    else expand the node and add the resulting nodes to the search tree
  end
```