



**NUS** | Computing  
National University  
of Singapore

# CS3243 Tutorial 1

## Agents, Problems and Uninformed Search

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Hello, I am Gu Zhenhao (Gary)!

- Year 2, MComp (CS) candidate,
- **Interests:** Algorithms & Theory, Computational Biology, open-world/MOBA games,
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- **Telegram:** [@garygzh](https://t.me/@garygzh)
- **GitHub:** [GZHoffie](https://github.com/GZHoffie)



- **Time:** 10:00 – 11:00 A.M. every Wednesday.
- **Venue:** COM3-01-25.
- **Content:** Review key concepts in lectures and discuss problem-solving recipes.



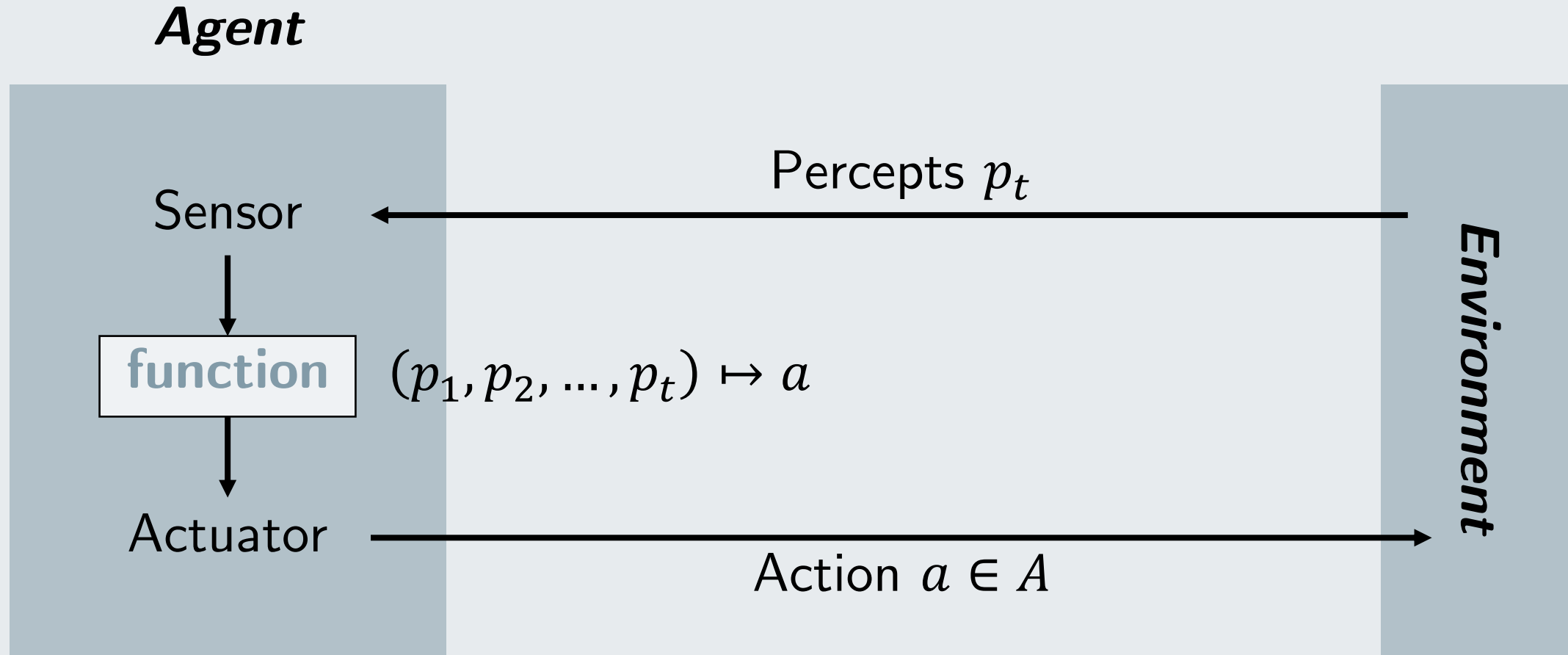
- **Slides:** will be uploaded to Telegram group and [my repository](#).
- **Notes:**
  1. Attendance & participation will be taken. (5% of course grade)
  2. Interaction in class and discussion in telegram groups are all counted as participation.
  3. Hand in tutorial assignment (in paper), and attempt all questions before class.



# Intelligent Agents

*What does a general AI model look like?*

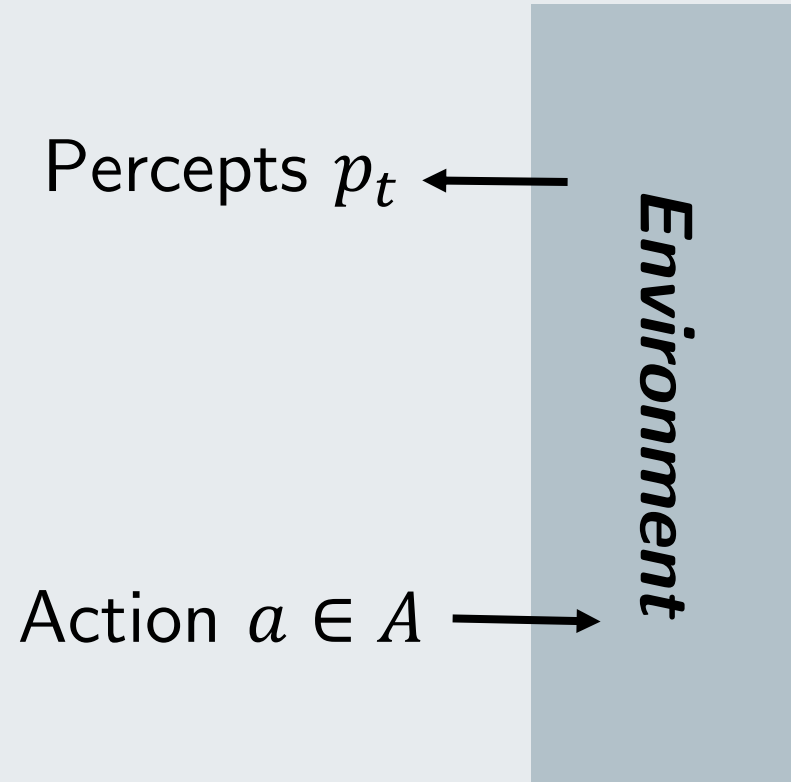
# Agent-Environment Interaction



# Types of Environment

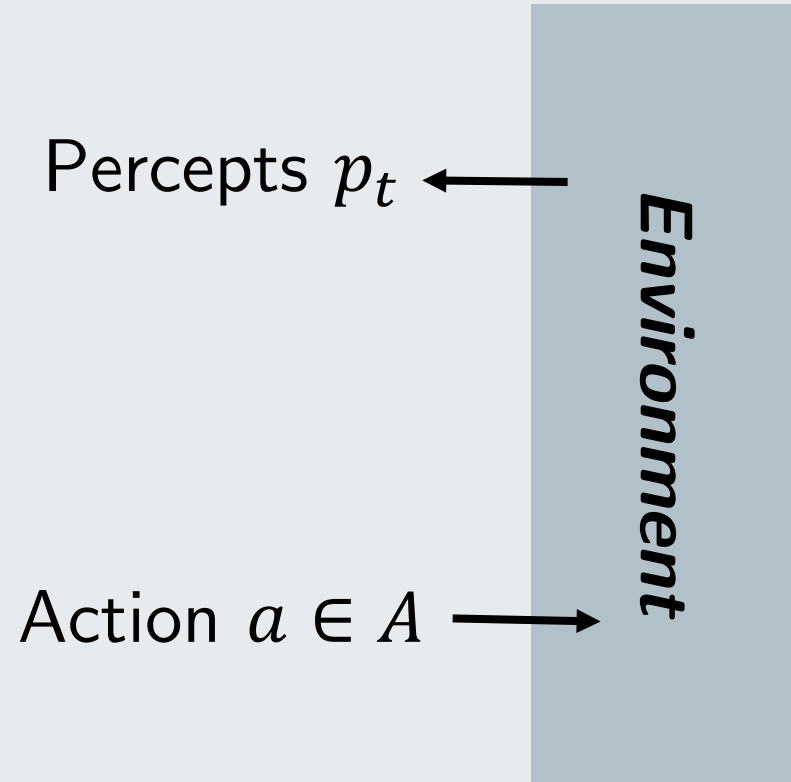
- **Fully observable / Partially observable.**

*Are there hidden features in the state?*



# Types of Environment

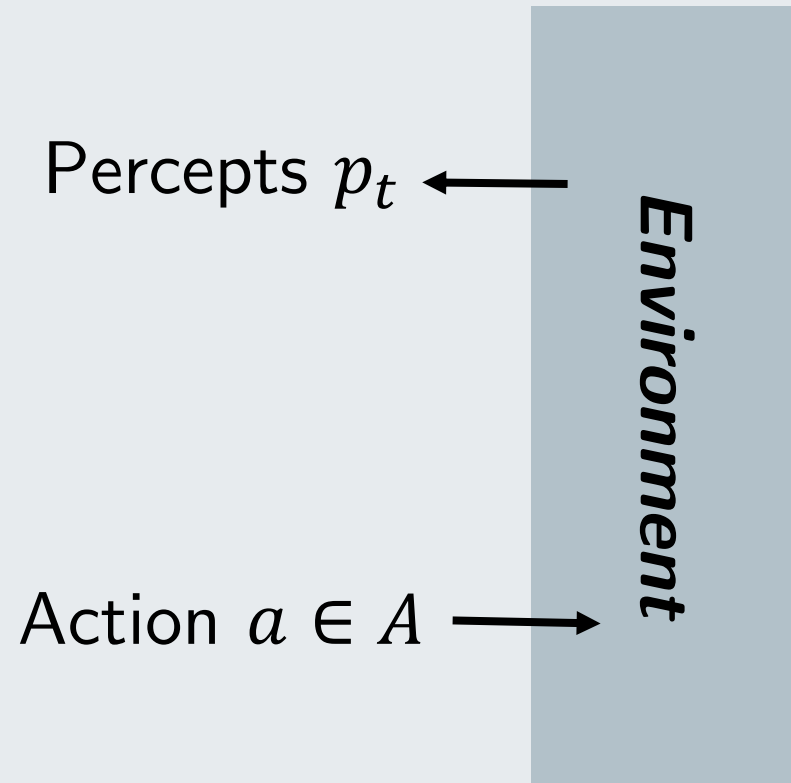
- Fully observable / Partially observable.
- **Deterministic / Stochastic.**  
*Are there any randomness involved?*





# Types of Environment

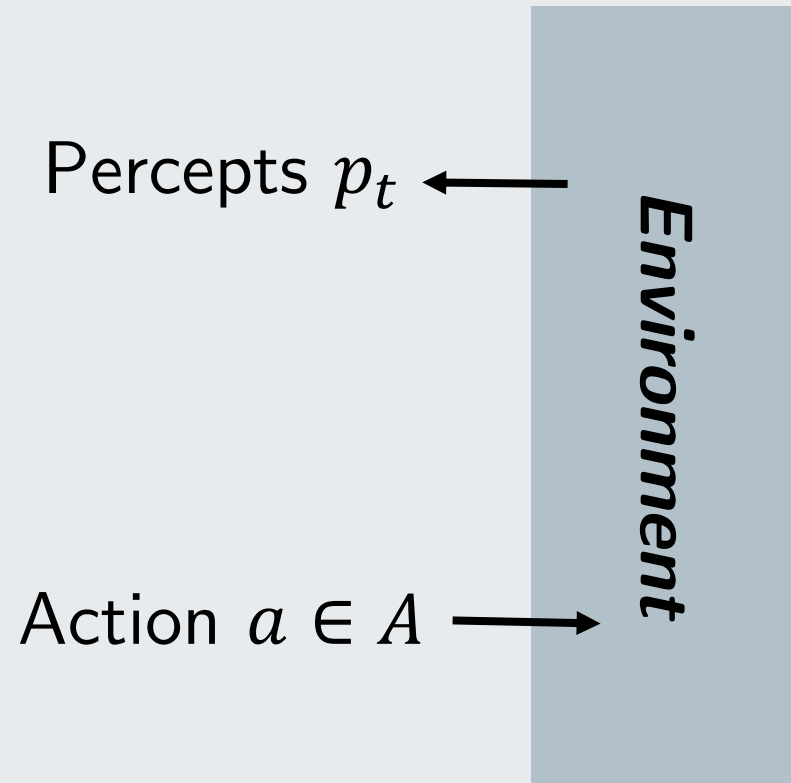
- Fully observable / Partially observable.
- Deterministic / Stochastic.
- **Episodic / Sequential.**  
*Will the current action affect future decisions?*



# Types of Environment

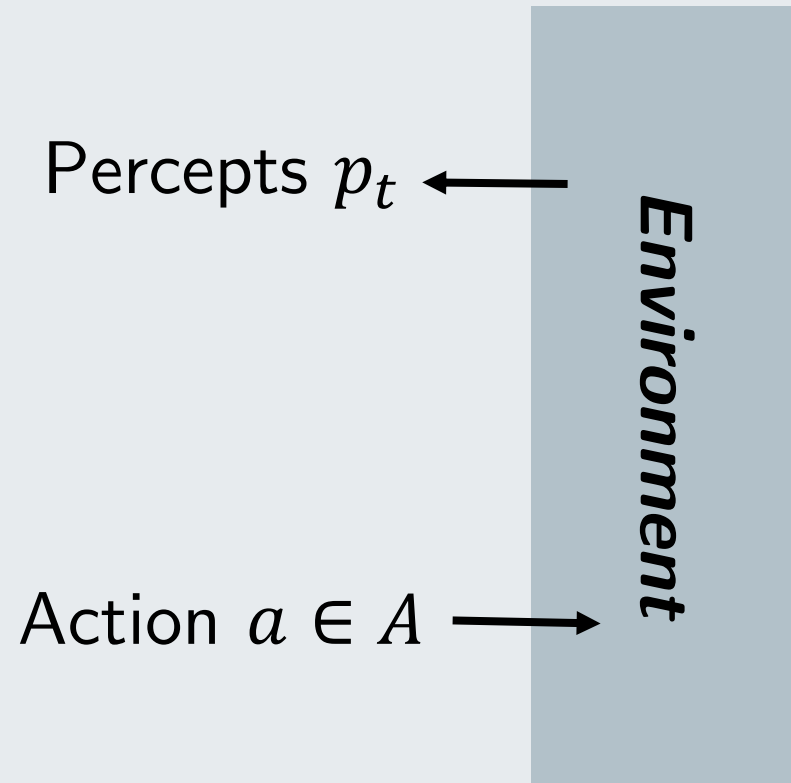
- Fully observable / Partially observable.
- Deterministic / Stochastic.
- Episodic / Sequential.
- **Discrete / Continuous.**

*Are state, time, percepts and actions measured using discrete variables?*



# Types of Environment

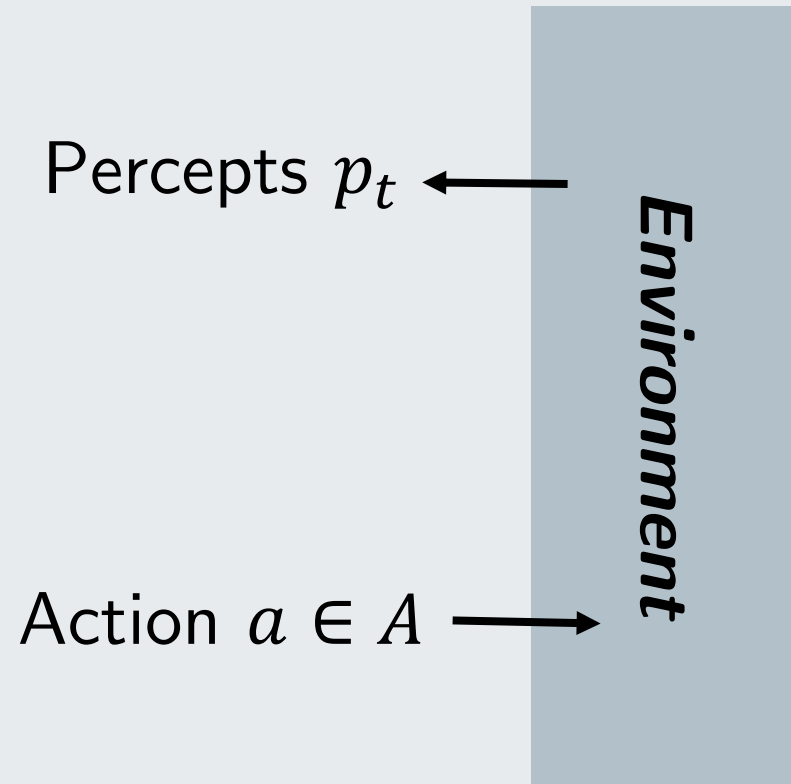
- Fully observable / Partially observable.
- Deterministic / Stochastic.
- Episodic / Sequential.
- Discrete / Continuous.
- **Single-agent / Multi-agent.**  
*Are there multiple entities that can influence the environment?*



# Types of Environment

- Fully observable / Partially observable.
- Deterministic / Stochastic.
- Episodic / Sequential.
- Discrete / Continuous.
- Single-agent / Multi-agent.
- **Static / Dynamic.**

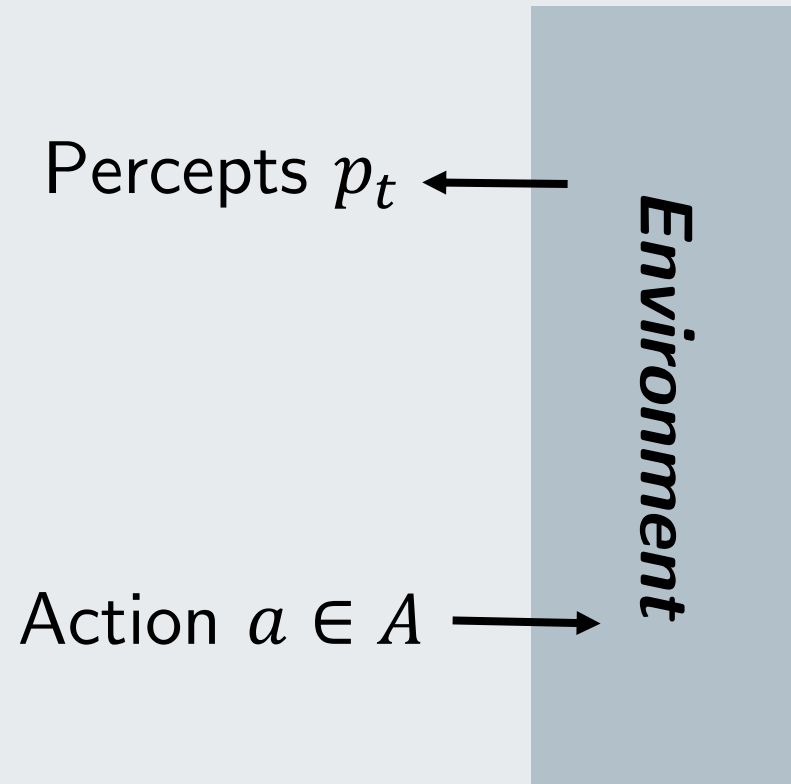
*Can the environment change when agent is deciding on the action?*



# Types of Environment

- Fully observable / Partially observable.
- Deterministic / Stochastic.
- Episodic / Sequential.
- Discrete / Continuous.
- Single-agent / Multi-agent.
- Static / Dynamic.
- **Known / Unknown.**

*Does the agent know the rules of the environment?*



# Problem 1.a

2	5			3		9		1
	1				4			
4		7				2		8
		5	2					
				9	8	1		
	4				3			
			3	6			7	2
	7							3
9		3				6		4

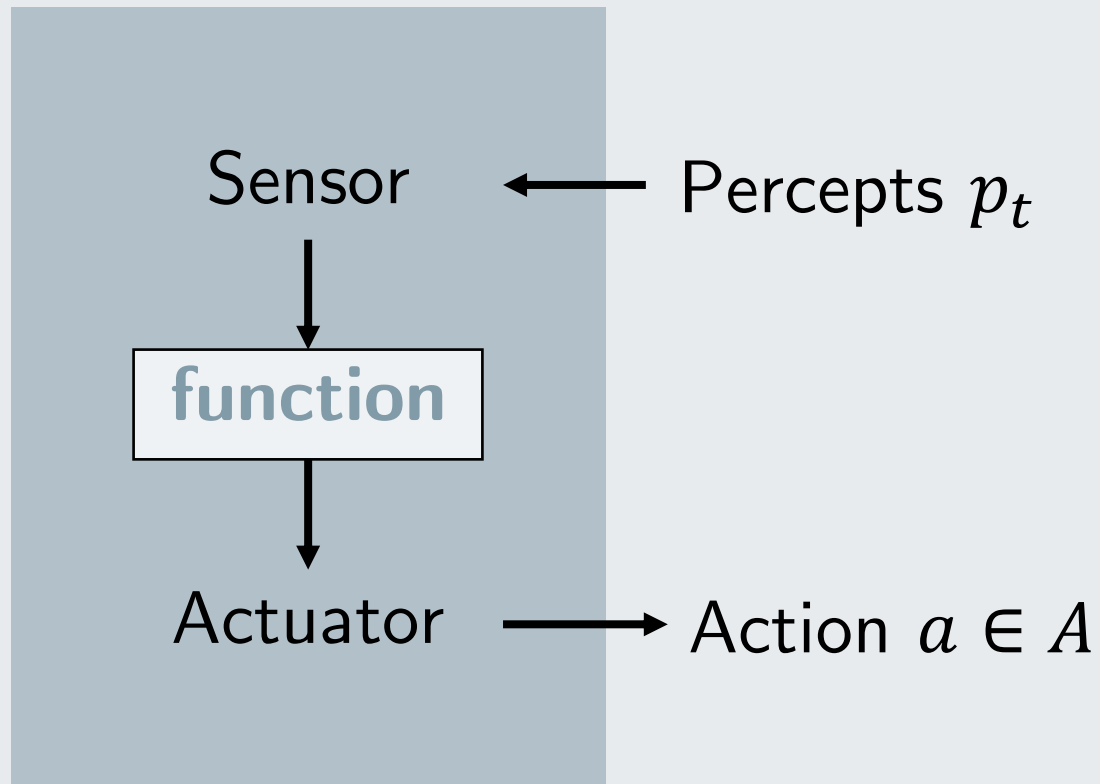
Figure. A Sudoku Puzzle.

- Fully observable / Partially observable.
- Deterministic / Stochastic.
- Episodic / Sequential. \*
- Discrete / Continuous.
- Single-agent / Multi-agent.
- Static / Dynamic.
- Known / Unknown.

\* Might be sequential for human players while episodic for computers.

# Types of Agent

## Agent



- **Simple reflex agents.**  
*Choose action  $a$  solely based on  $p_t$ .*
- **Model-based reflex agents.**  
*Simulate on a model of environment.*
- **Goal-based agents.**  
*Search and plan with a goal in mind.*
- **Utility-based agents.**  
*chooses the action that maximizes the expected utility of outcomes.*

# Searching

*How to solve a problem using graph search algorithms?*



# Building Search Problems

- **Assumptions:** fully-observable, discrete, known, deterministic environment.
- **Steps:**
  1. **What should a node contain?**

Determine state representation  $s_i$ , and all possible actions  $A = \{a_1, \dots, a_k\}$ .
  2. **How to find a node's neighbours?**

Determine the environment's transition model  $T, (s_i, a_j) \mapsto s'_i$ .
  3. **What are the cost for edges?**

Define the **cost**( $s_i, a_j, s'_i$ ) function that returns cost of an action  $a_j$ .
  4. **What are our goals?**

Define the **isGoal**( $s_i$ ) function to check if a state  $s_i$  is our goal.

# Problem 1.b

$a = (1,3)$

2	5	<del>7</del>	7	3	6	9	4	1
6	1	9	8	2	4	3	5	7
4	3	7	9	1	5	2	6	8
3	9	5	2	7	1	4	8	6
7	6	2	4	9	8	1	3	5
8	4	1	6	5	3	7	2	9
1	8	4	3	6	9	5	7	2
5	7	6	1	4	2	8	9	3
9	2	3	5	8	7	6	1	4

Figure. A Complete Sudoku Puzzle.

- **States:**

$A$ : matrix of size  $9 \times 9$ , each slot containing either null or one number in  $[1, 9]$ .

- **Initial state:** the complete, filled matrix.
- **goal state:** any state (preferably still have unique solution and sufficiently sparse).

- **Actions:**

$(i, j)$ : Replace a (non-empty) slot  $A_{i,j}$  with null.

- **Transition model:**

$T(A, (i, j)) =$  matrix  $A$  with slot  $(i, j)$  cleared.

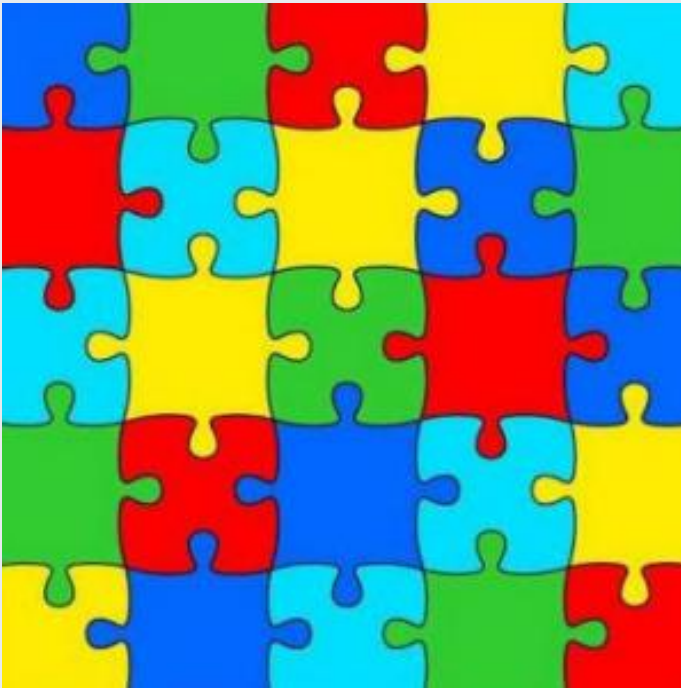


Figure. A Jigsaw Puzzle.

Many right answers... here's one.

- **States:** a graph showing connection of pieces.
  - **Initial state:** no connections.
  - **goal state:** all pieces are connected to the right number of pieces.
- **Actions:** (legally) connecting two pieces.
- **Transition model:**
  - returns the new graph with the added edges.
  - **step cost:** 1.

# Pause and Ponder

2	5			3		9		1
	1				4			
4		7				2		8
		5	2					
				9	8	1		
	4				3			
			3	6			7	2
	7							3
9		3				6		4

Figure. A Sudoku Puzzle.

**Question:** could you define the state, action and transaction model for the problem of *solving a sudoku puzzle*?

*Bonus:* can you minimize branching factor and maximum depth by your definition?

*\* Feel free to discuss on the Telegram group!*

# Solving Search Problems

```
traversal(G, s):  
    F.push(s);  
    while F is not empty do  
        current = F.pop();  
        visit(current);  
        for u in current.neighbors do  
            if not u.visited then  
                F.push(u);
```

For DFS: F is a stack  
For BFS: F is a queue  
For UCS: F is a priority queue

For IDS/DLS: also check  
*u.depth* before inserting to F.

# Solving Search Problems

```
traversal(G, s):  
    F.push(s);  
    while F is not empty do  
        current = F.pop();  
        visit(current);  
        for a in actions(current.state) do  
            u = Node(T(current.state, a), current)  
            if not u.visited then  
                F.push(u);
```

Neighbors **constructed** by  
transition model T.

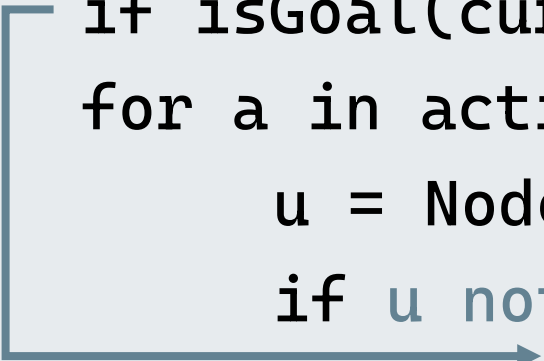
**Question:** why do we use transition model instead of an adjacency matrix/list?

# Solving Search Problems

```
traversal(G, s):  
    F.push(s);  
    while F is not empty do  
        current = F.pop();  
        if isGoal(current.state) then return current.getPath()  
        for a in actions(current.state) do  
            u = Node(T(current.state, a), current)  
            if not u.visited then  
                F.push(u);
```

Terminate when we reach the goal.

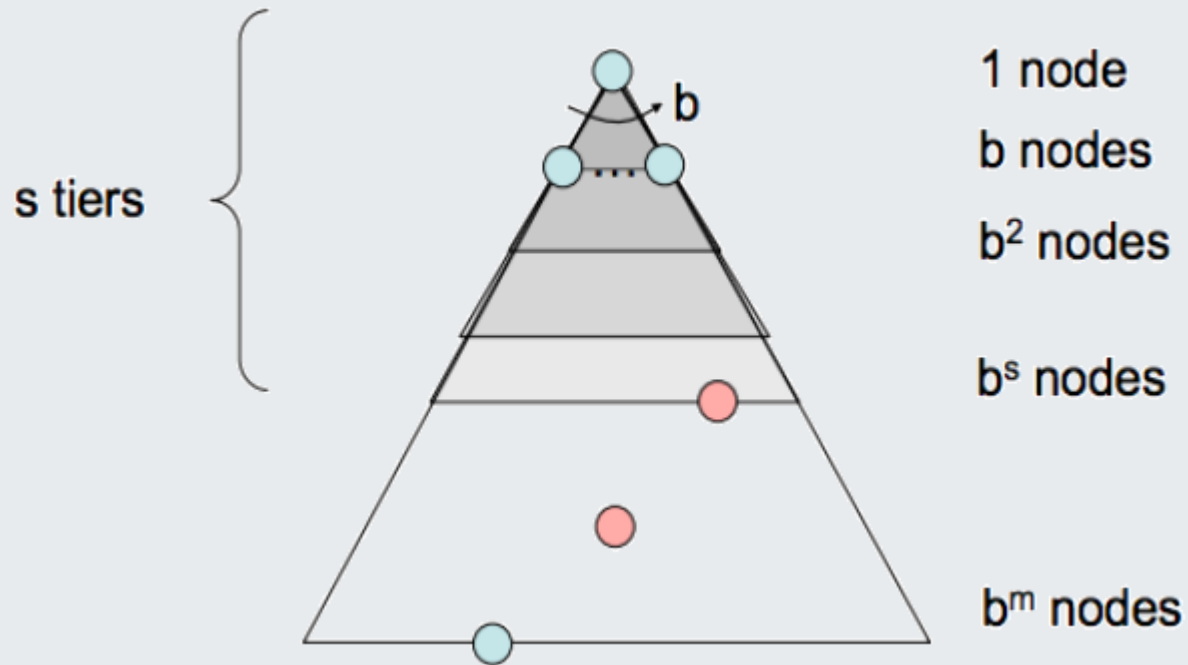
```
traversal(G, s):  
    F.push(s); reached = {s};  
    while F is not empty do  
        current = F.pop();  
        if isGoal(current.state) then return current.getPath()  
        for a in actions(current.state) do  
            u = Node(T(current.state, a), current)  
            if u not in reached then  
                F.push(u); reached.insert(u);
```



**Optimizations:** Tracking visited nodes with hash tables; early goal check; ...

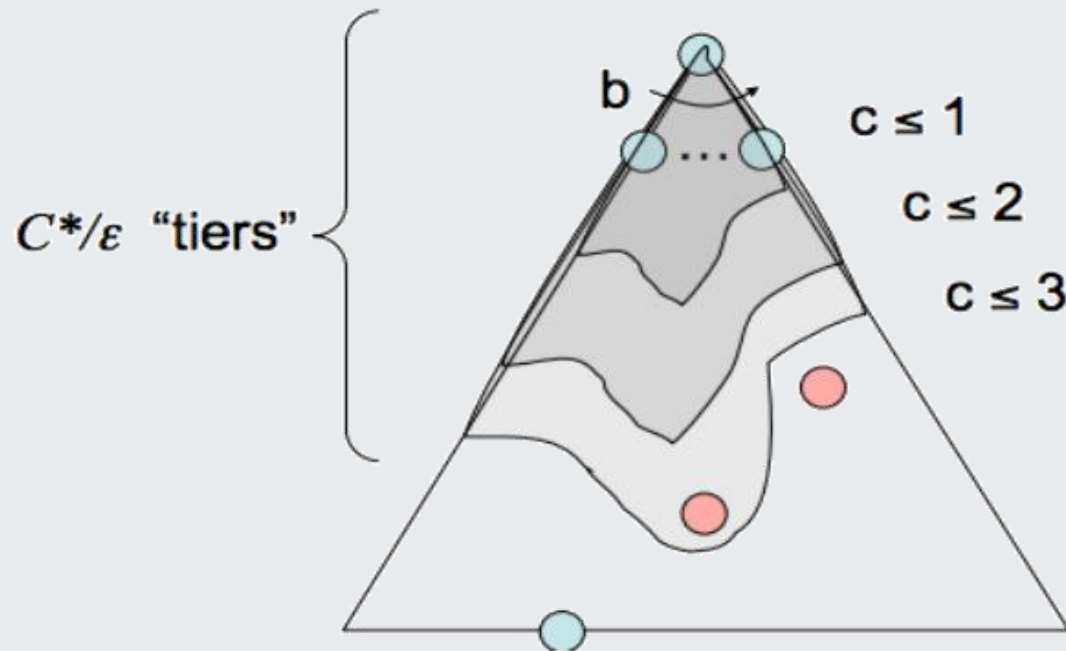


# Breadth-First Search



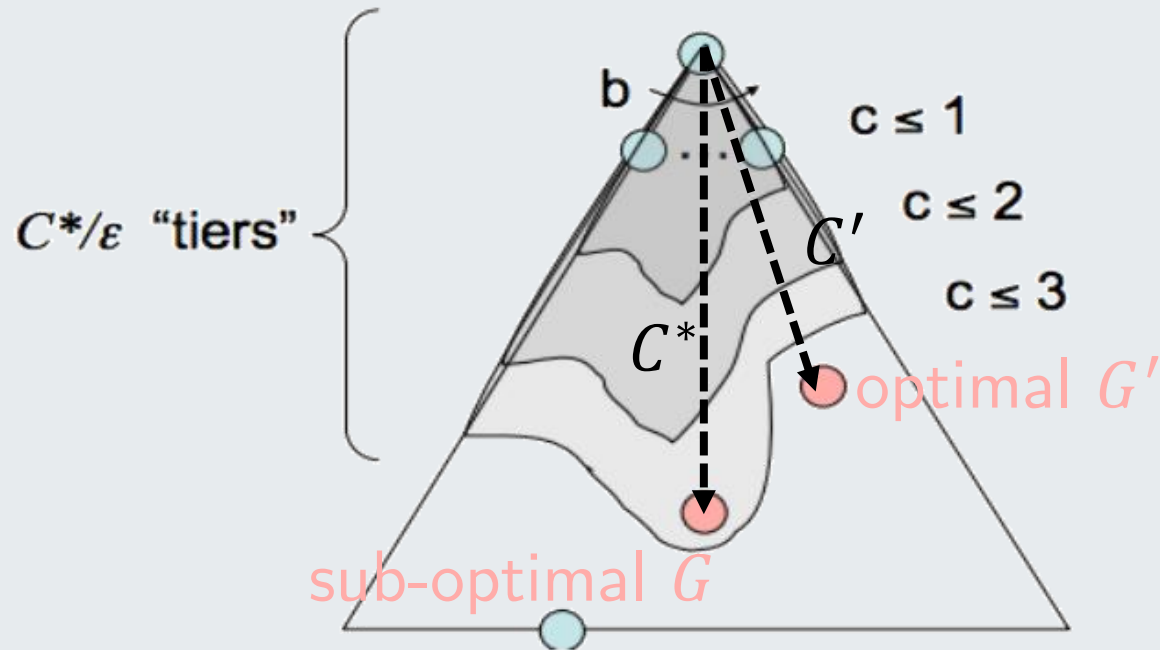
- **Intuition:** finds goal with smallest number of actions.
- **Pros:**
  - always finds a solution as long as it exists.
- **Cons:**
  - fails for trees with infinite branches.
  - doesn't take cost into account.
  - very time & memory-consuming.

# Uniform Cost Search



- **Intuition:** finds goal with smallest total action cost.
- **Pros:**
  - complete, and optimal for non-negative costs.
- **Cons:**
  - might also be memory-consuming.

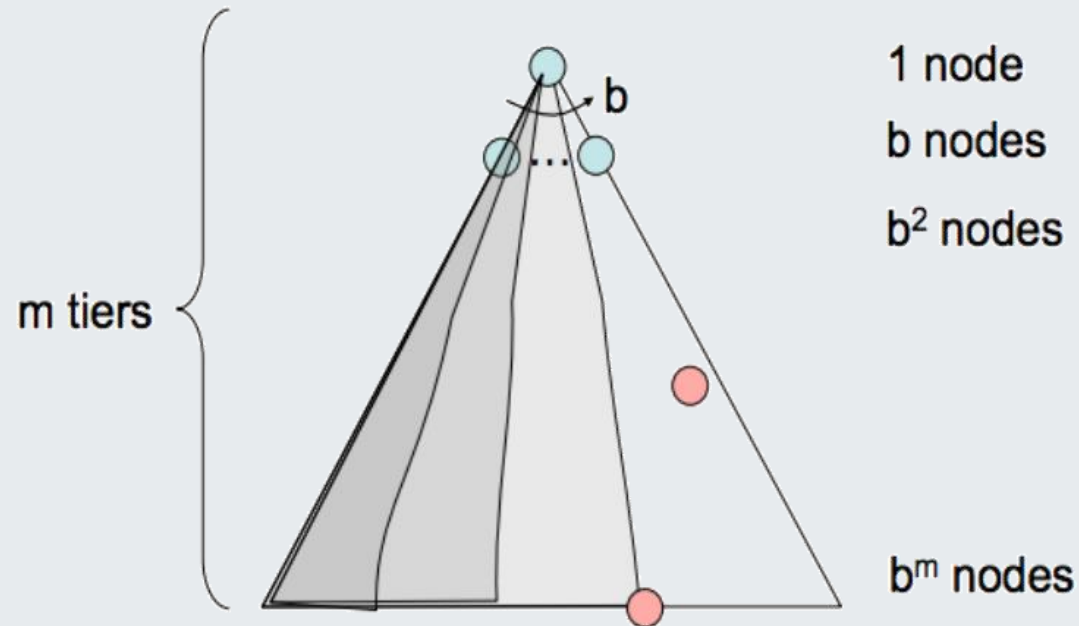
**Question:** is UCS still complete/optimal given negative/zero costs?



- **Goal:** prove optimality of UCS.
- **Idea:** by the greedy property of UCS.
  - UCS always explore nodes with smallest path cost first.
  - When adding a node at the end of path, the cost of path never decreases ( $\epsilon > 0$ ).

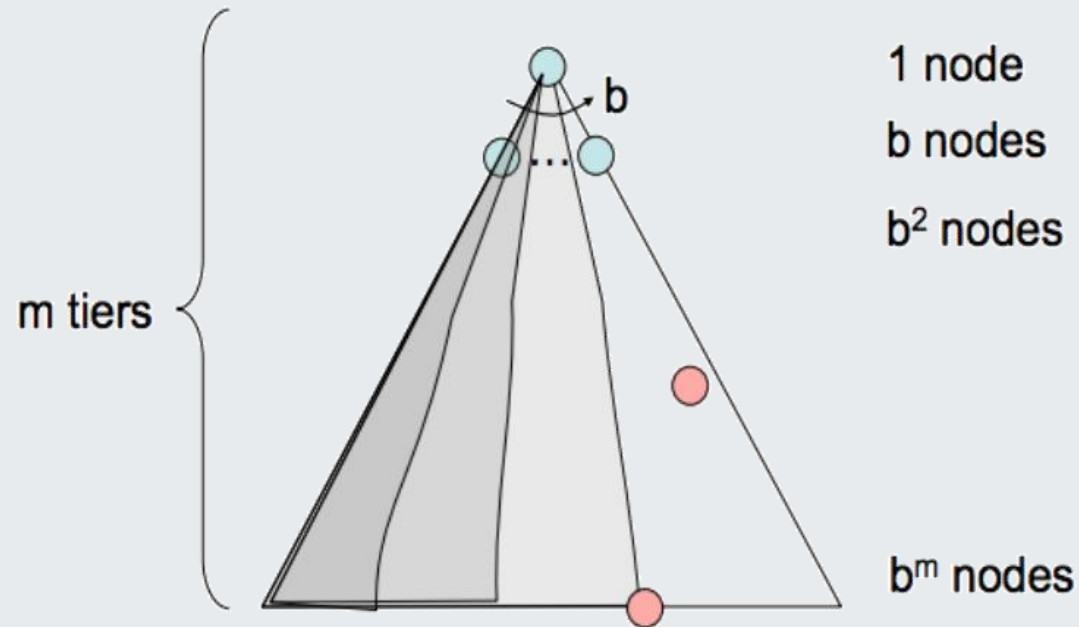
⇒ Nodes not explored must have larger path cost.

# Depth-First Search



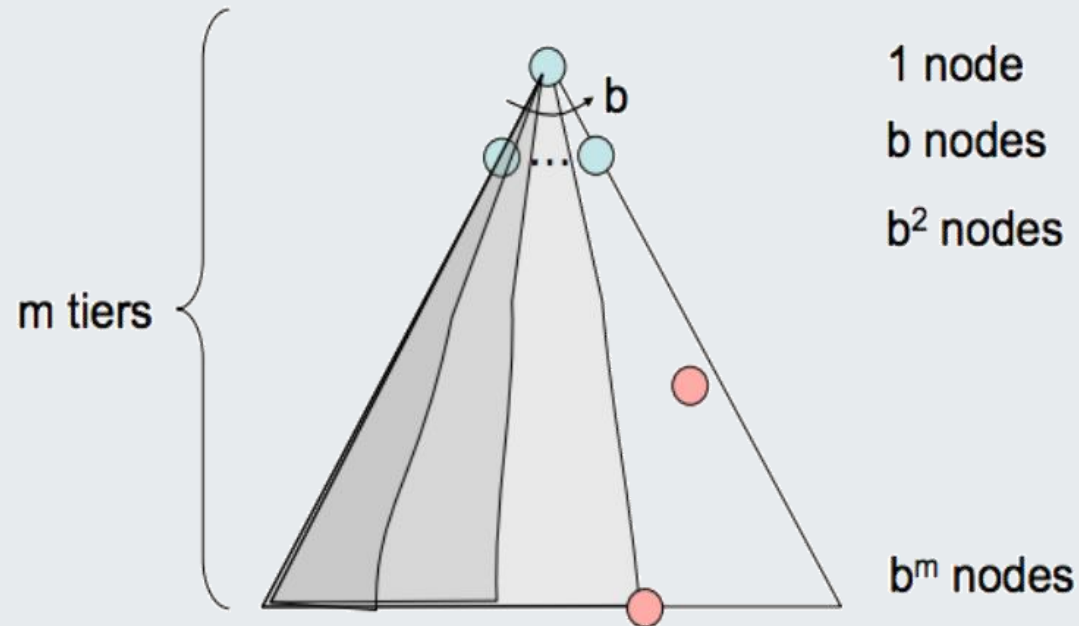
- **Intuition:** try with full sequences of actions, until a sequence leads to a goal.
- **Pros:**
  - more memory-saving.
- **Cons:**
  - fails for trees with infinite depth.
  - usually finds sub-optimal goals.

# Depth Limited Search



- **Intuition:** DFS, but depth is limited to  $\ell$ .
- **Pros:**
  - prevents DFS from going too far on one sequence of actions.
- **Cons:**
  - may not find a solution within depth limit.

# Iterative Deepening Search



- **Intuition:** DLS, but the depth limit increase by 1 per iteration.
- **Pros:**
  - Get merits of both DFS and BFS.
  - preferred if search space is large and depth of solution is unknown.
- **Cons:**
  - Extra work rerunning top levels of the tree.

	Time	Space	Complete?	Optimal?
BFS	$O(b^d)$	$O(b^d)$	Yes (if $b, d$ finite)	Yes (if costs uniform)
UCS	$O(b^{1+\lceil C^*/\varepsilon \rceil})$	$O(b^{1+\lceil C^*/\varepsilon \rceil})$	Yes (if $\varepsilon > 0$ large)	Yes
DFS	$O(b^m)$	$O(bm)$	No (unless $b, m$ finite)	No
DLS	$O(b^\ell)$	$O(b\ell)$	No	No
IDS	$O(b^d)$	$O(bd)$	Yes (if $b, d$ finite)	Yes (if costs uniform)

## Notations:

$b$ : the branching factor.

$d$ : depth of shallowest solution.

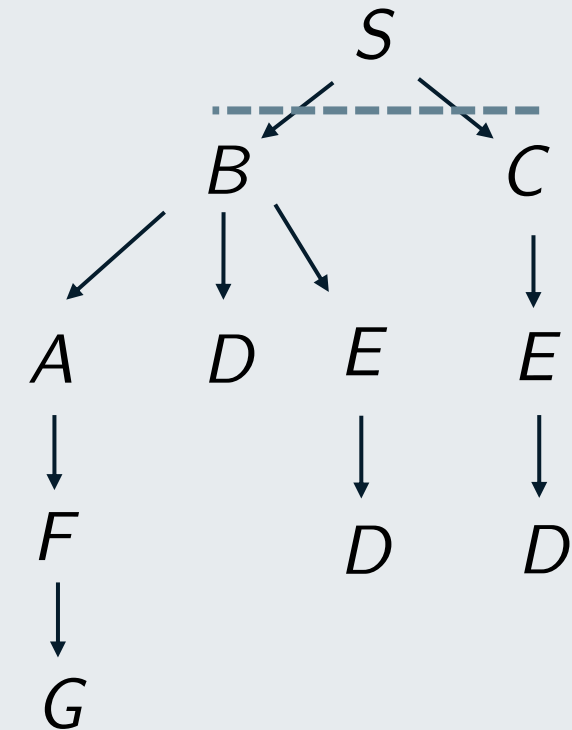
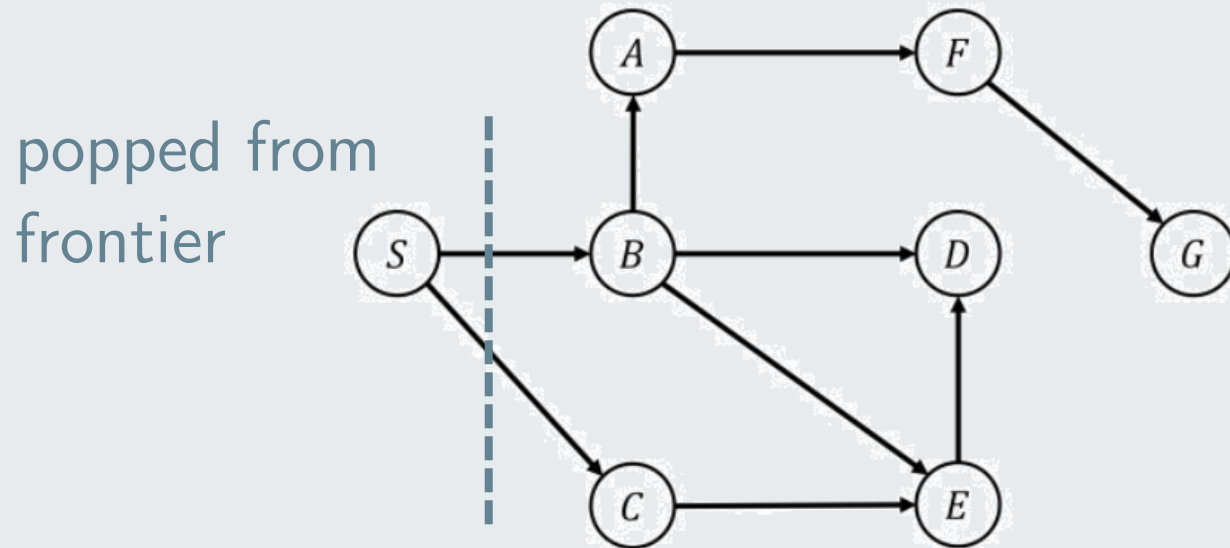
$C^*$ : cost of optimal solution.

$\varepsilon$ : minimum action cost.

$m$ : maximum depth of search tree.

$\ell$ : the depth limit.

# Problem 2.b



## Graph search

## Tree search

BFS

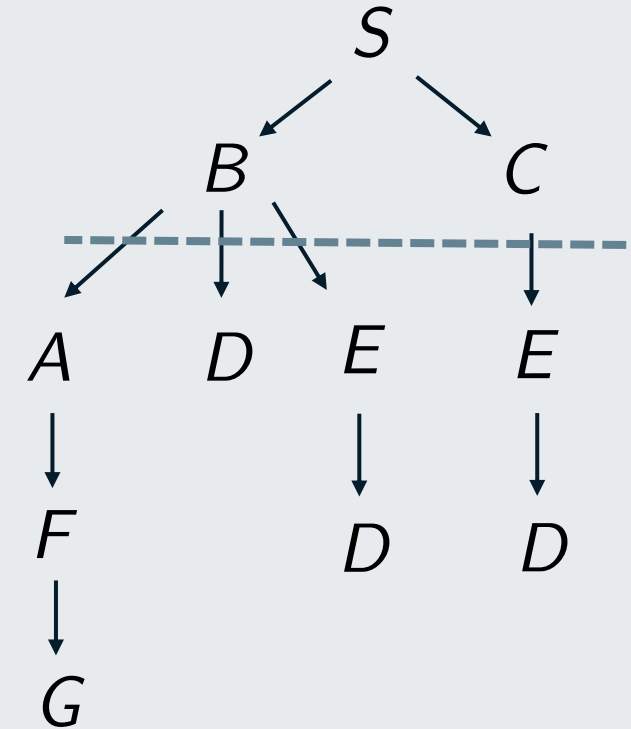
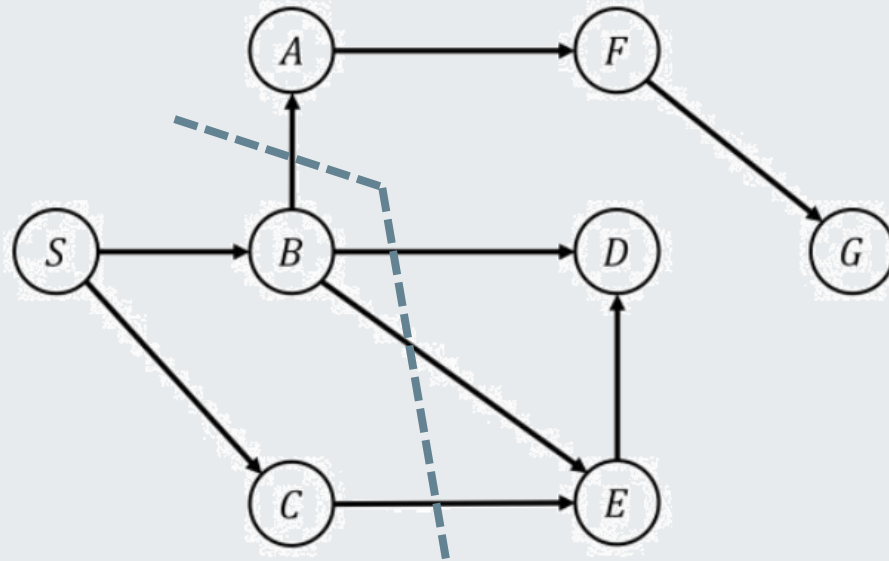
S-

S-

DFS



# Problem 2.b



## Graph search

BFS

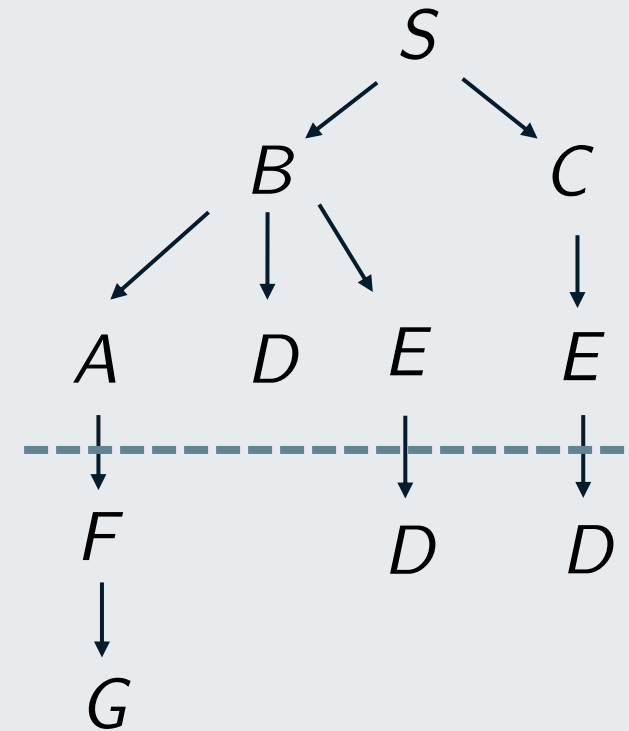
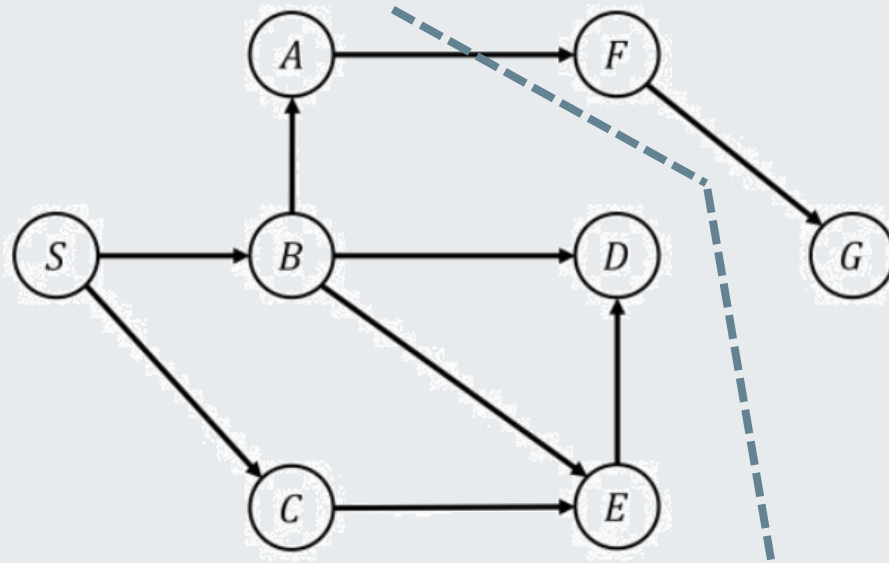
*S-B-C*

DFS

## Tree search

*S-B-C*

# Problem 2.b



## Graph search

BFS

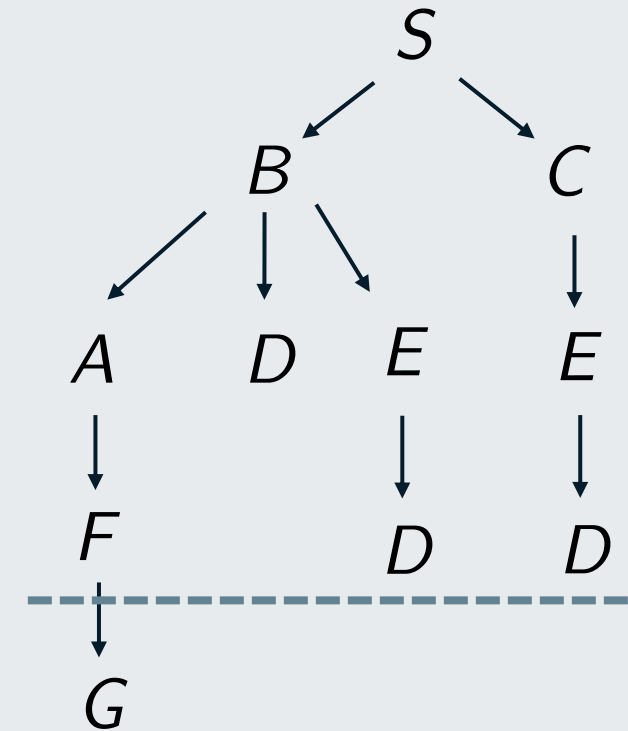
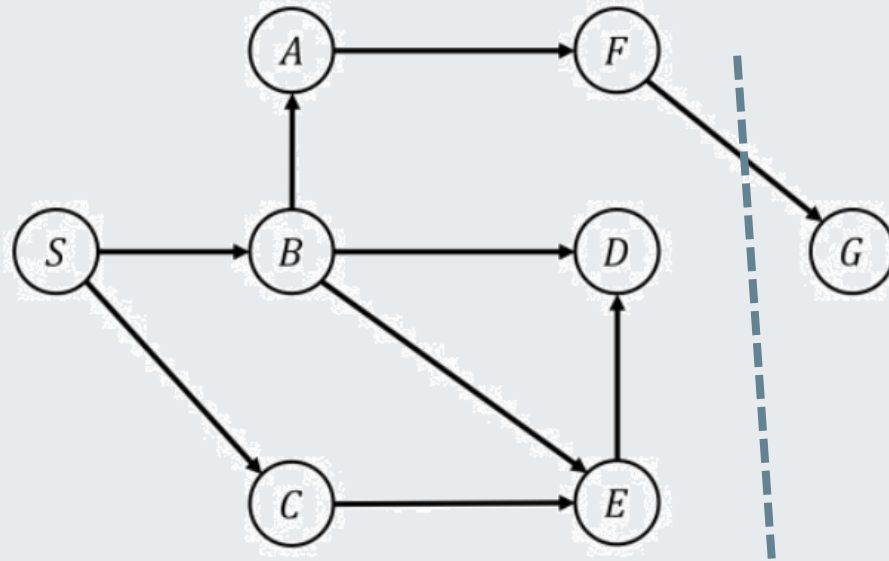
*S-B-C-A-D-E*

DFS

## Tree search

*S-B-C-A-D-E-E*

# Problem 2.b



## Graph search

BFS

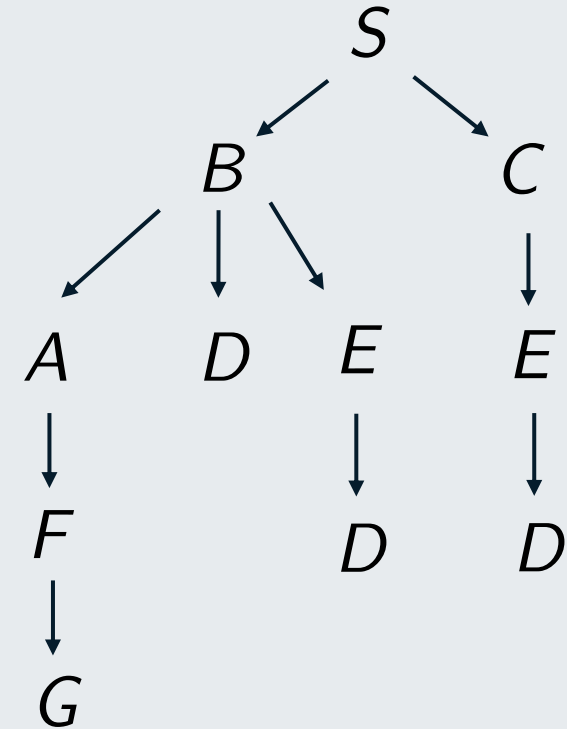
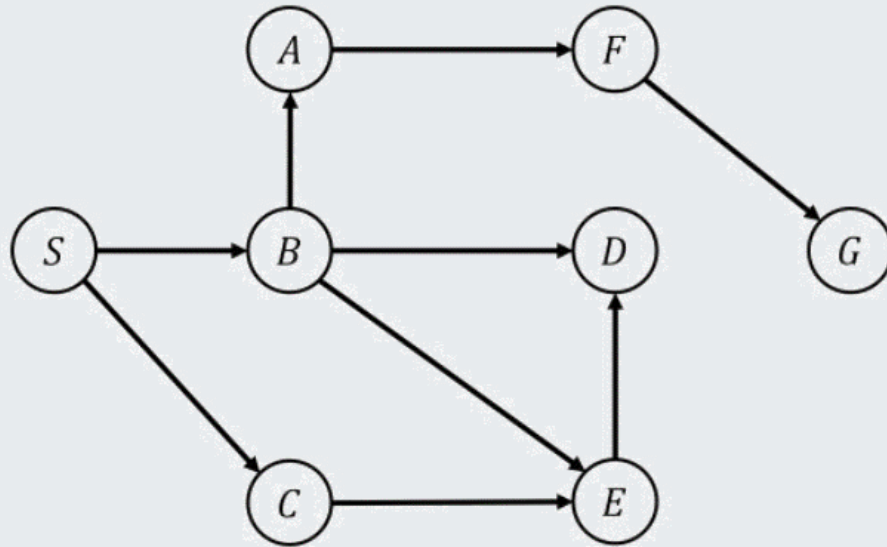
*S-B-C-A-D-E-F*

DFS

## Tree search

*S-B-C-A-D-E-E-F-D-D*

# Problem 2.b



## Graph search

BFS

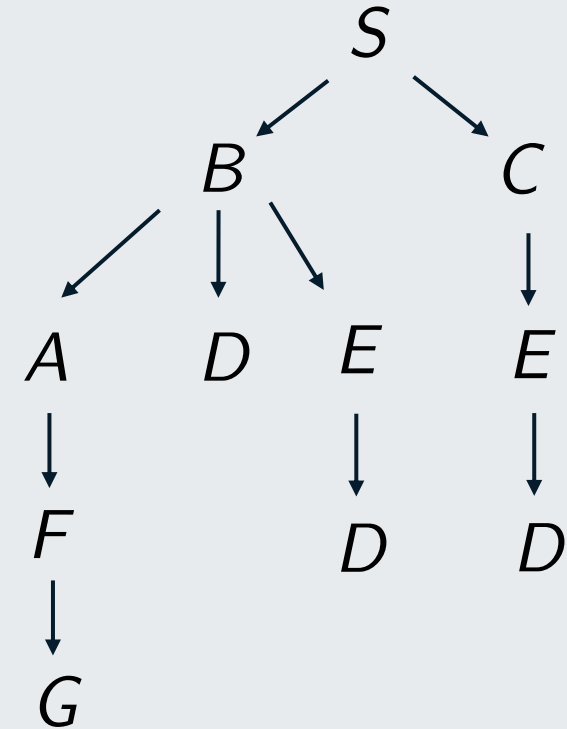
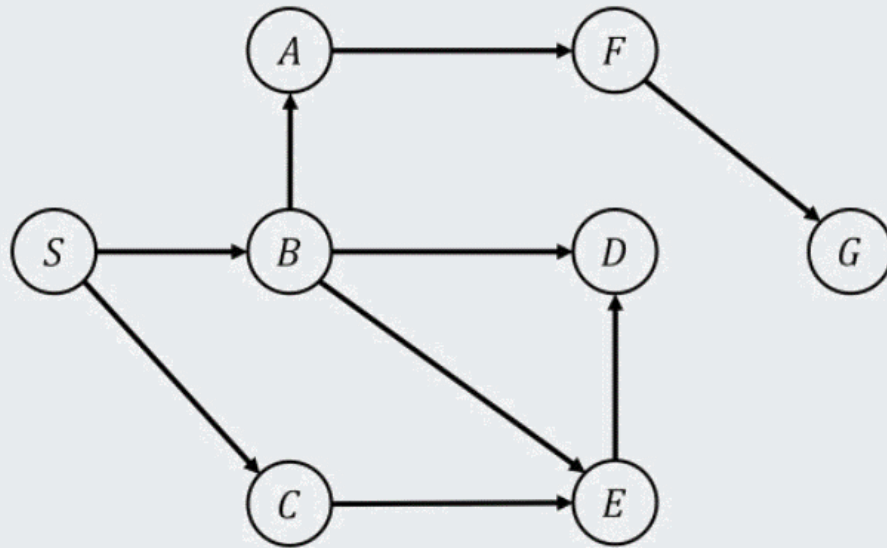
*S-B-C-A-D-E-F-G*

DFS

## Tree search

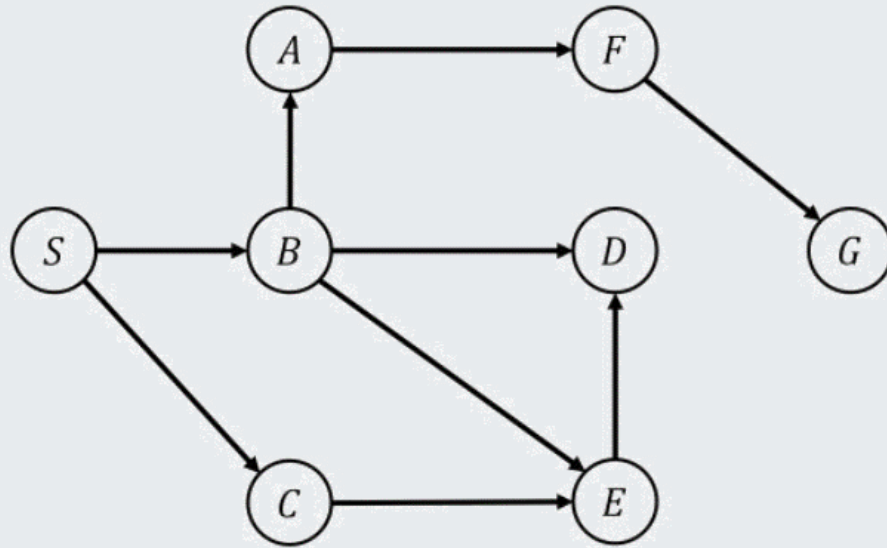
*S-B-C-A-D-E-E-F-D-D-G*

# Problem 2.b

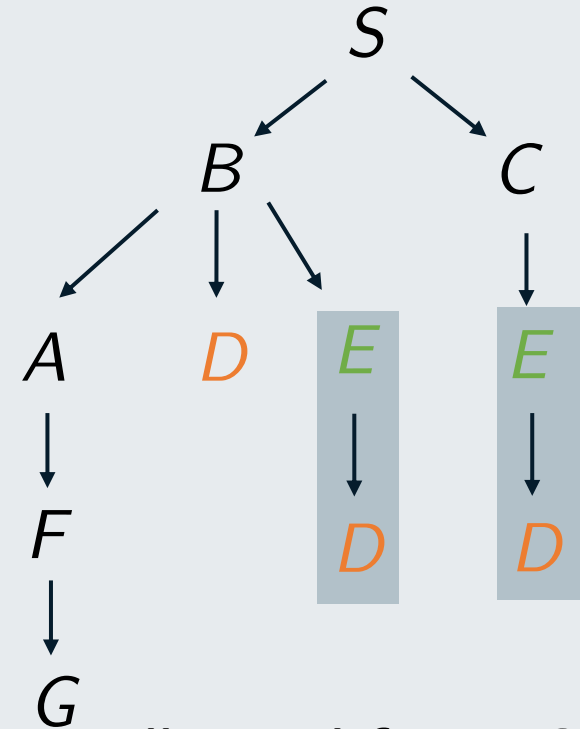


	Graph search	Tree search
BFS	<i>S-B-C-A-D-E-F-G</i>	<i>S-B-C-A-D-E-E-F-D-D-G</i>
DFS	<i>S-C-E-D-B-A-F-G</i>	<i>S-C-E-D-B-E-D-D-A-F-G</i>

# Problem 2.a



usually used for BFS



usually used for DFS

- Tree search may explore **redundant paths**, and the same state multiple times.
- Graph search will not explore visited state (unless via a more optimal path).

# End of File

Thank you very much for your attention!

# References

- D. Ler, "Introduction: Problem Environments & Intelligent Agents", 2023. [Online].
- D. Ler, "Uninformed Search: Problem-solving Agents & Path Planning", 2023. [Online].
- S. Russell and P. Norvig, "Artificial Intelligence: A Modern Approach," 3rd ed., Prentice Hall, 2010.
- N. Sharma. "Introduction to Artificial Intelligence", 2022. [Online]. Available: <https://inst.eecs.berkeley.edu/~cs188/fa22/assets/notes/cs188-fa22-note01.pdf>.