

# **CS3243 : Introduction to Artificial Intelligence**

## Tutorial 1

NUS School of Computing

June 30, 2022

## A bit about me

- ▶ I'm Sumanth Yalamarty (you can call me Sumanth)
- ▶ Studying Computer Science here at NUS

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- ▶ Telegram handle : *@s7manth*
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# Admin

- ▶ Telegram Group
- ▶ Weekly DQs and Tutorial Assignments
- ▶ Clarifications, Ideas, Doubts, Consultations

# Review

- ▶ Building the right intuition about Artificial Intelligence
- ▶ Study of the design of *Rational/Intelligent agents*

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- ▶ Building the right intuition about Artificial Intelligence
- ▶ Study of the design of *Rational/Intelligent agents*
- ▶ Agents? Rationality? Intelligence? (last two pretty subjective topics in general)

# Review

- ▶ Various kinds of Agents
- ▶ Properties of the Task Environment
- ▶ Search Space
- ▶ Graph and Tree-based search implementations
- ▶ Uninformed search strategies : BFS, UCS, DFS, DLS, IDS

## Tutorial Question 1(a)

- ▶ Sudoku is a popular number puzzle that works as follows: we are given a  $9 \times 9$  square grid; some squares have numbers, while some are blank. Objective is to fill in the blanks with numbers from 1 – 9 such that each row, column and the highlighted  $3 \times 3$  squares contain no duplicate entries.



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- ▶ Sudoku puzzles can be solved easily after being modelled as a CSP (which we will cover later in the module). We will consider the problem of generating Sudoku puzzles.

## Tutorial Question 1(a)

Environment Characteristic	Sudoku Puzzle
Fully vs Partially Observable	
Deterministic vs Stochastic	
Epsodic vs Sequential	
Discrete vs Continuous	
Single vs Multi-agent	
Static vs Dynamic	

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**Key Takeaway :** Getting to know about the problem in a more proper/formal way

## Tutorial Question 1(b)

- ▶ State Representation : A state in this problem is a (partial) valid representation of the sudoku puzzle. More formally, it would be a matrix  $A \in \{0\dots9\}^{9 \times 9}$  with 0 representing a blank square.

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2	5	8	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
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5	7	6	1	4	2	8	9	3
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- ▶ Initial and Goal state?
- ▶ The initial state is a completely filled out grid of numbers, where the grid is valid : all rows, columns and  $3 \times 3$  squares contain all numbers between  $\{1...9\}$ . Note that any state in the problem will be a valid goal state.

## Tutorial Question 1(b)

- An action would be removing a number from the grid. More formally, we take as input a matrix  $A$  and a matrix  $E_{i,j}(a)$  where  $E_{i,j}(a) \in \{0\dots 9\}^{9 \times 9}$  is a matrix of all zeros except for a non-zero value  $a \in \{1\dots 9\}$  at coordinate  $(i, j)$ . An action would be setting  $A - E_{i,j}(a)$ . Note that actions must not result in boards with two or more solutions.

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- ▶ We continue blanking out squares as long as the resulting puzzle can be completed in only one way. Hence, the transition model would be

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- ▶ **Key Takeaway** : Right representation of the problem at hand

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- ▶ Graph search algorithms will not explore redundant paths – i.e., they only explore *nodes*
  - (i) with associated states that have not been visited, or
  - (ii) that have been visited, but previously via less optimal paths.

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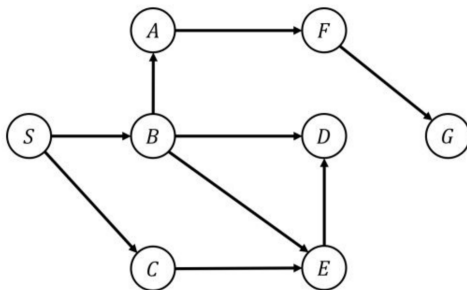
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- ▶ **Key Takeaway** : The difference between states and nodes (often undermined)

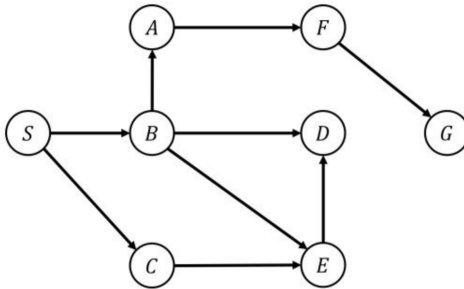
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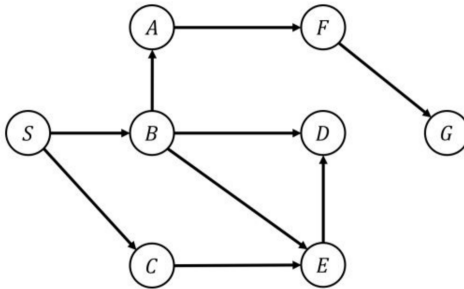
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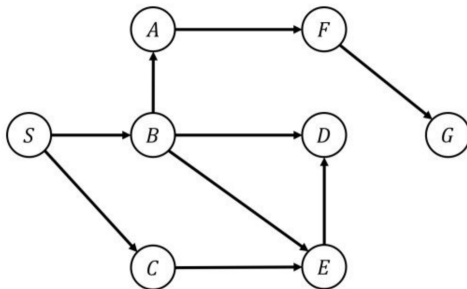


- ▶ DFS with tree-based implementation
- ▶  $S-C-E-D-B-E-D-D-A-F-G$



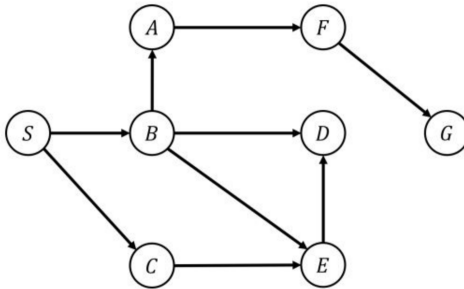
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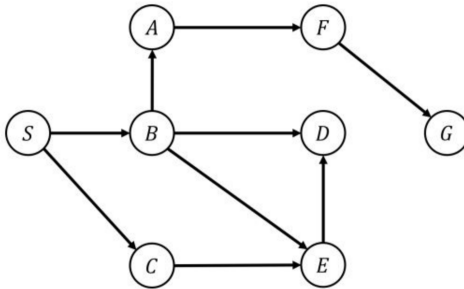
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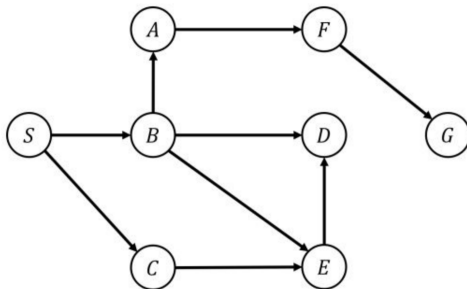
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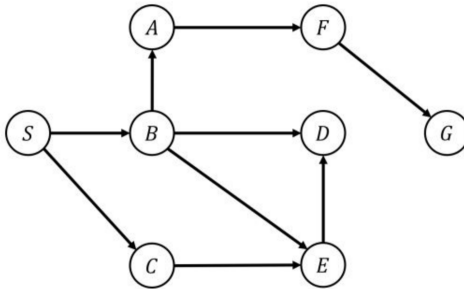
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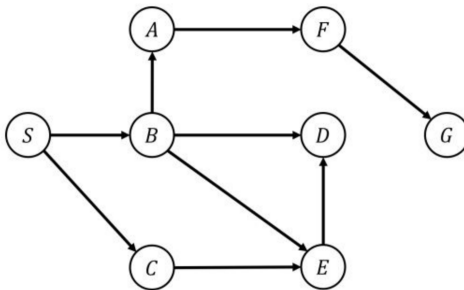
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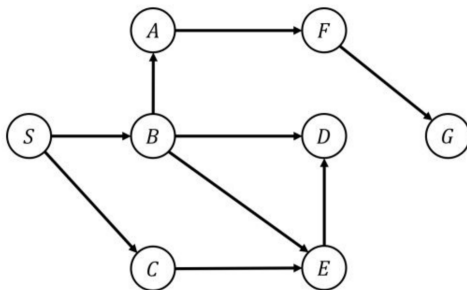
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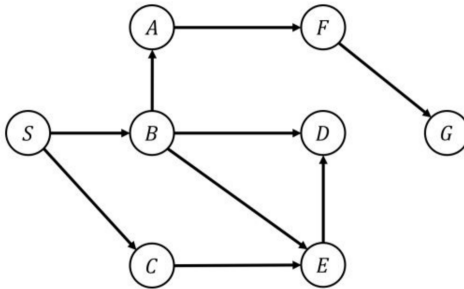
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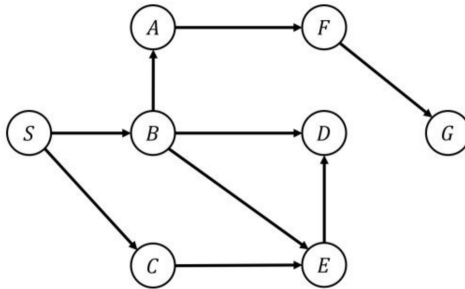


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## Tutorial Question 3

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- ▶ Given that each action cost exceeds some small positive constant  $\epsilon$ , completeness may be assumed.
- ▶ Claim : Whenever UCS expands a node  $n$ , the optimal path to that node has been found.

## Tutorial Question 3

- ▶ If this was not the case (ie, the path to  $n$  was not optimal, let us denote this path  $T$ ), there would have to be another frontier node  $n'$  on the optimal path from the start node to  $n$  (denote this optimal path  $U$ ).

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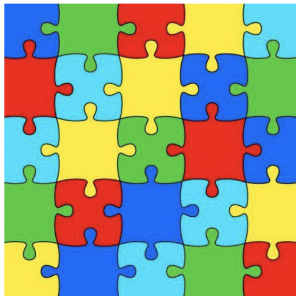
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- ▶ The above two points together imply that UCS expands nodes in the order of the optimal path cost.
- ▶ Something to think about : Would UCS be optimal with tree-based implementation?



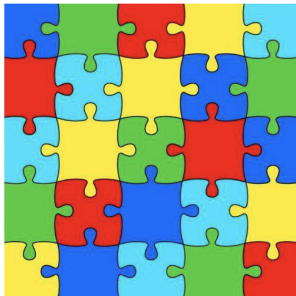
## Tutorial Question 4

- Jigsaw puzzle



## Tutorial Question 4

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- ▶ Some thoughts

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  - ▶ Depending on the representation, either the set of connected puzzle pieces is empty, or the set of unconnected puzzle pieces is full. There should also be no connections between puzzle pieces initially
- ▶ Actions
  - ▶ Taking two unconnected puzzle pieces and establishing a connection between them. Note that you must mention that the pair of puzzle pieces picked can be legally connected (i.e., you cannot simply take any two puzzle pieces).

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- ▶ Step costs are 1 (or any positive constant value, cannot be 0)
- ▶ Goal test
  - ▶ Depending on the representation, either the connected set is full, or the unconnected set is empty
  - ▶ Check that for every puzzle piece, there should not be more connections than its number of available legal connections



# **Thank you!**

If you have any questions, please don't hesitate. Feel free to ask!  
We are here to learn together!