

# CS3243 Tutorial 2

---

Eric Han

Aug 30, 2022

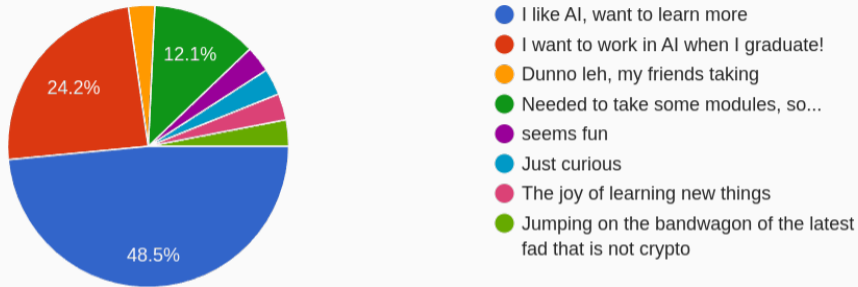
## Important admin

1. Attendance Marking on telegram; Honor system, check-in if you are here - else select that you are not in / ignore the check-in. Sum check will be performed.
2. Assignment 1 scores and comments will be out soon
  - 2.1 “Your submission must contain 20 words or more.” - This is a limitation on turnitin; fill in with some placeholder text to get around this.
3. Show me your bonus to collect your snacks; Note - early goal test for BFS only.
  - 3.1 Note: Early goal test for BFS only; AIMA Python.

## Tidbits from tutorials

1. What is the type of proof for Q4? See Wiki Math proof.
2. Different formulations for a particular environment is possible; Some are better!

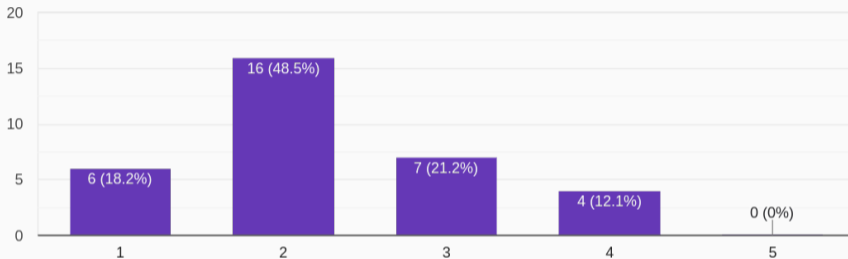
## Welcome Survey - Why are you taking CS3243?



**Figure 1:** Why are you taking CS3243?

I love AI - simply amazing that we can create intelligence with high degree of autonomy; I believe in automation and it is the future of automation. General machine intelligence is still an open question.

## Welcome Survey - How much do you know about AI/ML?



**Figure 2:** How much do you know about AI/ML?

Wherever you are, you will some takeaways; ask for help whenever you need - your peers and I are here to help!

## What do you want to achieve in tutorials?

1. Get to know like-minded individuals and learn more about AI through class & peers.
2. I want to learn and be able to keep up with the class instead of blindly copying the slides and not understanding anything.
  - 2.1 Learn more in depth than lecture
  - 2.2 Improving understanding
  - 2.3 How to better understand AI and the algorithms that they utilise
3. Reinforce concepts taught in lecture
  - 3.1 Iron out misconceptions
  - 3.2 Fill in any gaps in my knowledge

## Any suggestions to make our classes effective?

1. Make students answer question! [Yes you will; feel free to volunteer!]
2. Would be better if the slide is uploaded ASAP, ... [Wed - Bonus]
3. using something like classkick allows for ... [will explore, might be too late]

## Previously from T01, Q5

### Recap

Question 2b.

### Question

Determine the **final path** found from the start ( $S$ ) to the goal ( $G$ )?

### Answer

S-B-F-H-D-G

# Question 1

## Recap

- What is Greedy-Best-First Search (GBFS) algorithm?
  - $f(n) = h(n)$
- What is - incomplete?
  - Incomplete describes the algorithm being stuck in a loop where  $h(\cdot)$  are lowest.
- What is the difference between tree / graph based algorithm?

## Question 1a

Provide a counter-example to show that the **tree-based** implementation for the **Greedy Best-First Search** algorithm is **incomplete**.



## Question 1a

Provide a counter-example to show that the **tree-based** implementation for the **Greedy Best-First Search** algorithm is **incomplete**.

**Answer**

**Intuition:** Create a situation where the path to  $G$  never gets explored.

$s$	$S_0$	$S_1$	$S_2$	$G$
$h(s)$	3	4	5	0



**Figure 3:** GBFS Infinite Loop Example

1.  $S_0$  is explored,  $S_1$  is added to front of frontier.
2.  $S_1$  is explored,  $S_0$  is added to the front of frontier. etc. . .

## Question 1b

Briefly explain why the **graph search** implementation of the **Greedy Best-First Search** algorithm is **complete**.

## Question 1b

Briefly explain why the **graph search** implementation of the **Greedy Best-First Search** algorithm is **complete**.

### Answer

- Graph-based implementation of GBFS will not explore redundant paths.
- Assuming a finite search space, there are finite paths.
- Hence, graph-based implementation of GBFS will eventually visit all states within the search space and find a goal state or not (all states visited).

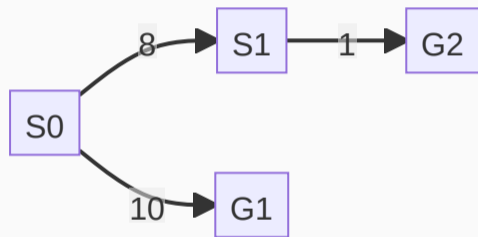
## Question 1c

Provide a counter-example to show that neither the **tree-based** nor the **graph search** implementations of the **Greedy Best-First Search** algorithm are **optimal**.

## Question 1c

Provide a counter-example to show that neither the **tree-based** nor the **graph search** implementations of the **Greedy Best-First Search** algorithm are **optimal**.

**Answer**



$s$	S0	S1	G1	G2
$h(s)$	9	1	0	0

**Figure 4:** Non-Optimal Example

1.  $S_0$  is explored,  $G_1$  is added to front of frontier -  $f(.) = h(.)$
2. Non-optimal path  $S_0 \rightarrow G_1$  returned.

## Question 2

### Recap

- What is the intuition behind A\* Search?
- What is an admissible heuristic?
- What is a consistent heuristic?

## Question 2

### Recap

- What is the intuition behind A\* Search?
- What is an admissible heuristic?
- What is a consistent heuristic?

### Summary

- A\* Search:  $f(N) = g(N) + h(N)$
- Admissible heuristic:  $h(N) \leq h^*(N)$
- Consistent heuristic:  $h(N) \leq c(N, N') + h(N')$

Where,

- $f(.)$  - Evaluation Function.
- $g(.)$  - Cost Function from start to current node.
- $h(.)$  - Estimated cost from current node to goal.
- $c(N, N')$  - Action cost from  $N$  to  $N'$ .

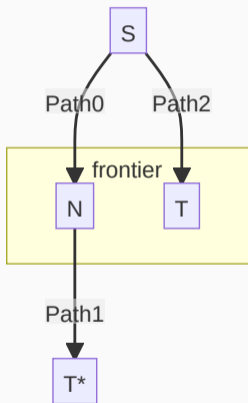
## Question 2a

Prove that the **tree** impl. of **A\* Search** is optimal (**admissible heuristic** is used).



## Question 2a

Prove that the **tree** impl. of **A\* Search** is optimal (**admissible heuristic** is used).



**Figure 5:** Illustration

- $S$  - Initial State
- $N$  - Intermediate State along optimal Path0, Path1
- $T$  - Sub Optimal Goal state along sub-optimal Path2
- $T^*$  - Goal state along optimal Path0, Path1

### Proof by Contradiction:

1. Assume sub-optimal  $T$  is found instead of the  $T^*$
2.  $\implies T$  is found before  $N \rightarrow f(T) < f(N)$
3. Since  $T^*$  is optimal,  $f(T) > f(T^*)$ 
  - 3.1  $f(T) > f(T^*)$
  - 3.2  $f(T) > g(T^*) + h(T^*) \implies f(T) > g(T^*)$
  - 3.3  $f(T) > g(N) + h^*(N) \implies f(T) > g(N) + h(N)$
  - 3.4  $\implies f(T) > f(N)$
4. Tree-Search would have explored  $T^*$ ,  $\nRightarrow f(T) < f(N)$

## Question 2b

Prove that **graph** impl. of **A\* Search** is optimal when a **consistent heuristic** is used.

## Question 2b

Prove that **graph impl.** of **A\* Search** is optimal when a **consistent heuristic** is used.

**Intuition:** Show that when a node is popped from frontier, optimal path to it is found.

Let the optimal path to any node  $s_g$  be  $P_{0 \rightarrow g} = s_0, s_1, \dots, s_g$ . We show that when  $s_g$  is popped,  $f(s_g) = g(s_g) + h(s_g) = g^*(s_g) + h(s_g)$ , where  $g^*(s_g)$  is the optimal path cost.

- **Base:**  $f(s_0) = g(s_0) + h(s_0) = h(s_0)$ .
- **Inductive:** Assume for  $P_{0 \rightarrow k}$ ,  $\implies g(s_k) = g^*(s_k)$  (optimal path to it is found)
  - $g^*(s_{k+1})$  is the minimum path cost,  $\implies g(s_{k+1}) \geq g^*(s_{k+1})$
  - Since consistent,  $h(s_k) \leq c(s_k, s_{k+1}) + h(s_{k+1})$ ;  $s_k$  is popped.
    - $f(s_{k+1}) \leq g(s_k) + c(s_k, s_{k+1}) + h(s_{k+1})$
    - $\implies g(s_{k+1}) + h(s_{k+1}) \leq g(s_k) + c(s_k, s_{k+1}) + h(s_{k+1})$
    - $\implies g(s_{k+1}) \leq g(s_k) + c(s_k, s_{k+1}) = g^*(s_k) + c(s_k, s_{k+1}) = g^*(s_{k+1})$
    - $\implies g(s_{k+1}) \leq g^*(s_{k+1})$
  - $g(s_{k+1}) \leq g^*(s_{k+1}) \wedge g(s_{k+1}) \geq g^*(s_{k+1}) \implies g(s_{k+1}) = g^*(s_{k+1})$

## Question 3

### Recap

- Admissible heuristic:  $h(N) \leq h^*(N)$
- Consistent heuristic:  $h(N) \leq c(N, N') + h(N')$

## Question 3a

Given that a **heuristic**  $h$  is such that  $h(t) = 0$ , where  $t$  is any goal state, prove that if  $h$  is **consistent**, then it must be **admissible**.

## Question 3a

Given that a **heuristic**  $h$  is such that  $h(t) = 0$ , where  $t$  is any goal state, prove that if  $h$  is **consistent**, then it must be **admissible**.

### Answer

**Intuition:** Show on the number of action required to reach the goal from  $n$  to goal  $t$ .

Let the no. of actions  $k$  to be required to reach from  $n_k$  to  $t$  on optimal path  $P_{n_k \rightarrow t}$ .

Node  $n_k$  is  $k$  steps away from  $t$ , ie.  $k = 3 \implies P_{n_3 \rightarrow t} : n_3 \rightarrow n_2 \rightarrow n_1 \rightarrow t$ .

- **Base:** 1 action; i.e. node  $n_1$  is one step away from  $t$ .
  - Since consistent,  $h(n_1) \leq c(n_1, t) + h(t)$  and  $h(t) = 0$
  - $\implies h(n_1) \leq c(n_1, t) = h^*(n_1) \implies$  admissible.
- **Inductive:** Assume for  $k - 1$  actions, path  $P_{n_{k-1} \rightarrow t}$ ,  $h(n_{k-1}) \leq h^*(n_{k-1})$ .
  - Since consistent,  $h(n_k) \leq c(n_k, n_{k-1}) + h(n_{k-1})$
  - $\implies h(n_k) \leq c(n_k, n_{k-1}) + h^*(n_{k-1}) = h^*(n_k) \implies$  admissible.

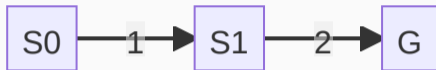
## Question 3b

Give an example of an **admissible heuristic** that is **not consistent**.

## Question 3b

Give an example of an **admissible heuristic** that is **not consistent**.

**Answer**



**Figure 6:** Example

$s$	S0	S1	G
$h(s)$	3	1	0
$h^*(s)$	3	2	0
$h(s) \leq h^*(s)$	T	T	T

Heuristic  $h$  is

- Admissible -  $\forall s : h(s) \leq h^*(s)$
- Not consistent -  $3 = h(s_0) > c(s_0, s_1) + h(s_1) = 2$



## Question 4

We have seen various search strategies in class, and analyzed their worst-case running time. Prove that **any deterministic search algorithm** will, in the worst case, **search the entire state space**. More formally, prove the following theorem

**Theorem 1.** Let  $\mathcal{A}$  be some complete, deterministic search algorithm. Then for any search problem defined by a finite connected graph  $G = \langle V, E \rangle$  (where  $V$  is the set of possible states and  $E$  are the transition edges between them), there exists a choice of start node  $s_0$  and goal node  $g$  so that  $\mathcal{A}$  searches through the entire graph  $G$ .

## Answer

**Intuition:** Fixing  $s_0$ , we try to find a goal node  $g$  such that  $\mathcal{A}$  searches all of  $G$ .

In the  $t$ -th iteration (Count only iterations where  $\mathcal{A}$  explores a new node),

- Let  $g_t$  to be the goal node chosen only in  $t$ , to be  $U_{t-1} \setminus U_t$
- Let  $U_t$  be the set of unsearched nodes,  $V = U_0$ .

Since there is finite  $|V|$  and  $\mathcal{A}$  is complete, then  $U_0 \subset U_1 \subset U_2 \subset \dots \subset U_{|V|} = \emptyset$ ,

1. Pick a random node in  $U_0$  to be goal node and run  $\mathcal{A}$ .
2.  $\mathcal{A}$  terminates on the  $k$ -th iteration with search sequence  $S_k$ , finding goal node  $g_k$ .
3. Since  $\mathcal{A}$  is deterministic, when we reset the goal node to be any in  $U_k$ :
  - 3.1 Worse case to be  $g_{k+1}$  one step away from  $g_k$ .
  - 3.2 It will take the same search route  $S_k + [g_{k+1}]$  to reach the new goal  $g_{k+1}$ .

Hence, we can always choose  $g_{|V|}$  to be the goal node, such that  $\mathcal{A}$  searches all of  $G$ .

## Question 5

Assignment Question, due on Sunday.

## Bonus Question - Work for Snack

To help you further your understanding, not compulsory.

### Tasks

1. Fork the repository <https://github.com/eric-vader/CS3243-2223s1-bonus>
2. Look for `tutorial2.py`, we will be solving Q5a,b,d using code.
3. Some boilerplate code is given that has the 5 heuristics (also 5d), with the graph.
4. Compute whether each heuristic is admissible and/or consistent in the table per Q5.
5. Implement the **A\* Search** algorithm; Assume a **graph** implementation that utilises heuristic  $h_4$ . Further, assume graph search **Version 3**.

To claim your snack, show me your forked repository and your code's output.