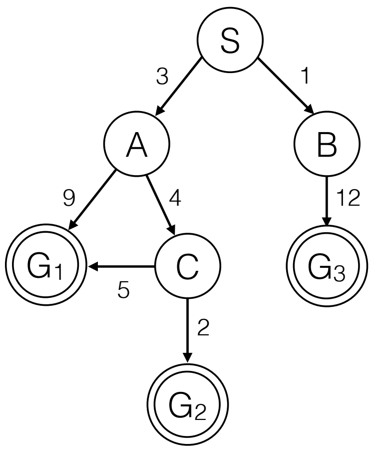
CS 188 Summer 2024 | Introduction to Artificial Intelligence

Exam Prep 2A Solutions

Q1. Search: Algorithms



	A	B	C	S
H-1	0	0	0	0
H-2	6	7	1	7
H-3	7	7	1	7
H-4	4	7	1	7

(a) Consider the search graph and heuristics shown above. Select **all** of the goals that **could** be returned by each of the search algorithms below. For this question, if there is a tie on the fringe, assume the tie is broken **randomly**.

(i) DFS — G_1 ● G_2 ● G_3 ●

(ii) BFS — G_1 ● G_2 ○ G_3 ●

(iii) UCS — G_1 ○ G_2 ● G_3 ○

(iv) Greedy with H-1 — G_1 ● G_2 ● G_3 ●

(v) Greedy with H-2 — G_1 ● G_2 ○ G_3 ○

(vi) Greedy with H-3 — G_1 ● G_2 ○ G_3 ●

(vii) A* with H-2 — G_1 ○ G_2 ● G_3 ○

(viii) A* with H-3 — G_1 ○ G_2 ● G_3 ○

(b) For each heuristic, indicate whether it is consistent, admissible, or neither (select more than one option if appropriate):

(i) H-1 — Consistent ● Admissible ● Neither ○

(ii) H-2 — Consistent ○ Admissible ● Neither ○

(iii) H-3 — Consistent ○ Admissible ○ Neither ●

(iv) H-4 — Consistent ● Admissible ● Neither ○

Q2. Searching with Heuristics

Consider the A* searching process on the connected undirected graph, with starting node S and the goal node G. Suppose the cost for each connection edge is **always positive**. We define $h^*(X)$ as the shortest (optimal) distance to G from a node X.

Answer Questions (a), (b) and (c). You may want to solve Questions (a) and (b) at the same time.

(a) Suppose h is an **admissible** heuristic, and we conduct A* **tree search** using heuristic h' and finally find a solution. Let C be the cost of the found path (directed by h', defined in part (a)) from S to G

(i) Choose **one best** answer for each condition below.

1. If $h'(X) = \frac{1}{2}h(X)$ for all Node X, then ● $C = h^*(S)$ ○ $C > h^*(S)$ ○ $C \geq h^*(S)$
2. If $h'(X) = \frac{h(X)+h^*(X)}{2}$ for all Node X, then ● $C = h^*(S)$ ○ $C > h^*(S)$ ○ $C \geq h^*(S)$
3. If $h'(X) = h(X) + h^*(X)$ for all Node X, then ○ $C = h^*(S)$ ○ $C > h^*(S)$ ● $C \geq h^*(S)$
4. If we define the set $K(X)$ for a node X as all its neighbor nodes Y satisfying $h^*(X) > h^*(Y)$, and the following always holds

$$h'(X) \leq \begin{cases} \min_{Y \in K(X)} h'(Y) - h(Y) + h(X) & \text{if } K(X) \neq \emptyset \\ h(X) & \text{if } K(X) = \emptyset \end{cases}$$

then, ● $C = h^*(S)$ ○ $C > h^*(S)$ ○ $C \geq h^*(S)$

5. If K is the same as above, we have

$$h'(X) = \begin{cases} \min_{Y \in K(X)} h(Y) + cost(X, Y) & \text{if } K(X) \neq \emptyset \\ h(X) & \text{if } K(X) = \emptyset \end{cases}$$

where $cost(X, Y)$ is the cost of the edge connecting X and Y, then, ● $C = h^*(S)$ ○ $C > h^*(S)$ ○ $C \geq h^*(S)$

6. If $h'(X) = \min_{Y \in K(X)+\{X\}} h(Y)$ (K is the same as above), ● $C = h^*(S)$ ○ $C > h^*(S)$ ○ $C \geq h^*(S)$

(ii) In which of the conditions above, h' is still **admissible** and for sure to dominate h? Check all that apply. Remember we say h_1 dominates h_2 when $h_1(X) \geq h_2(X)$ holds for all X. □ 1 ■ 2 □ 3 □ 4 □ 5 □ 6

(b) Suppose h is a **consistent** heuristic, and we conduct A* **graph search** using heuristic h' and finally find a solution.

(i) Answer exactly the same questions for each conditions in Question (a)(i).

1. ● $C = h^*(S)$ ○ $C > h^*(S)$ ○ $C \geq h^*(S)$
2. ● $C = h^*(S)$ ○ $C > h^*(S)$ ○ $C \geq h^*(S)$
3. ○ $C = h^*(S)$ ○ $C > h^*(S)$ ● $C \geq h^*(S)$
4. ● $C = h^*(S)$ ○ $C > h^*(S)$ ○ $C \geq h^*(S)$
5. ● $C = h^*(S)$ ○ $C > h^*(S)$ ○ $C \geq h^*(S)$
6. ○ $C = h^*(S)$ ○ $C > h^*(S)$ ● $C \geq h^*(S)$

(ii) In which of the conditions above, h' is still **consistent** and for sure to dominate h? Check all that apply.

□ 1 ■ 2 □ 3 □ 4 ■ 5 □ 6

Grading for Bubbles: 0.5 pts for a1 a2 a3 a6 b1 b2. 1 pts for a4 a5 b3 b4 b5 b6.

Explanations:

All the $C > h^*(S)$ can be ruled out by this counter example: there exists only one path from S to G.

Now for any $C = h^*(S)$ we shall provide a proof. For any $C \geq h^*(S)$ we shall provide a counter example.

a3b3 - Counter example: SAG fully connected. cost: SG=10, SA=1, AG=7. h*: S=8, A=7, G=0. h: S=8, A=7, G=0. h': S=16, A=14, G=0.

a4 - Proof: via induction. We can have an ordering of the nodes $\{X_j\}_{j=1}^n$ such that $h^*(X_i) \geq h^*(X_j)$ if $i < j$. Note any $X_k \in K(X_j)$ has $k > j$.

X_n is G, and has $h'(X_n) \leq h(X_n)$.

Now for j, suppose $h'(X_k) \leq h(X_k)$ for any $k > j$ holds, we can have $h'(X_j) \leq h'(X_k) - h(X_k) + h(X_j) \leq h(X_j)$ ($K(X_j) = \emptyset$ also get the result).

b4 - Proof: from a4 we already know that h' is admissible.

Now for each edge XY, suppose $h^*(X) \geq h^*(Y)$, we always have $h'(X) \leq h'(Y) - h(Y) + h(X)$, which means $h'(X) - h'(Y) \leq h(X) - h(Y) \leq cost(X, Y)$, which means we always underestimate the cost of each edge **from the potential optimal path direction**. Note h' is not necessarily to be consistent ($h'(Y) - h'(X)$ might be very large, e.g. you can arbitrarily modify h'(S) to be super small), but it always comes with optimality.

a5 - Proof: the empty K path: $h'(X) \leq h(X) \leq h^*(X)$. the non-empty K path: there always exists a $Y_0 \in K(X)$ such that Y_0 is on the optimal path from X to G. We know $cost(X, Y_0) = h^*(X) - h^*(Y_0)$, so we have $h'(X) \leq h(Y_0) + cost(X, Y_0) \leq h^*(Y_0) + cost(X, Y_0) = h^*(X)$.

b5 - Proof:

First we prove $h'(X) \geq h(X)$. For any edge XY, we have $h(X) - h(Y) \leq cost(X, Y)$. So we can have $h(Y) + cost(X, Y) \geq h(X)$ holds for any edge, and hence we get the dominace of h' over h. Note this holds only for consistent h.

We then have $h'(X) - h'(Y) \leq h(Y) + cost(X, Y) - h'(Y) \leq cost(X, Y)$. So we get the consistency of h'.

Extension Conclusion 1: If we change K(X) into {all neighbouring nodes of X} + {X}, h' did not change.

Extension Conclusion 2: h' dominates h, which is a better heuristics. This (looking one step ahead with h') is equivalent to looking two steps ahead in the A* search with h (while the vanilla A* search is just looking one step ahead with h).

a6 - Proof: $h'(X) \leq h(X) \leq h^*(X)$.

b6 - counter example: SAB fully connected, BG connected. cost: SA=8, AB=1, SB=10, BG=30. h*: A=31, B=30 G=0. h=h*. h': A=30, B=0, C=0.

(c) Suppose h is an **admissible** heuristic, and we conduct A* **tree search** using heuristic h' and finally find a solution. If $\epsilon > 0$, and X_0 is a node in the graph, and h' is a heuristic such that

$$h'(X) = \begin{cases} h(X) & \text{if } X = X_0 \\ h(X) + \epsilon & \text{otherwise} \end{cases}$$

- Alice claims h' can be inadmissible, and hence $\underline{C = h^*(S) \text{ does not always hold}}$.
- Bob instead thinks the node expansion order directed by h' is the same as the heuristic h'', where

$$h''(X) = \begin{cases} h(X) - \epsilon & \text{if } X = X_0 \\ h(X) & \text{if otherwise} \end{cases}$$

Since h'' is admissible and will lead to $C = h^*(S)$, and so does h'. Hence, $\underline{C = h^*(S) \text{ always holds}}$.

The two conclusions (underlined) apparently contradict with each other, and **only exactly one of them are correct and the other is wrong**. Choose the **best** explanation from below - which student's conclusion is wrong, and why are they wrong?

○ Alice's conclusion is wrong, because the heuristic h' is always admissible.

○ Alice's conclusion is wrong, because an inadmissible heuristics does not necessarily always lead to the failure of the optimality when conducting A* tree search.

○ Alice's conclusion is wrong, because of another reason that is not listed above.

○ Bob's conclusion is wrong, because the node visiting expansion ordering of h'' during searching might not be the same as h'.

○ Bob's conclusion is wrong, because the heuristic h'' might lead to an incomplete search, regardless of its optimally property.

● Bob's conclusion is wrong, because of another reason that is not listed above.

Choice 4 is incorrect, because the difference between h' and h'' is a constant. During searching, the choice of the expansion of the fringe will not be affected if all the nodes add the same constant to the heuristics.

Choice 5 is incorrect because there will never be an infinite loop if there are no cycle has negative COST sum (rather than HEURISTICS). If there is a cycle, such that its COST sum is positive, and all the nodes in the cycle have negative heuristics, when we do g+h, g is getting larger and larger, while h remains a not-that-large negative value. Soon, the search algorithm will be favoring other paths even if the h in there are not negative.

The true reason: h'' violate a property of admissible heuristic. Since h is admissible, we have $h(G) = 0$. If $X_0 = G$, we have a negative heuristic value at $h''(G)$, and it is no longer admissible. If $X_0 \neq G$, then it is indeed that the optimality holds - the only change is that more nodes will be likely to be expanded for h' and h'' compared to h.