# CS 188 Discussion 2:

### Informed Search

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Slides inspired by Sashrika Pandey and Regina Wang

### **Administrivia**

- Project 1 due this Friday, Sep 8
- Homework 1 due next Tuesday, Sep 12
- We have office hours pretty much all day every weekday (12-7),
  come to Soda 341B!
- Reminder: Need extensions? We will give you extensions!

# **Today's Topics**

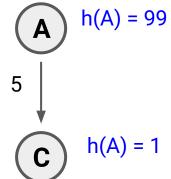
- Heuristics
  - Admissible Heuristics
  - Consistent Heuristics
- A\* Search

#### **Heuristics**

- **Heuristic:** Quick estimate of cost to get from node n to goal state h(n)
  - o Common example you might use: Manhattan distance from node n to goal in a maze
- Admissible: heuristic always underestimates (≤) true cost
  - $\forall$  n,  $0 \le h(n) \le h^*(n)$
  - h\*(n) is the true best cost to get from n to goal
- Consistent: heuristic always underestimates all arc costs

  - Consistency is stronger than admissibility
  - Consistency implies admissibility, but not the other way around
  - Most admissible heuristics are consistent, especially if they come from relaxed problems

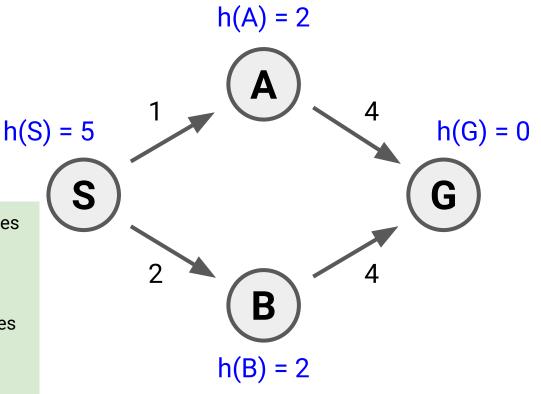
#### NOT consistent



### **Heuristics: Practice Question**

- Is h(n) admissible?
- Is h(n) consistent?

- Admissible: heuristic always underestimates
  (≤) true cost
  - $\circ$   $\forall$  n,  $0 \le h(n) \le h^*(n)$
- Consistent: heuristic always underestimates all arc costs
  - $\circ$   $\forall$  a, c, h(a) h(c)  $\leq$  cost(a, c)



### A\* Search

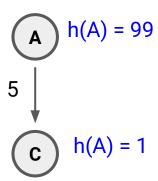
- A\* Search: A (good!) search algorithm
  - Uniform Cost Search is good. It uses a priority queue for the fringe where p(n) = g(n)
    where g(n) is the backwards cost or path cost (total cost to get to node n)
  - A\* Search is similar to Uniform Cost Search, but adds a heuristic term to the priorities.
    p(n) = g(n) + h(n)
  - A\* tree search is optimal with any admissible heuristic
  - A\* graph search (won't visit the same node twice) is only optimal with a consistent heuristic

# Worksheet

### **Summary**

- Heuristic: Estimate of cost to get from node n to goal state h(n)
- Admissible: heuristic always underestimates (≤) true cost
  - $\circ$   $\forall$  n,  $0 \le h(n) \le h^*(n)$
  - h\*(n) is the true best cost to get from n to goal
- Consistent: heuristic always underestimates all arc costs
  - $\circ$   $\forall$  a, c, h(a) h(c)  $\leq$  cost(a, c)
  - Consistency is stronger than admissibility
  - Consistency implies admissibility, but not the other way around

#### NOT consistent



- A\* Search: A (good!) search algorithm
  - A\* Search is similar to Uniform Cost
    Search, but adds a heuristic term to the priorities.

$$p(n) = g(n) + h(n)$$

- A\* tree search is optimal with any admissible heuristic
- A\* graph search (won't visit the same node twice) is only optimal with a consistent heuristic

## Thank you for attending!

#### Attendance link:

https://tinyurl.com/cs188fa23

Week No: 2

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