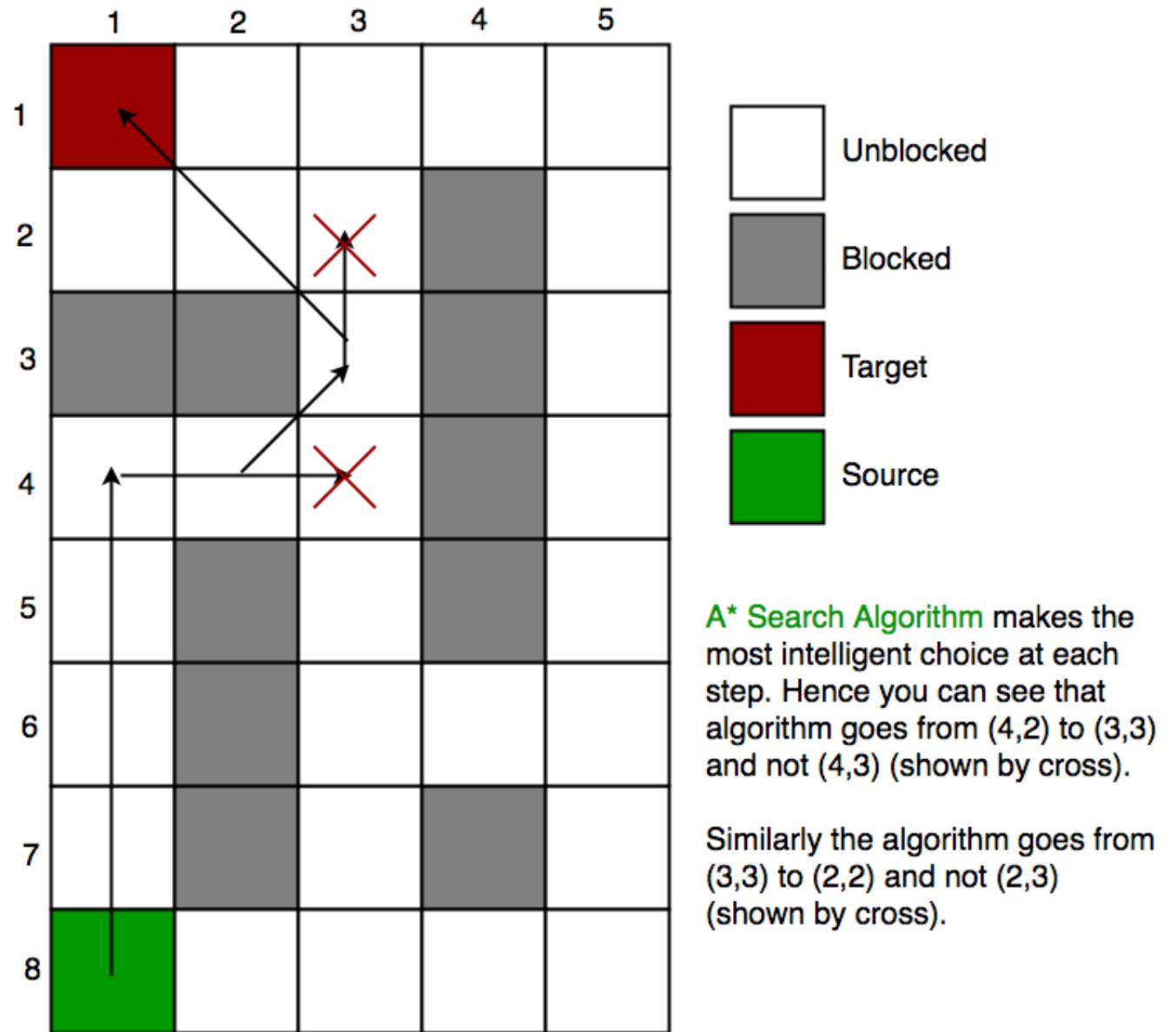


# CSCI 3202: Intro to Artificial Intelligence

## Lecture 7: A\* Search and Heuristics

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## **Review: Uniform-cost Search (UCS)**

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- Expand out in contours, where least cost dictates which nodes we explore.
- Eventually, we will find a path to the goal - but the search is not directed

# Search Algorithms

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- ❖ Search algorithms are fundamentally the same except for their frontier strategies.

**Uninformed Search:** e.g. Uniform Cost Search

- the good: UCS is complete and optimal → if a solution exists, it will find it with the least cost path
- the bad: explores in every direction

**Informed Search:** include information about where the goal is

- what do we need to have? A heuristic.

**heuristic:** A function that estimates how close a state is to a goal.

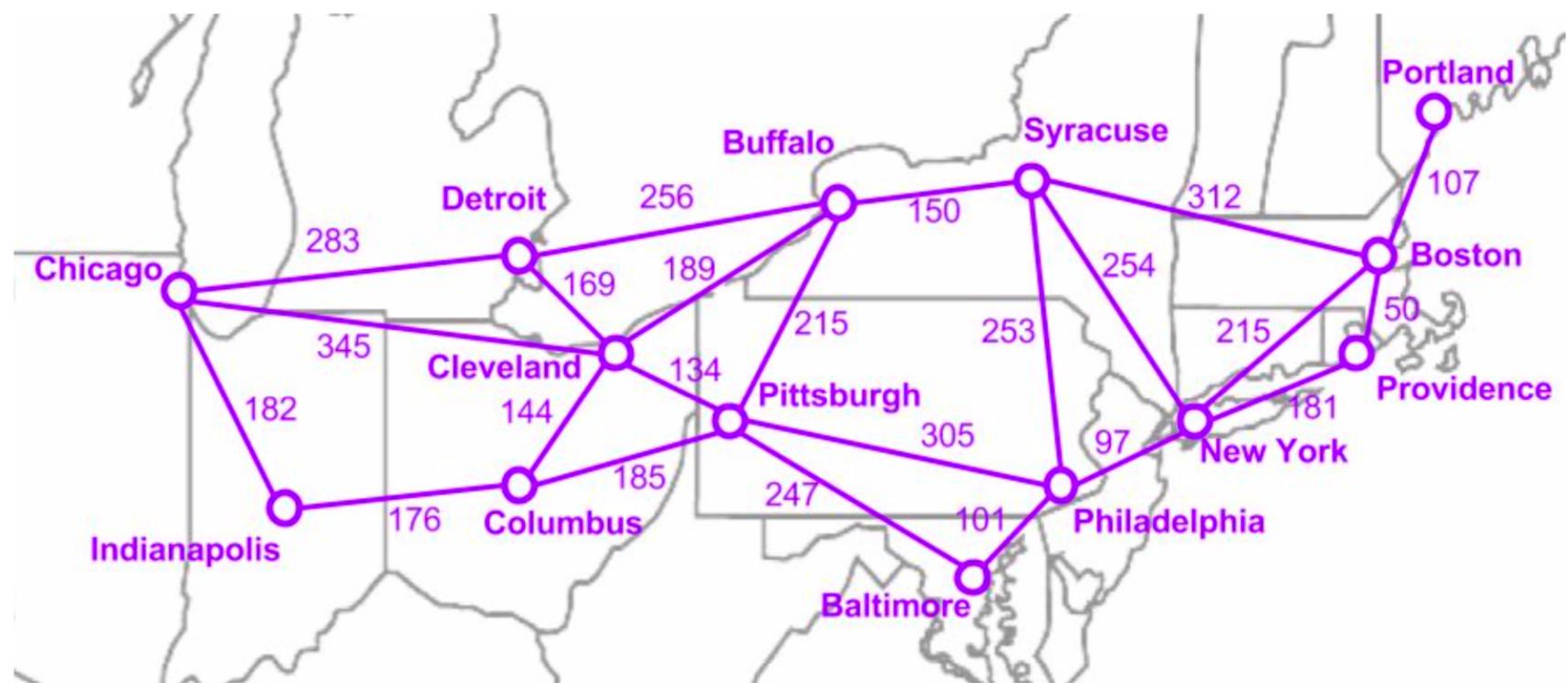
# Greedy best-first search

- ❖ First expand the path that's closest to the goal.

To determine what's closest to the goal, we need to define a heuristic function.

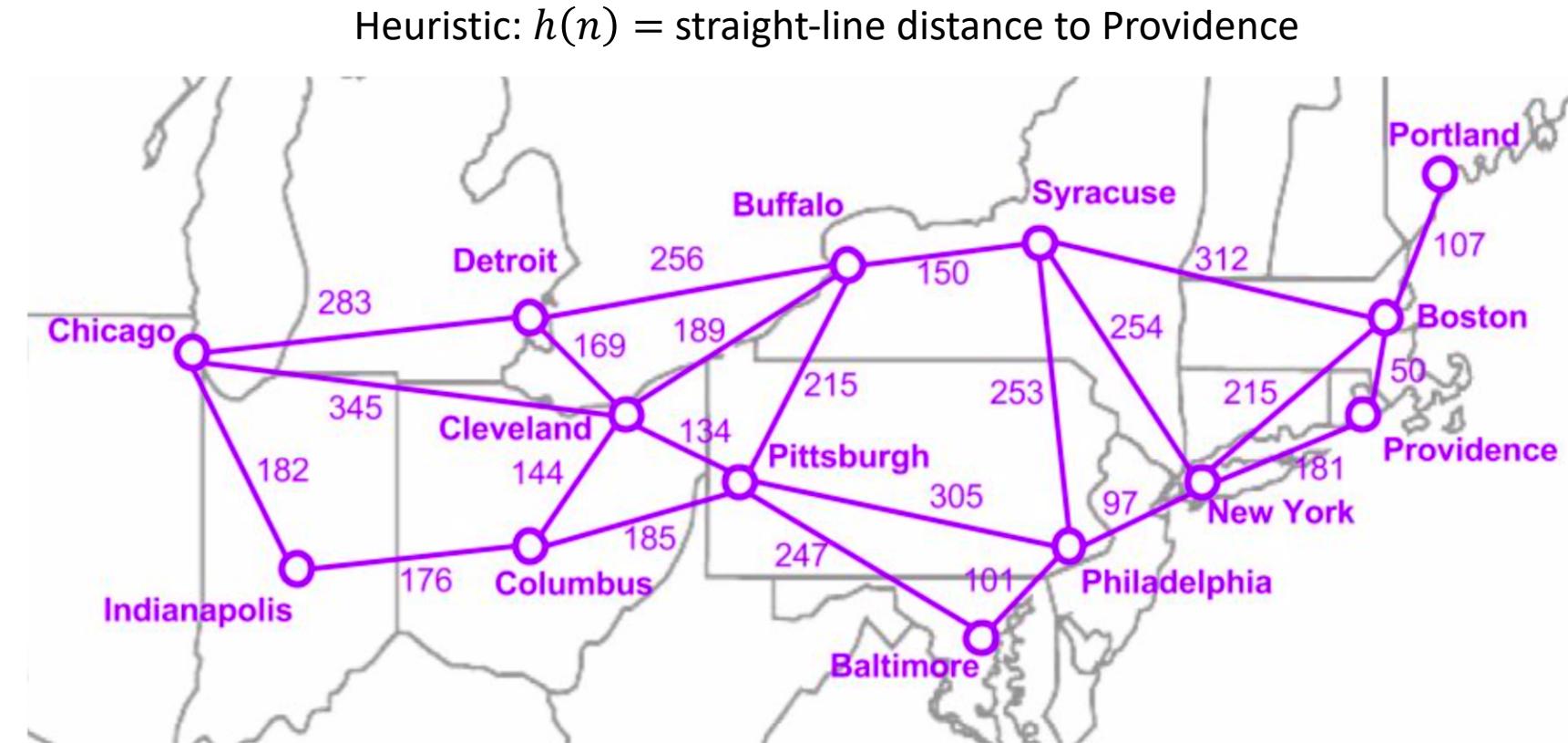
**Example:** For the traveling in the northeast problem, let's estimate the distance to the goal as the straight-line distance between city and the goal city.

Step costs: miles between cities along major highways



# Greedy best-first search

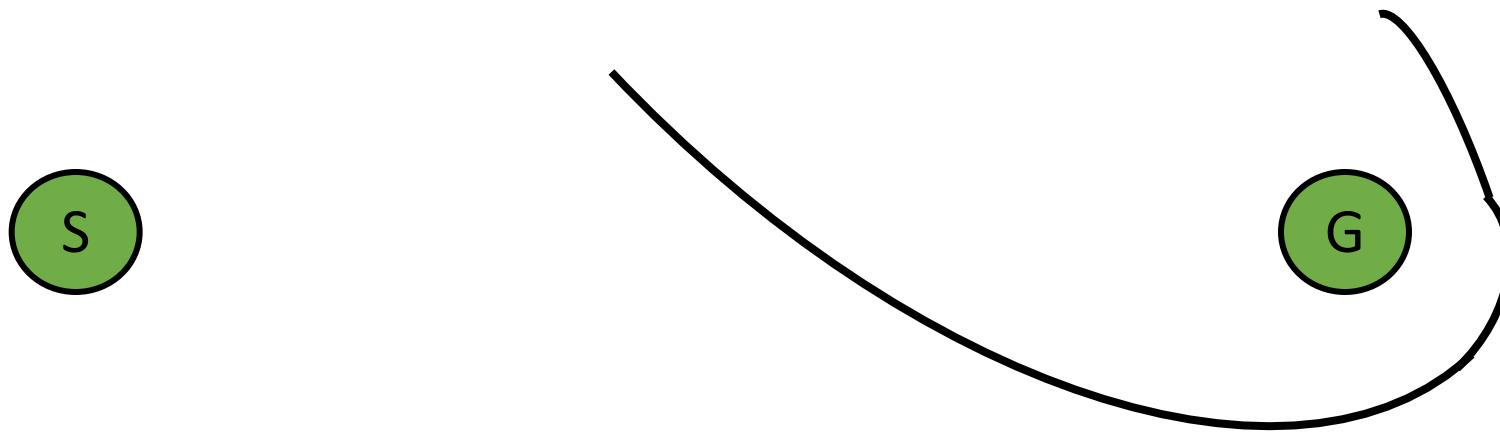
Example: Use the greedy best-first search to find a route from Chicago to Providence.



# Greedy best-first search

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Possible Issue: Won't necessarily find the optimal path



# A\* Search

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**Uniform-cost search:**

$$f(n) = g(n) \quad (\text{cost to get to } n)$$

**Greedy:**

$$f(n) = h(n) \quad (\text{estimated cost to get from } n \text{ to goal})$$

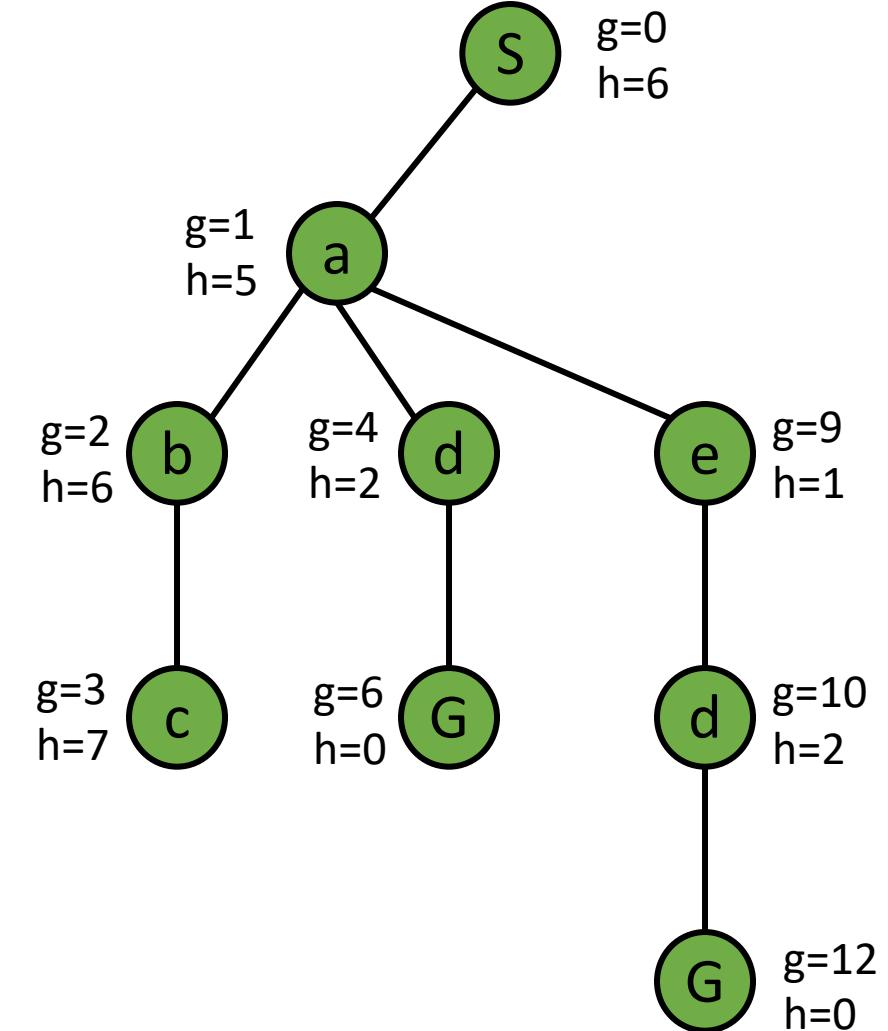
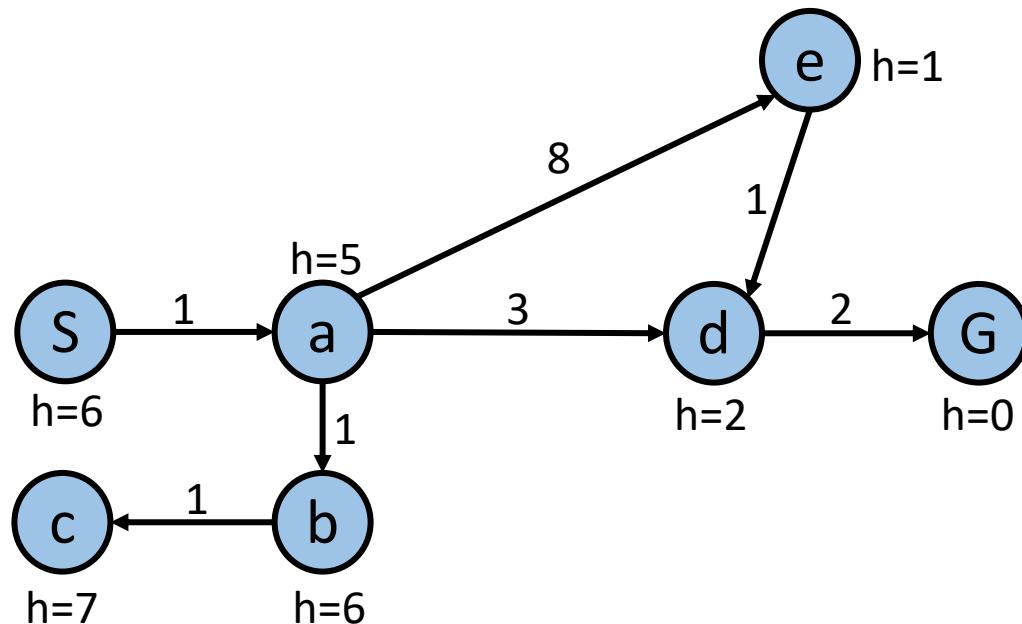
**A\*:**

$$f(n) = g(n) + h(n) \quad (\text{estimated total cost of cheapest solution through } n)$$

# A\* Search

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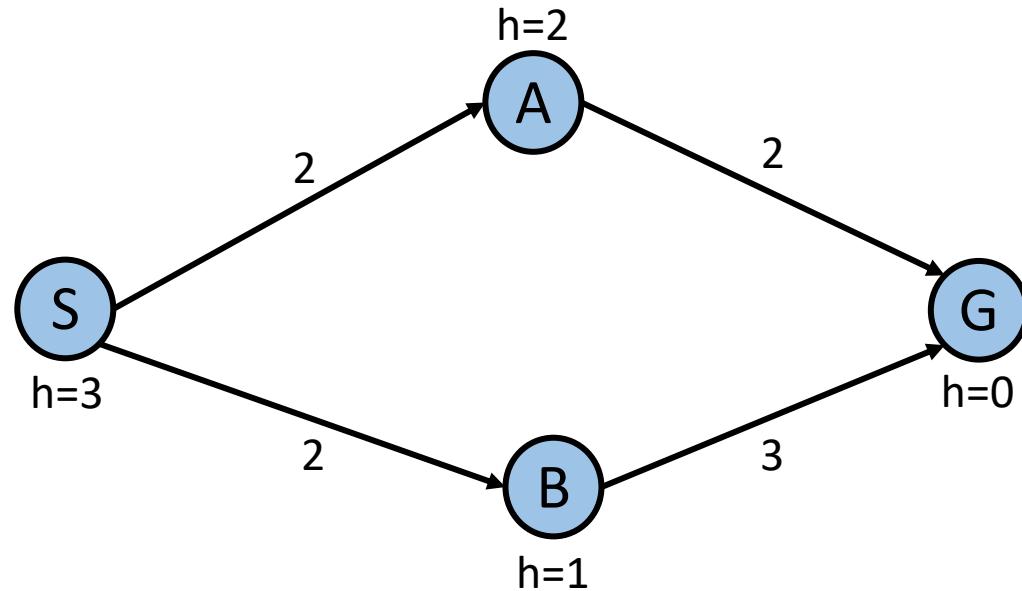
Example: Compare Uniform Cost, Greedy Search, and A\* on the graph below.



# A\* Search

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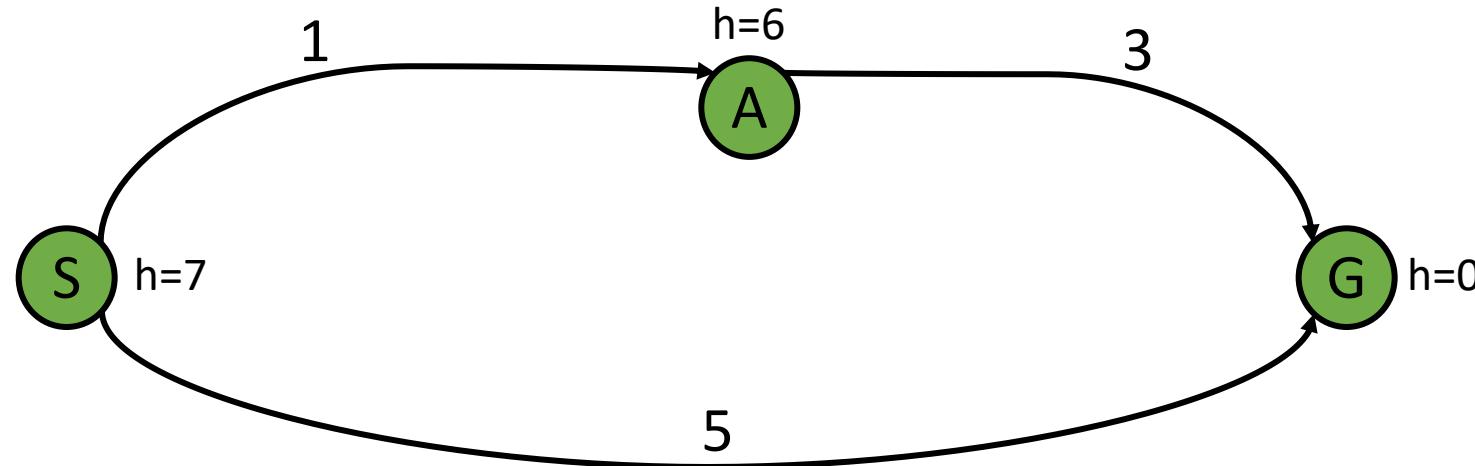
Example: When should A\* search terminate?



# A\* Search

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Is A\* optimal?



# A\* Search

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**Consistent:** for every node  $n$  and successor  $n'$  of  $n$ , generated by some action  $a$ , the estimated cost of reaching the goal from  $n$  is no greater than the step cost from  $n$  to  $n'$ , plus the estimated cost of reaching the goal from  $n'$

- That is:  $h(n) \leq c(n, a, n') + h(n')$
- General **triangle inequality** between  $n$ ,  $n'$ , and the goal

A heuristic  $h$  is **admissible** (optimistic) if  $0 \leq h(n) \leq h^*(n)$ , where  $h^*(n)$  is the true cost to the nearest goal.

# A\* Search

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Search only works when:

- domain is fully observable
- domain must be known
- domain must be deterministic
- domain must be static

implementation: use a **node**

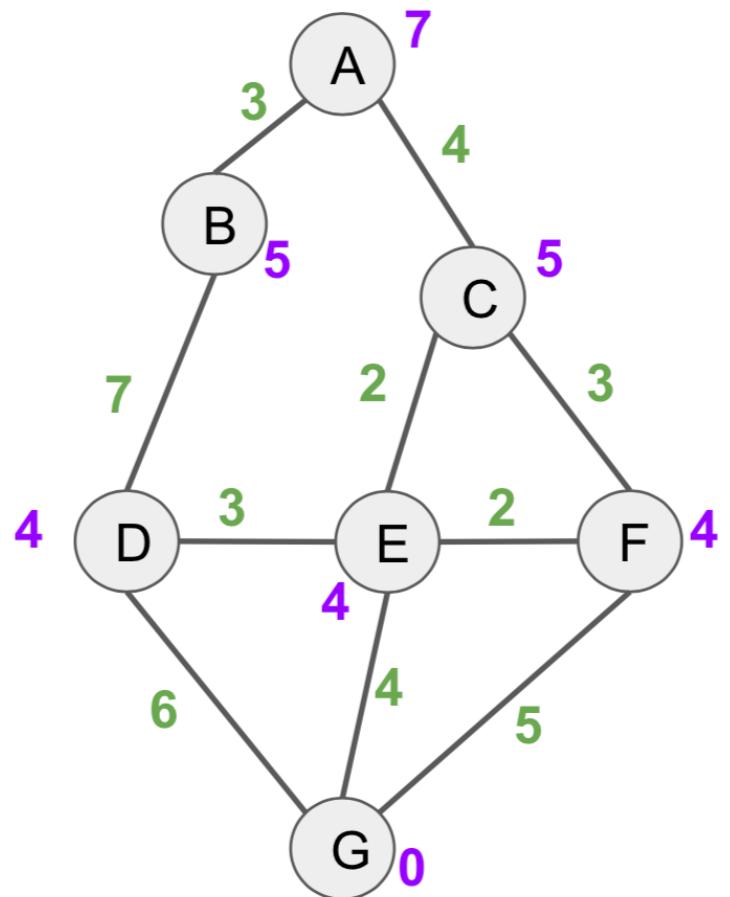
- state - indicates state at end of path
- action - action taken to get here
- cost - total cost
- parent - pointer to another node

# A\* Search

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## A\* Search:

- Find the cheapest path from A to G
- $h(n)$  values are given in purple
- Step costs are given in green

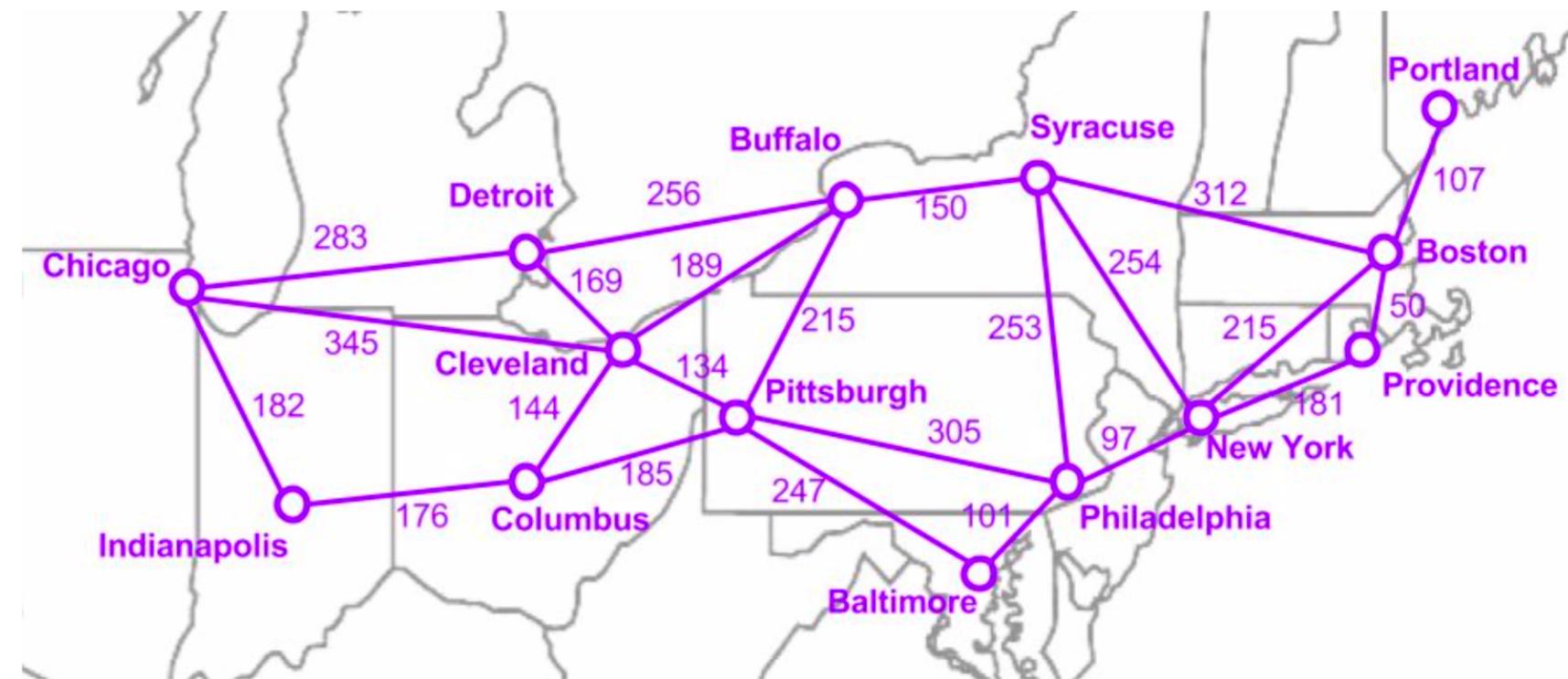


# A\* Search

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Example: Use A\* search to find a route from Chicago to Providence.

$h(n)$  = straight-line distance to Providence  
 $g(n)$  = Path cost so far



# A\* Search

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**Any consistent heuristic is also admissible (but not the other way around).**

**Example:** Prove the above statement by induction.

## Next Time

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Optimality and Variants of A\*