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# Artificial Intelligence: State Space Search } part 3 Informed Search Greedy Best First Search and } video #5 Algorithms A and A\*

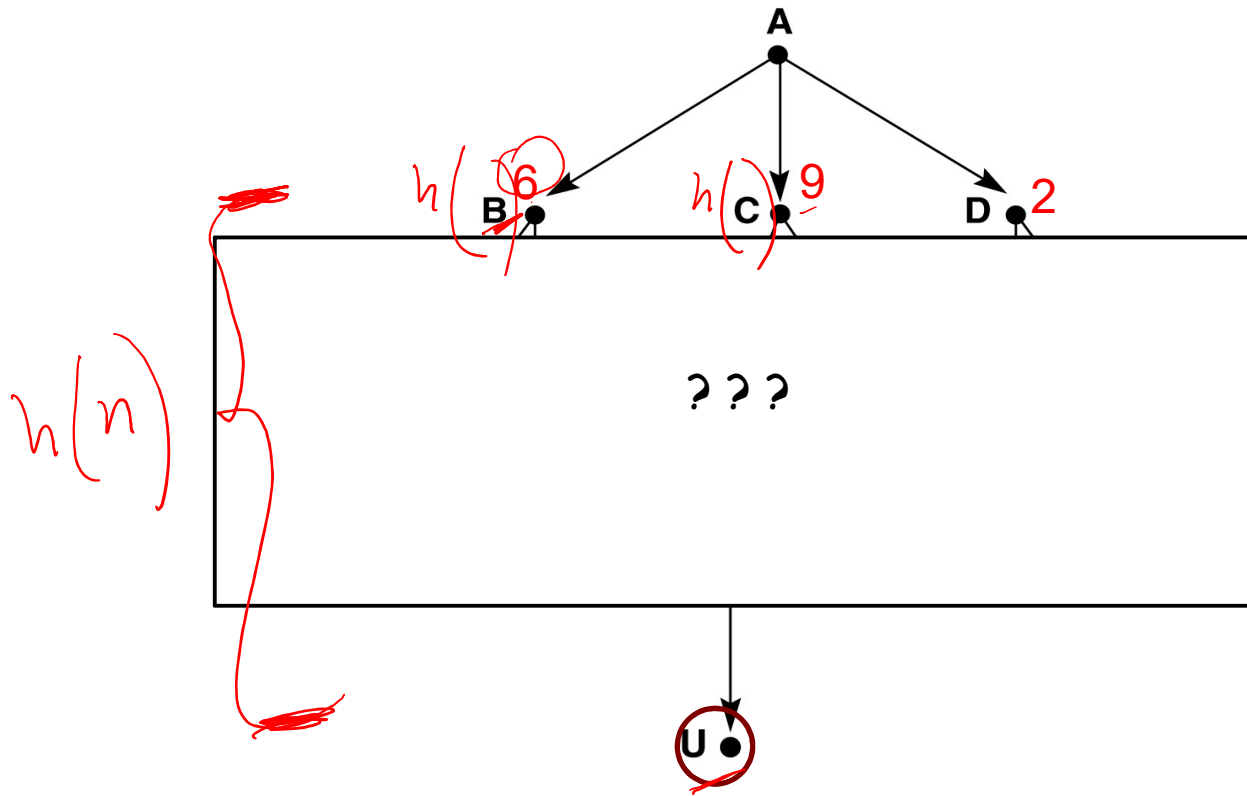
- Russell & Norvig - Sections 3.5.1, 3.5.2, 4.1.1

# Today

1. State Space Representation
2. State Space Search
  - a) Overview
  - b) Uninformed search
    1. Breadth-first Search and Depth-first Search
    2. Depth-limited Search
    3. Iterative Deepening
    4. Uniform Cost
  - c) Informed search
    1. Intro to Heuristics
    2. Hill climbing
    3. Greedy Best-First Search ✓
    4. Algorithms A & A\*
    5. More on Heuristics
  - d) Summary



# $h(n)$



- $h(n)$  = estimate of the lowest cost from  $n$  to goal

# Greedy Best-First Search

- problem with hill-climbing:
  - no open list
  - --> can't backtrack
  - one move is selected and all others are forgotten
- solution to hill-climbing:
  - use "open" as a priority queue  $h(n)$ .
  - this is called best-first search
- Best-first search:
  - Insert nodes in open list so that the nodes are sorted in ascending  $h(n)$  常规BFS是一层随机push进queue里，这里的BEST-FIRST SEARCH  $h(n)$ 低的先插入
  - Always choose the next node to visit to be the one with the best  $h(n)$  -- regardless of where it is in the search space  
*lowest*

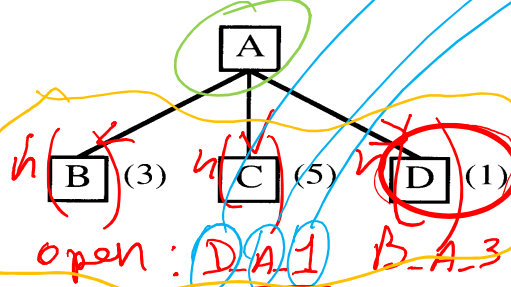
不管当前我们在那

# GBF: Example

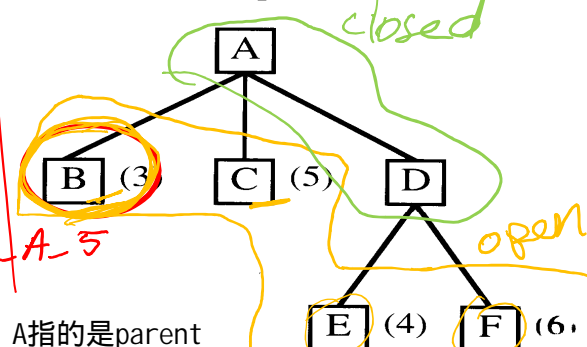
Step 1



Step 2



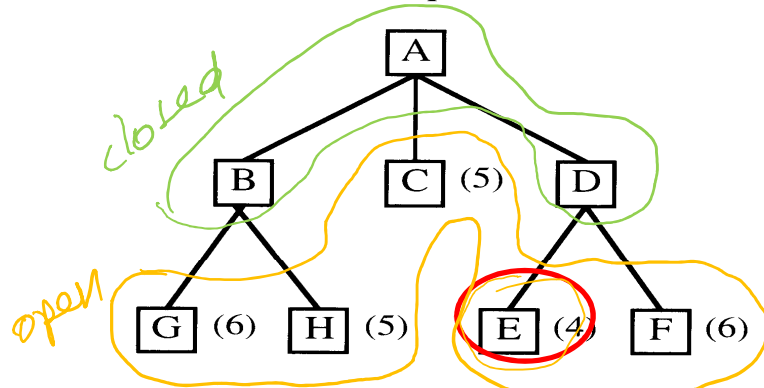
Step 3



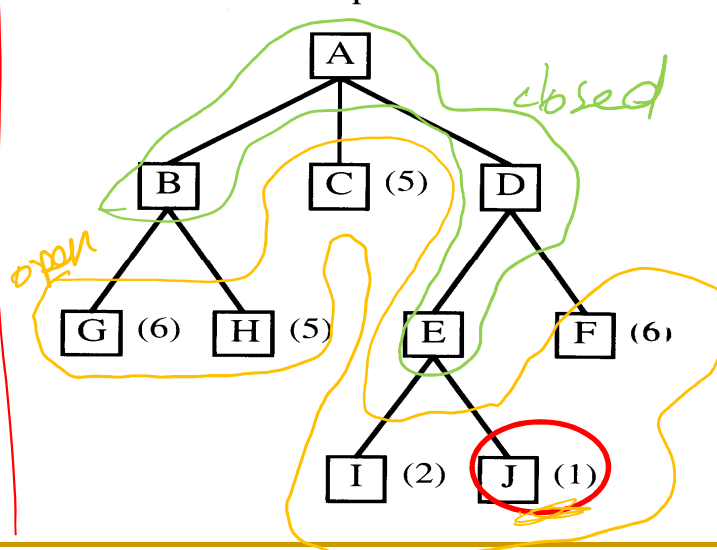
Lower  $h(n)$  is better

每次插入就会sorted

Step 4



Step 5



source: Rich & Knight, Artificial Intelligence, McGraw-Hill College 1991.

# Notes on GBF

- If you have a good  $h(n)$ , best-first can find a solution very quickly
- The solution may not be the optimal one (lowest cost) but there is a good chance of finding it quickly

只要你有一个好的 $h(n)$ ，这个算法是很快的，但是不能保证你找到最优解

# GBF Search: Example

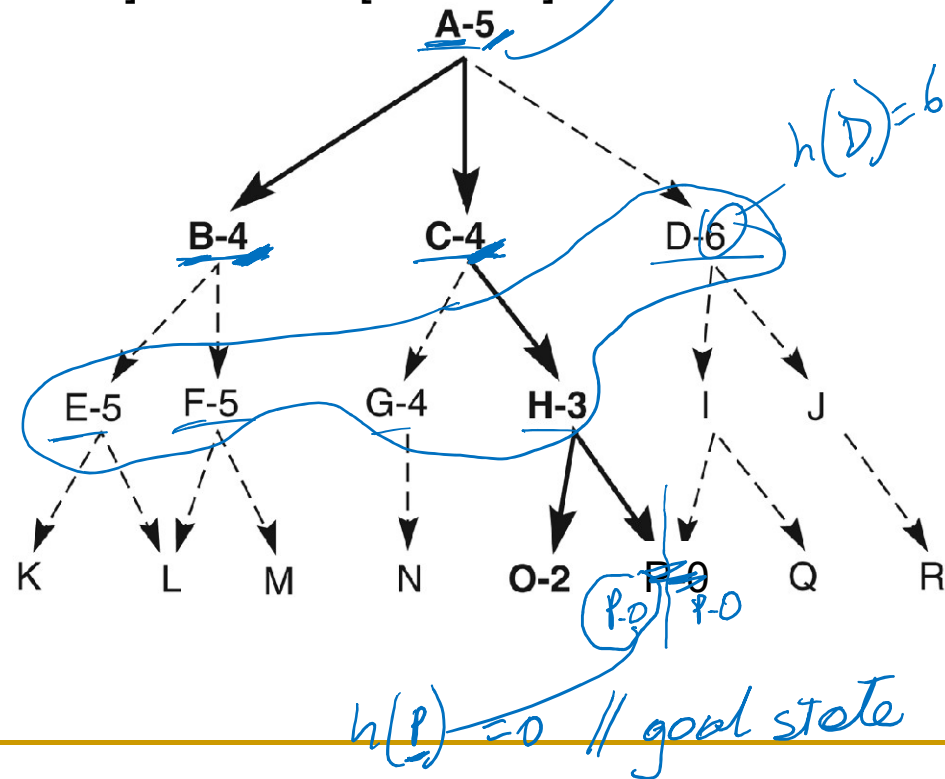


1. open = [A-null-5] closed = []
2. open = [B-A-4 C-A-4 D-A-6] (arbitrary choice) closed [A]
3. open = [C-A-4 E-B-5 F-B-5 D-A-6] closed = [B A] 用完以后就closed
4. open = [H-C-3 G-C-4 E-B-5 F-B-5 D-A-6] closed = [C B A]
5. open = [P-H-0 O-H-2 G-C-4 E-B-5 F-B-5 D-A-6] closed = [H C B A]
6. goal P found

solution path: A C H P

priority queue  
sorted by  $h(n)$

Lower  $h(n)$  is better



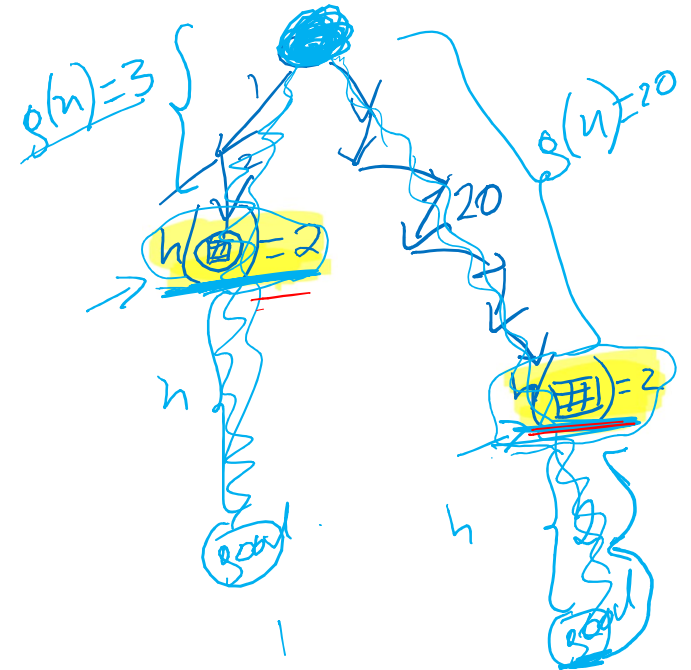
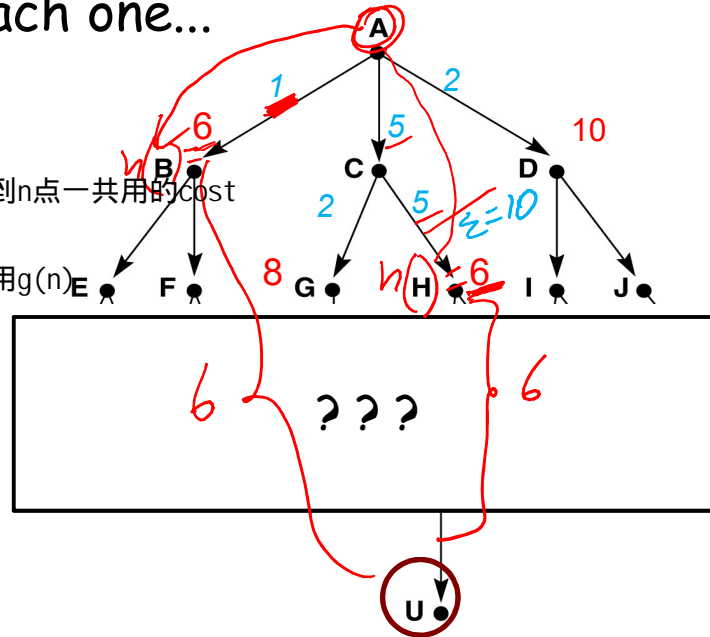
# Problem with GBF search

- if 2 nodes have the same  $h(n)$ , no preference to the closest/least costly to reach one...

GBF遇到两个相同的 $h(n)$ 的时候不知道选哪个

解决方案，记录 $g(n)$ ，是从root到n点一共用的cost  
越小越好

不是先排 $h(n)$ ，要选择的时候再用 $g(n)$   
而是单纯的加起来



## Solution:

- Maintain a cost count -  $g(n)$
- i.e. give preference to nodes with least expensive paths from root to n
- i.e. combine  $h(n)$  and  $g(n)$



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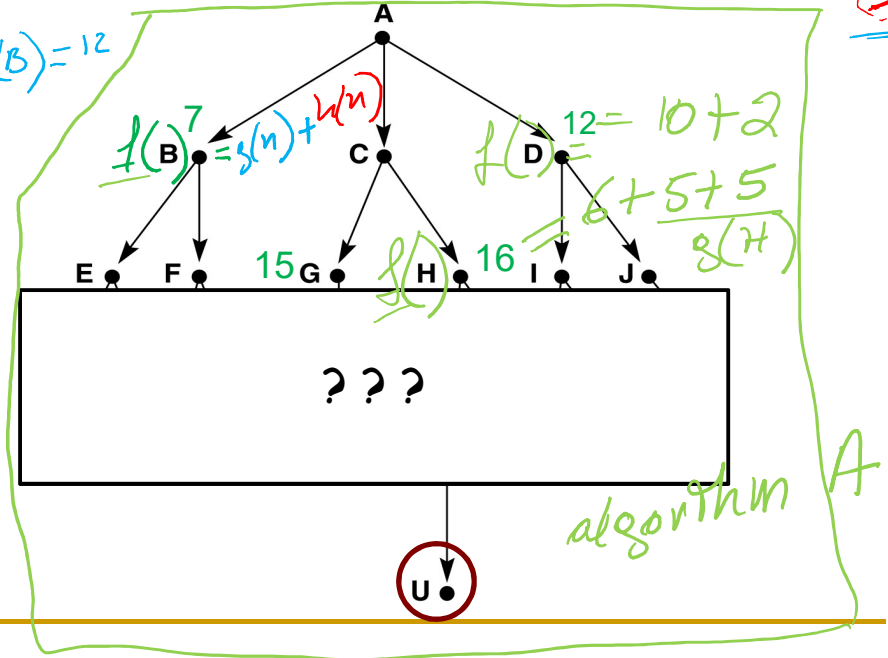
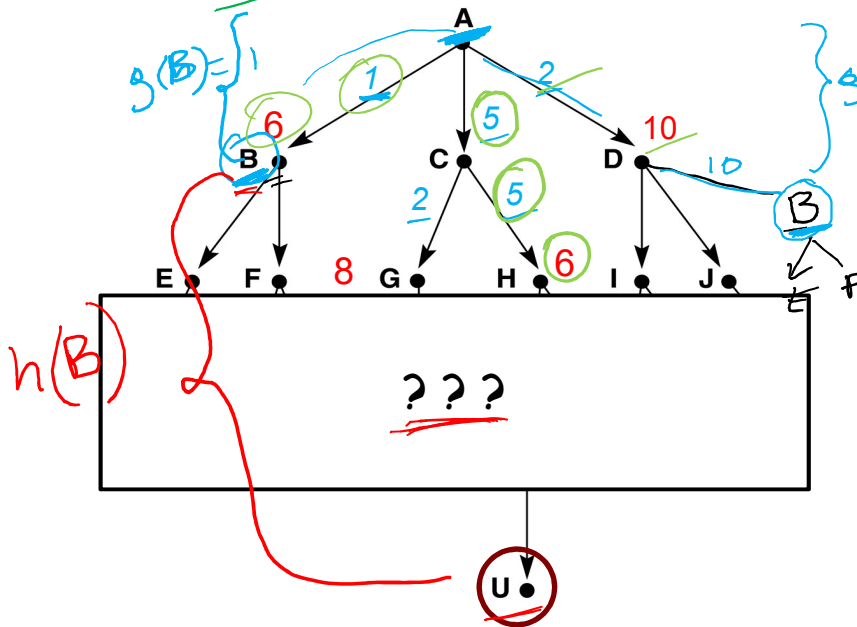


$$f(n) = h(n) + g(n)$$

- Modified evaluation function  $f$ :

$$f(n) = \underbrace{g(n)} + \underbrace{h(n)}$$

- ➔  $f(n)$  estimate of total cost along path through  $n$
- $g(n)$  actual cost of path from start to node  $n$
- $h(n)$  estimate of cost to reach goal from node  $n$



# Algorithms A and A\*

≠ ? (see next slides)

- similarly to Greedy Best first search:

- keep an OPEN list as a priority queue

- But

- OPEN is sorted by lowest  $f(n) = h(n) + g(n)$

从算法上来说，两兄弟是一种算法，都是用Open list做PQ，用fn来sort

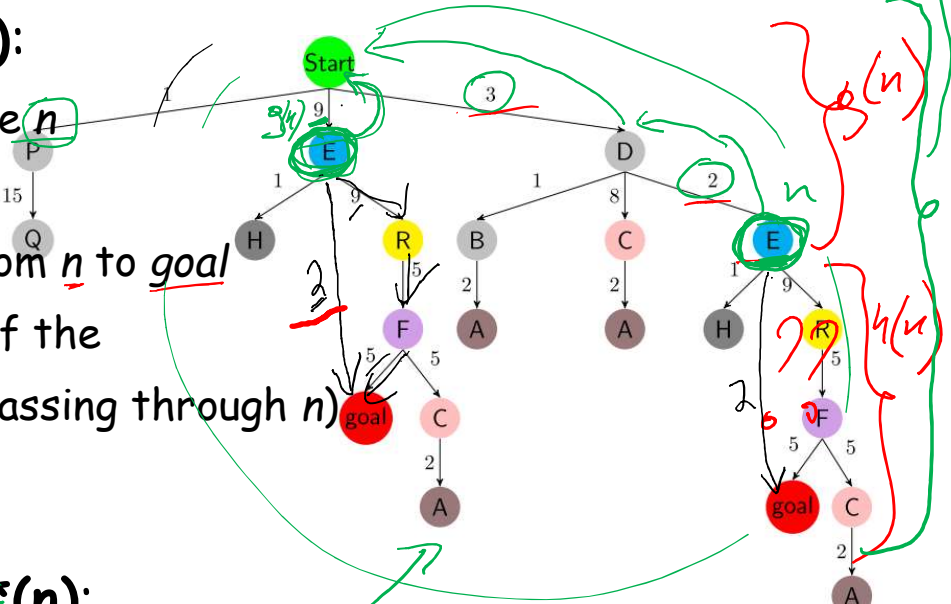
区别在于，当遇到一种特殊 $h(n)$ 时，A\*能确保最优解

# $g(n)^*$ , $h(n)^*$ and $f^*(n)$

$g(n)$

- We know that  $f(n) = g(n) + h(n)$ :

- $g(n)$  <sup>actual</sup> current cost from start to node  $n$   
(maybe not be the lowest cost)
- $h(n)$  estimate of the lowest cost from  $n$  to goal  
-->  $f(n)$  estimate of the lowest cost of the  
solution path (from start to goal passing through  $n$ )



- Let us define  $f^*(n) = g^*(n) + h^*(n)$ :

- $g^*(n)$  cost of lowest cost path from start to node  $n$
- $h^*(n)$  actual lowest cost from  $n$  to goal
- >  $f^*(n)$  actual cost of lowest cost of the solution path  
(from start to goal passing through  $n$ )

$g^*(n) = 3 + 2 = 5$

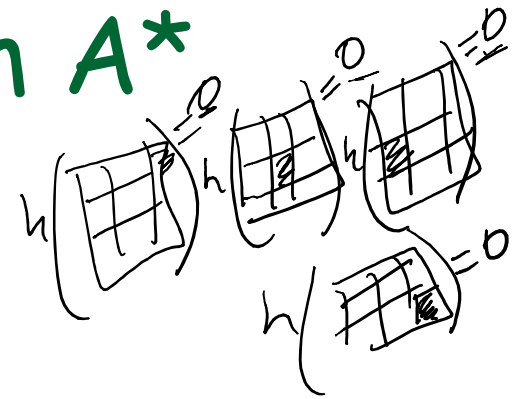
Unknown... what  $h(n)$  is trying to estimate  
Unknown, 是我们尝试estimate的值

$h^*(n)$ , 假设给了我们一个actual graph, 比如左边的E, 我们知道有一条edge=2直通goal  
有一条path=19间接通过向goal,  $h^*(n)$ 指edge=2 //现实中因为数据量大, 我们很难知道 $h^*(n)$

for ex in the graph above  
 $h^*(E) = 2$

$f^*(n)$ 追求的就是一个实际的值

# Algorithm A vs Algorithm A\*



IF

□  $g(n) \geq g^*(n) \quad \forall n$

到root的距离大于等于最短距离

// ie. if the cost from the root to  $n$  is considered

AND

□  $h(n) \leq h^*(n)$  for all  $n \quad \forall n$

永不过分估计到goal 的距离

// ie.  $h(n)$  never overestimates the true lowest cost from  $n$  to the goal

THEN

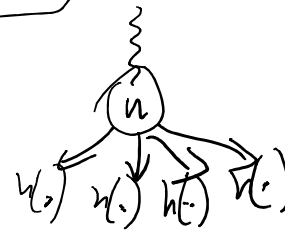
□ algorithm A is called algorithm A\*

uniform cost  
• uses  $g(n)$   
• uses  $h(n)$  where  
 $h(n) = 0 \quad \forall n$

what's the big deal?

--> algorithm A\* is admissible

可容许的, 可采纳的



--> i.e. it guarantees to find the lowest cost solution path from the initial state to the goal

uniform cost就是Uniformed哪个, 可以看做 $h(n)$ 都是0, 因此必然用不过分估计, 可以勉强看成A\*

# Algorithm $A^*$ vs GBF search

- given the same  $h(n)$ :
  - $A^*$  guarantees to find the lowest cost solution path
  - GBF does not
- so is  $A^*$  always “better” in real life?
  - not necessarily
  - computing  $g(n)$  can take time to compute
  - if client is not looking for the optimal (lowest cost) solution
  - a good-enough solution faster (i.e. GBF search) might be preferable

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*next video*

d)

**Summary**