

## Informed Searches

CHAPTER 3 CONTINUED  
COSC 370  
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SOME SLIDE CONTENT FROM RUSSELL &  
NORVIG PROVIDED SLIDES

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- Tree Search
- Greedy Best-First Search
- A\*
- Improvements to A\*

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## Tree Search

```
function TREE-SEARCH(problem, fringe) returns a solution, or failure
  fringe ← INSERT(MAKE-NODE(INITIAL-STATE(problem)), fringe)
  loop do
    if fringe is empty then return failure
    node ← REMOVE-FRONT(fringe)
    if GOAL-TEST[problem] applied to STATE(node) succeeds return node
    fringe ← INSERTALL(EXPAND(node, problem), fringe)
```

A strategy is defined by picking the **order of node expansion**

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## Strategy Evaluation

- Strategies can be evaluated based on:
  - Completeness – does it always find a solution if one exists?
  - Time it takes
  - Space it takes
  - Optimality
- For trees time and space can be evaluated in terms of branching factor ( $b$ ), depth ( $d$ ), and maximum depth of the state space ( $m$ ).

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## Informed Searches

- a.k.a Heuristic Search
- Expansion based on a function  $f(n)$  – evaluation function.
- A part of this function may be a heuristic  $h(n)$ :  
  
 $h(n)$  = estimated cost of cheapest path from  $n$  to goal
- Constant:  $h(n) = 0$  for goal state

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## Best-First Search

- Evaluation Function for each node – estimating desirability.
- Expand most desirable unexpanded node
- Implementation – use a queue! Sort by desirability.
- Specific Cases:
  - Greedy
  - A\*

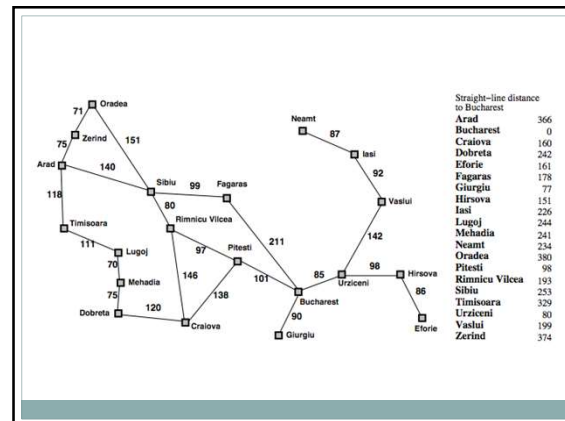
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### Greedy Best-first Search

- Greedy – expand the node that is closest to the goal.
- $f(n) = h(n)$  = estimate of cheapest path
- Example: Romanian Vacation Problem

$h_{sld}$  = Straight line distance between two cities

- Take home – Greedy expands the node that appears to be the closest to the goal.

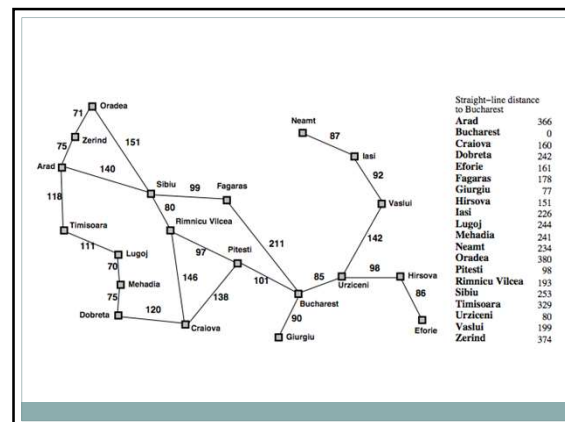


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### Analysis of Technique

- Complete – nope, can run into loops (example: take RVP with Oradea as goal)



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### Analysis of Technique

- Complete – nope, can run into loops (example: take RVP with Oradea as goal)
- Time –  $O(b^m)$ , though heuristics can improve this
- Space –  $O(b^m)$ , all states in memory
- Optimal – not necessarily

A\*

- An extension of Dijkstra's shortest path algorithm developed by Hart, Nilsson, and Raphael (SRI).
- General Idea: try not to go down the expensive paths!
- Evaluation function:

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

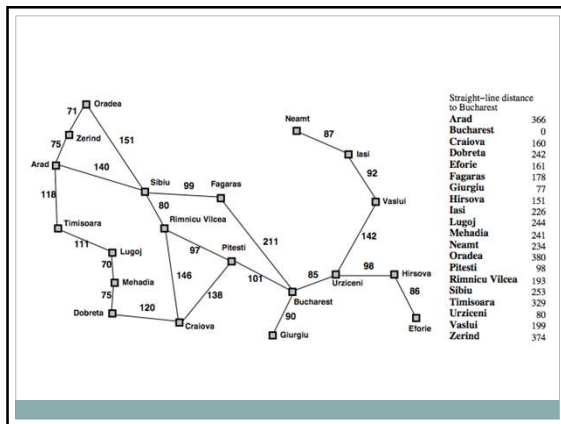
$h(n)$  = estimated cost from  $n$  to goal

$g(n)$  = cost so far to reach  $n$

- A\* uses an admissible heuristic – one that never overestimates the cost to reach the goal.

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### Exercise!

- Here's a starter 8-puzzle. How would A\* solve this puzzle? What's the heuristic?

4	3	7
2		1
5	6	8

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### Two More Heuristic Problems

- You're given a maze with one entry and one exit. Possible moves are cardinal directions only. What's the heuristic?
- 9x9 sudoku solver. What's the heuristic?

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### Analysis of Technique

- Complete – yes, assuming finite number of states
- Time – potentially exponential – why so long?
  - while efficient and optimal, the number of potential states (think: paths) that have to be expanded/searched is still exponential.
- Space –  $O(b^m)$ , all states in memory
- Optimal – yes!

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### Some additional terminology

- Dominance – assuming that we have admissible heuristics, if  $h_2(n) \geq h_1(n)$  for any node  $n$ , then  $h_2(n)$  dominates  $h_1(n)$  and is "better".
- Consistency (aka monotonicity) – a heuristic is consistent if, for every node  $n$  and every successor  $n'$  of  $n$  generated by any action  $a$ , the estimated cost of reaching the goal from  $n$  is no greater than the step cost of getting to  $n'$  plus the estimated cost of reaching the goal from  $n'$ .
- Relaxed problems

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### Memory-bounded Heuristic

- One issue with A\* – memory usage!
- Briefly – Iterative-Deepening A\* (IDA\*)
  - Iterative Deepening Search (see last set of slides)
  - Cutoff used –  $f(n)$  rather than the depth
- Recursive best-first search (RBFS) – simple recursive algorithm for BFS in linear space.
- Memory-Bounded A\* (MA\*) & Simplified MA\* (SMA\*) – A\* until memory is full, then expand by dropping the "worst" leaf node.

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