

IS-ZC444: ARTIFICIAL INTELLIGENCE

Lecture-04: Problem Solving by Search (contd..)



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Recap

AI problem can be formulated using five components

- 1 The **initial state**
- 2 Set of **actions**
- 3 **Transition model**
- 4 **Goal test**
- 5 **Path cost**

*A goal-based agent, called **problem-solving agent** is deployed that uses state (cumulative) of the world to search for the solution.*

- Problems: Vacuum Cleaner, 8-Puzzle, Knuth conjuncture, Route finding, Touring problem: visit each city, TSP: touring with single visit of cities, VLSI layout, Robot navigation, Automatic assembly sequencing
- Searching for Solution (search tree): DFS, BFS

Search

Uninformed or **blind** search:

strategies have no additional information about the state beyond what is provided in the problem definition

- BFS: breadth first search generates $O(b^d)$ nodes for evaluation where b is branching factor and d is depth of the tree
- DFS: same number of nodes but order of evaluation is different (frontier is *stack*^a)

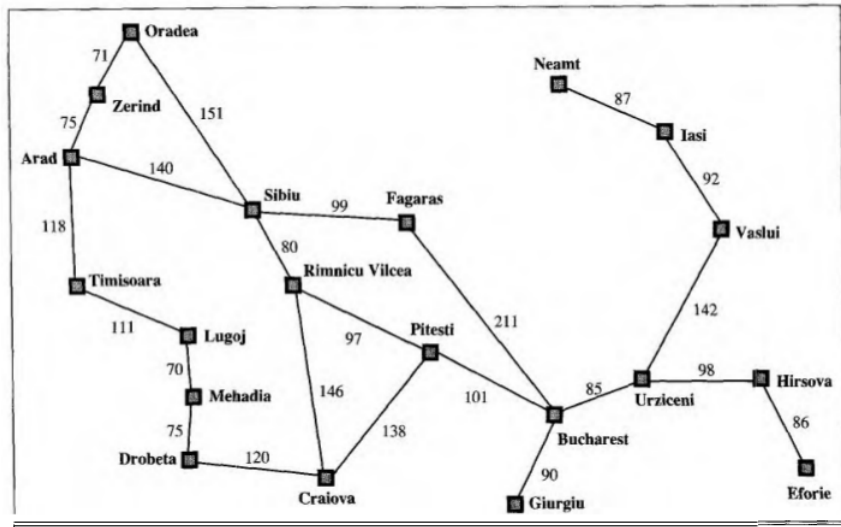
^aBFS uses *queue*

Informed or **heuristic** search:

strategies know which non-goal state is more promising than other

Memory requirement and time taken is a major factor

Map of Romania



[3] Uniform-cost Search

Let's not use *stack* or *queue* as frontier

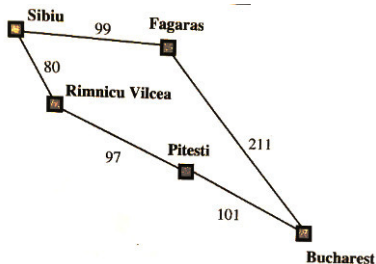
- instead use a list, that is **sorted** by using a *path cost* function $g(n)$, where n is a node in the list

Also

- Goal test is applied to a node when it is selected for expansion
- Value of $g(n)$ is updated if a better path is explored

```
function UNIFORM-COST-SEARCH(problem) returns a solution, or failure
  node  $\leftarrow$  a node with STATE = problem.INITIAL-STATE, PATH-COST = 0
  frontier  $\leftarrow$  a priority queue ordered by PATH-COST, with node as the only element
  explored  $\leftarrow$  an empty set
  loop do
    if EMPTY?(frontier) then return failure
    node  $\leftarrow$  POP(frontier) /* chooses the lowest-cost node in frontier */
    if problem.GOAL-TEST(node.STATE) then return SOLUTION(node)
    add node.STATE to explored
    for each action in problem.ACTIONS(node.STATE) do
      child  $\leftarrow$  CHILD-NODE(problem, node, action)
      if child.STATE is not in explored or frontier then
        frontier  $\leftarrow$  INSERT(child, frontier)
      else if child.STATE is in frontier with higher PATH-COST then
        replace that frontier node with child
```

[3] Uniform-cost Search



- To go from Sibiu to Bucharest, successors are Vilcea and Fagaras (cost 80 and 99).
- Least cost node Vilcea is expanded the adds Pitesti (cost $80+97=177$).
- Least node is now Fagaras so it is expanded to add Bucharest (cost $99+211=310$)

However goal node is generated but, algorithm would go on expanding Pitesti that again adds/modifies Bucharest, with cost $80+97+101=278$.

In general, uniform-cost search is optimal

Space/time complexity $O(b^{1+\lfloor C^*/\epsilon \rfloor})$ where C^* is cost of optimal solution and ϵ is the least cost of each action

[4] Depth-limited Search

In DFS, do not go beyond the depth-limit ℓ

Time and space complexities would be $O(b^\ell)$ and $O(b\ell)$

- Idea is that going beyond **diameter** is not needed

```
function DEPTH-LIMITED-SEARCH(problem, limit) returns a solution, or failure/cutoff
  return RECURSIVE-DLS(MAKE-NODE(problem.INITIAL-STATE), problem, limit)

function RECURSIVE-DLS(node, problem, limit) returns a solution, or failure/cutoff
  if problem.GOAL-TEST(node.STATE) then return SOLUTION(node)
  else if limit = 0 then return cutoff
  else
    cutoff_occurred?  $\leftarrow$  false
    for each action in problem.ACTIONS(node.STATE) do
      child  $\leftarrow$  CHILD-NODE(problem, node, action)
      result  $\leftarrow$  RECURSIVE-DLS(child, problem, limit - 1)
      if result = cutoff then cutoff_occurred?  $\leftarrow$  true
      else if result  $\neq$  failure then return result
    if cutoff_occurred? then return cutoff else return failure
```

[5] Iterative Deepening Depth-first Search

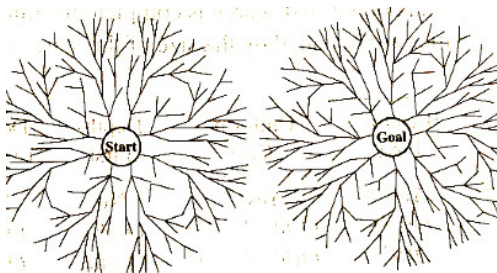
It is a general strategy that applies *Depth-limited Search* multiple number of times (gradually increasing depth-limit ℓ). First 0, then 1 then 2 and so on.... until the goal is found

- Memory requirement is $O(bd)$
- Iterative generation of same states seem wasteful but it is not as most of the nodes are at leaf (try hybrid if needed)
- Time complexity is $O(b^d)$

```
function ITERATIVE-DEEPENING-SEARCH(problem) returns a solution, or failure
  for depth = 0 to  $\infty$  do
    result  $\leftarrow$  DEPTH-LIMITED-SEARCH(problem, depth)
    if result  $\neq$  cutoff then return result
```


[6] Bidirectional Search

Can we run two search? one in forward and another in backward. In a hope that they would meet in middle.



- Expected search time is $b^{d/2} + b^{d/2}$ that is much less than b^d

If a problem has solution at depth 6, and each direction runs BFS, and the search meets at depth 3. For $b=10$, total nodes generated is 2220 as compared to 1111110 for standard BFS.

Comparing uniformed search strategies

Criterion	BFS	Uniform Cost	DFS	Depth Limited	Iterative Deepening	Bidirectional
Complete?	Y	Y	N ¹	N	Y	Y
Time	$O(b^d)$	$O(b^{1+\lceil C^*/\epsilon \rceil})$	$O(b^m)$	$O(b^\ell)$	$O(b^d)$	$O(b^{d/2})$
Space	$O(b^d)$	$O(b^{1+\lceil C^*/\epsilon \rceil})$	$O(bm)$	$O(b\ell)$	$O(bd)$	$O(b^{d/2})$
Optimal?	Y	Y	N	N	Y	Y

Let

- b : branching factor, d : depth of shallowest solution, m : depth of search tree
- A **complete** strategy finds a solution if it is there

¹if depth is infinite

Informed Search: [7] Greedy best-first Search

For expansion, nodes are selected on an **evaluation function** $f(n)$

- A **heuristic function** $h(n)$ takes a node as input and its output depends only on the state of the node. (cheapest path)
- Heuristic function provides additional knowledge, $h(n) = 0$ for goal

Greedy best-first Search

expands the node closest to goal.

For example let straight-line-distance (SLD) to Bucharest is known.

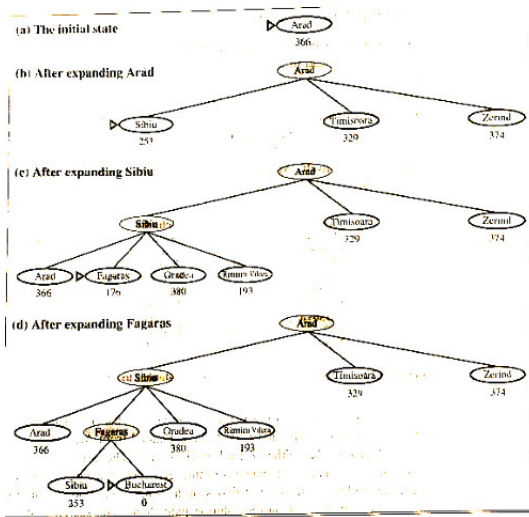
Arad=366, Mehadia=241, Bhcharest=0, Neamt=234, Craiova=160, Drobeta=242, Eforie=161, Fagaras=176, Giurgiu=77, Hirsova=151, Iasi=226, Lugoj=244, Oradea=380, Pitesti=100, Rimnicu Vilcea=193, Sibiu=253, Timisoara=329, Urziceni=80, Vaslui=199, Zerind=374

- We can use SLD to consider nodes for expansion. However, it may not be optimal ².

²Consider getting from Iasi to Fagaras. The heuristic suggests that Neamt be expanded first because it is closest to Fagaras, but it is a dead end.

Greedy best-first Search

Arad=366, Mehadia=241, Bhcharest=0, Neamt=234, Craiova=160, Drobeta=242, Eforie=161, Fagaras=176, Giurgiu=77, Hirsova=151, Iasi=226, Lugoj=244, Oradea=380, Pitesti=100, Rimnicu Vilcea=193, Sibiu=253, Timisoara=329, Urziceni=80, Vaslui=199, Zerind=374



A* Search (A star)

Use both, path-cost and heuristic

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

- A* is both optimal and complete
- It expands nodes in order of increasing f value
- No other optimal algorithm is guaranteed to expand fewer nodes than A*

A* Search (A star)

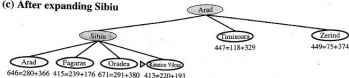
(a) The initial state



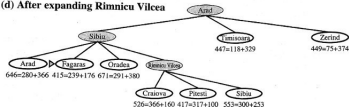
(b) After expanding Arad



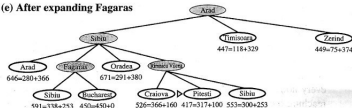
(c) After expanding Sibiu



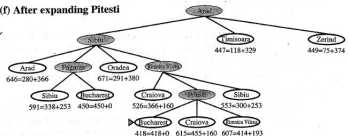
(d) After expanding Rimnicu Vilcea



(e) After expanding Fagaras



(f) After expanding Pitesti



Thank You!

Thank you very much for your attention!

Queries ?

(Reference³)

³Book - *AIMA*, ch-03, Russell and Norvig.