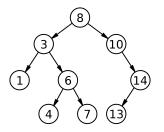
### Week 20: Search II

Martha Lewis (based on slides from Raul Santos Rodriguez)

### Summary

Objective: find the minimum cost path from  $\underline{s_{start}}$  to an  $\underline{s}$  satisfying Goal(s) = TRUE.



Tree search: Backtracking, BFS, DFS, DFS-ID

#### Outline

Search or how to find a sequence of actions that achieves a goal when no single action will do. We will cover

- Uniform Cost Search
- Informed vs Uninformed search
- Greedy search

#### Breadth First vs Uniform Cost Search

When all step costs are equal, breadth-first search is optimal because it always expands the shallowest unexpanded node...

...what if the costs are not equal?

Instead of expanding the shallowest node, uniform-cost search expands the node n with the lowest path cost g(n).

UCS maintains a queue of nodes, ordered by lowest path cost.

State: summary of past actions sufficient to choose future actions optimally

path cost

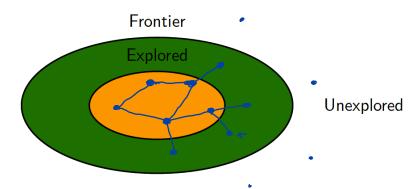
### Breadth First vs Uniform Cost Search

#### Two main differences:

- The goal test is applied to a node when it is selected for expansion rather than when it is first generated: the first goal node that is generated may be on a suboptimal path.
- A test is added in case a better path is found to a node currently on the frontier.

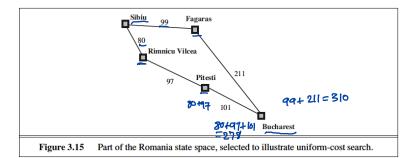
Assumption: all action costs are non-negative

## Algorithm: intuition

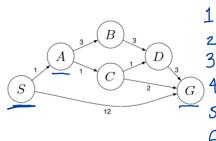


- **Explored**: states we've found the optimal path to
- Frontier: states we've seen, still figuring out how to get there cheaply
- Unexplored: states we haven't seen

# UCS: travel from city 1 to city n



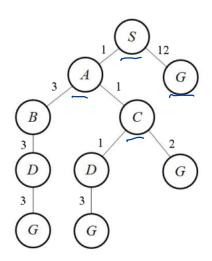
## UCS: example



## Initialise 3:0

1 SA:1, SG:12 2 SAC:2, SAB:4, SG:12 3 SACD:3, SAB:4, SACG:4, SG:12 4 SAB:4, SACG:4, SACD:6, SG:12 5 SACG:4, SACD:6, SABD:7, SG:12 6 Return path SACG

# UCS: example



## UCS algorithm

### Algorithm

```
Add s<sub>start</sub> to frontier (priority queue)
```

Repeat until frontier is empty:

Remove s with smallest priority p from frontier

If Goal(s): return solution

Add s to explored

For each action  $a \in Actions(s)$ :

Get successor  $s' \leftarrow Succ(s, a)$ 

If s' already in explored : continue

**Else** update frontier with s' and priority p + Cost(s, a)

### Analysis of uniform cost search

- UCS is optimal
- UCS does not care about the number of steps a path has, but only about their total cost: infinite loops!
- Completeness is guaranteed if  $c_{ij} \ge \epsilon \ \forall x, y$  for some small constant  $\epsilon > 0$
- When all step costs are the same, UCS is similar to BFS, except that BFS stops as soon as it generates a goal, whereas UCS examines all the nodes at the goal's depth to see if one has a lower cost.

### Summary

- Tree search: memory efficient, suitable for huge state spaces (to the extent anything works)
- State: summary of past actions sufficient to choose future actions optimally
- Graph search: uniform cost search constructs optimal paths

### Question

Suppose we want to travel from city 1 to city n (going only forward) and back to city 1 (only going backward). It costs  $\underline{c_{ij}} \geq 0$  to go from i to j. Which of the following algorithms will find the minimum cost path (select all that apply)?

#### Question

- Depth-first search
- Breadth-first search
- Uniform cost search

### Uniformed vs Informed

### Uninformed search strategies

- Uninformed search strategies use no information about the likely direction of the goal node(s)
- Uninformed search methods: Breadth-first, depth-first, depth-limited, uniform-cost, depth-first iterative deepening,...

### Informed search strategies

- Also known as *heuristic search*, informed search strategies use information about the domain to (try to) head in the direction of the goal node(s)
- Informed search methods: Hill climbing, best-first, greedy search, beam search, A, A\*...

### Informed search

Goal make UCS faster

Problem UCS orders states by cost from  $s_{start}$  to  $\underline{s}$ 

Idea take into account cost from s to  $s_{goal}$ 

Best-first node n is selected for expansion based on an evaluation function  $\underline{f(n)}$ 

#### Heuristics

#### Definition

A heuristic h(n) is the estimated cost of the cheapest path from the state at node n to a goal state.

- Unlike g(n), it depends only on the state at that node
- Encode additional knowledge of the problem
- Arbitrary and nonnegative
- Constraint: if n is a goal node, then h(n) = 0

## Greedy best-first search

A best-first search that uses h to select the next node to expand: greedy search.

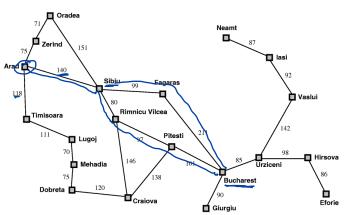
### Greedy search

$$f(n) = h(n)$$

Is greedy search

- complete? NO (be careful with loops)
- optimal? NO

### Greedy best-first search: example



| Straight-line distance<br>to Bucharest |     |
|--|-----|
|  |     |
| Arad                                   | 366 |
| Bucharest                              | 0   |
| Craiova                                | 160 |
| Dobreta                                | 242 |
| Eforie                                 | 161 |
| Fagaras                                | 178 |
| Giurgiu                                | 77  |
| Hirsova                                | 151 |
| Iasi                                   | 226 |
| Lugoj                                  | 244 |
| Mehadia                                | 241 |
| Neamt                                  | 234 |
| Oradea                                 | 380 |
| Pitesti                                | 98  |
| Rimnicu Vilcea                         | 193 |
| Sibiu                                  | 253 |
| Timisoara                              | 329 |
| Urziceni                               | 80  |
| Vaslui                                 | 199 |
| Zerind                                 | 374 |
|  |     |

## Greedy best-first search: example

