

Seminar: Search and Optimization

2. Basic Search Algorithms & Project Organization

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Today's Session

Topics for today

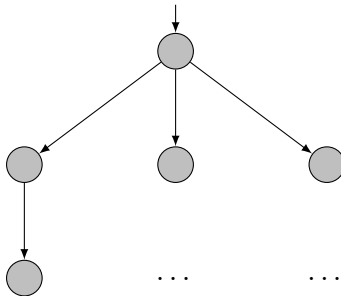
- Introduction to basic search algorithms
- Topic assignment for the seminar
- Organization of the project

Basic Search Algorithms

Search Algorithms

Search algorithms and state spaces

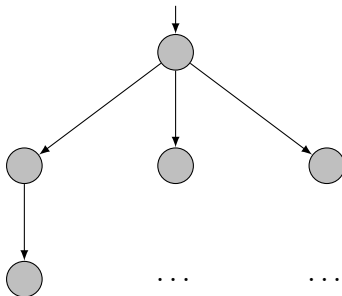
- Search algorithms work in **state spaces**.
- State spaces consist of **states** and **state transitions**, as well as an **initial** state and (potentially many) **goal** states.
- Objective of search algorithms: find a path from the initial to a goal state in the state space.



Search Algorithms

Working principle of search algorithms

- Start with initial state. In every step, **expand** a state through generating its successors.
- **Open List**: Set of states that are candidates for expansion
- **Closed List**: Set of states that are already expanded



Blind Search Algorithms

Blind (or uninformed) search algorithms

Use no additional information about the state space beyond the problem definition. In the following:

- Breadth-first search
- Uniform-cost search

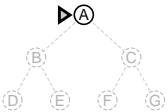
In contrast to

heuristic search algorithms (↔ introduced later)

Breadth-First Search

Breadth-first search

States are expanded **in the order they have been generated** (FIFO).



Breadth-First Search

Breadth-first search

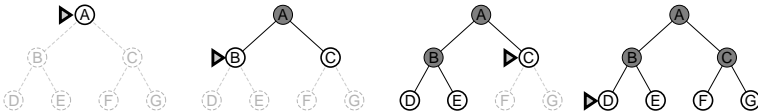
States are expanded **in the order they have been generated** (FIFO).



Breadth-First Search

Breadth-first search

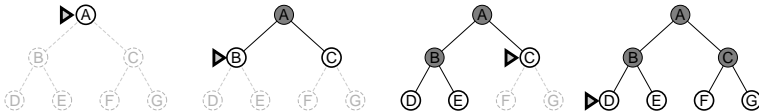
States are expanded **in the order they have been generated** (FIFO).



Breadth-First Search

Breadth-first search

States are expanded **in the order they have been generated** (FIFO).



- searches the state space **layer by layer**
- always finds a solution if a solution exists
- always finds a **shallowest** goal state first
- **optimal** in case all actions have the same costs

Breadth-First Search: Pseudo-Code

Breadth-first search: pseudo-code

$s_0 :=$ initial state

if is-goal(s_0):

return extract-solution(s_0)

$open :=$ **new** FIFO queue with s_0 as the only element

$closed := \emptyset$

loop do

if $open.empty()$:

return none

$s = open.pop-front()$

$closed.insert(s)$

for each successor state s' of s :

if $s' \notin open \cup closed$:

if is-goal(s'):

return extract-solution(s')

$open.push-back(s')$

Uniform-Cost Search

Uniform-cost search

- Breadth-first search not optimal if actions have different costs
- Solution: always expand states with **minimal path costs $g(s)$**
- **Implementation**: priority queue as open list

↪ **uniform-cost search** (also known as **Dijkstra's algorithm**)

Uniform-Cost Search

Uniform-cost search

```
s0 := initial state
open := new priority queue, ordered by g
open.insert(s0)
closed := ∅
while not open.empty():
    s = open.pop-min()
    if s ∉ closed:
        closed := closed ∪ {s}
        if is-goal(s):
            return extract-solution(s)
        for each successor state s' of s:
            open.insert(s')
return unsolvable
```

Heuristic Search Algorithms

Drawback of blind search algorithms: Limited scalability

Idea

- Find criteria to estimate which states are “good” and which states are “bad” \rightsquigarrow prefer good states

State evaluation

- Use a **heuristic function** $h(s)$ to estimate the quality of states s
- Based on h , compute **evaluation function** f
- Evaluate every state s with f (i. e., compute $f(s)$)
- Expand state with minimal f value next

\rightsquigarrow prominent example: **A*** search algorithm

A* Search Algorithm

A* search algorithm

- Evaluation function $f(s) := g(s) + h(s)$
- Balance path costs $g(s)$ and estimated proximity $h(s)$ to goal
- Intuition: $f(s)$ estimates costs of cheapest solution from initial state through s to goal

A* Search: Pseudo-Code

A* search (no re-opening)

```
 $s_0 :=$  initial state  
 $open :=$  new priority queue, ordered by  $f$   
if  $h(s_0) < \infty$ :  
     $open.insert(s_0)$   
 $closed := \emptyset$   
while not  $open.empty()$ :  
     $s = open.pop\text{-}min()$   
    if  $s \notin closed$ :  
         $closed := closed \cup \{s\}$   
        if is-goal( $s$ ):  
            return extract-solution( $s$ )  
        for each successor state  $s'$  of  $s$ :  
            if  $h(s') < \infty$ :  
                 $open.insert(s')$   
return unsolvable
```

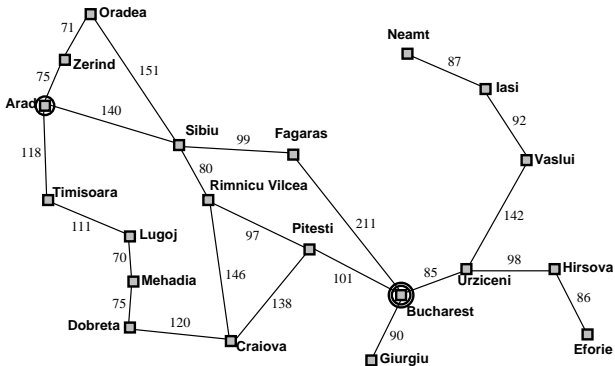
A* Search Algorithm

Most important property

- A* is **optimal** if the applied heuristic is **admissible**.

Example: A* for Route Planning

Example heuristic: straight-line distance to Bucharest



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

Example: A* for Route Planning

(a) The initial state



Example: A* for Route Planning

(a) The initial state



(b) After expanding Arad



Example: A* for Route Planning

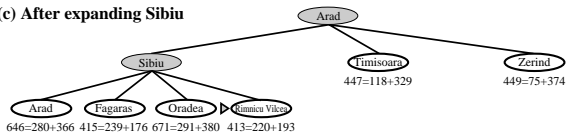
(a) The initial state



(b) After expanding Arad



(c) After expanding Sibiu



Example: A^* for Route Planning

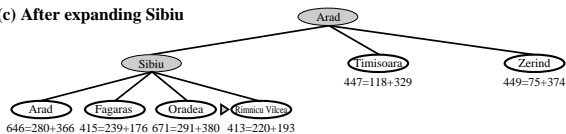
(a) The initial state



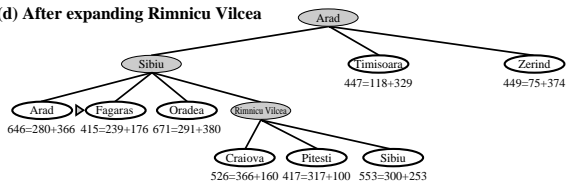
(b) After expanding Arad



(c) After expanding Sibiu

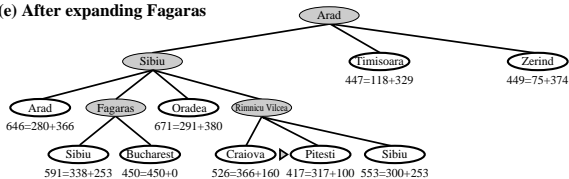


(d) After expanding Rimnicu Vilcea



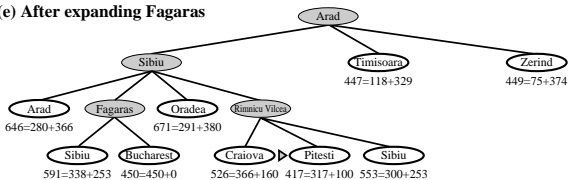
Example: A* for Route Planning

(e) After expanding Fagaras

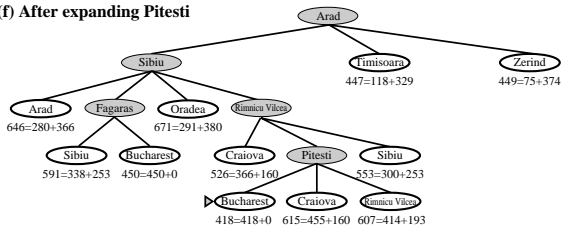


Example: A* for Route Planning

(e) After expanding Fagaras



(f) After expanding Pitesti



Seminar Topic Assignment

Seminar Schedule

- 13 registered participants
- Every participant has been assigned a topic marked with **Yes**

Seminar Schedule

- 17.09. Organization, schedule & seminar topics
- 24.09. Basic search algorithms & project organization
- 01.10. no meeting
- 08.10. no meeting
- 15.10. Viacheslav Sharunov
- 22.10. Andreas Thüring + project milestone 1
- 29.10. Samuel Bader + Ziba Tavassoli
- 05.11. Dorde Relic + Marko Obradovic
- 12.11. no meeting
- 19.11. Daniel Federau + project milestone 2
- 26.11. Oleksandr Dombrovskyi + Kadir Özgür
- 03.12. Maurus Dähler + Mirko Riesterer
- 10.12. Patrick Buder
- 17.12. Wrap-up and final project presentation

Topic Assignment

Pathfinding

- 15.10.: Near Optimal Hierarchical Path-Finding
Viacheslav Sharunov (supervisor: Jendrik Seipp)
- 22.10.: Subgoal Graphs for Fast Optimal Pathfinding
Andreas Thüring (supervisor: Martin Wehrle)
- 29.10.: Improved heuristics for optimal path-finding on game maps
Samuel Bader (supervisor: Martin Wehrle)
- 29.10.: TRANSIT Routing on Video Game Maps
Ziba Tavassoli (supervisor: Gabi Röger)

Topic Assignment

Real-time strategy games

- 5.11.: UCT for tactical assault planning in Real-Time Strategy Games
Dorde Relic (supervisor: Silvan Sievers)
- 5.11.: Game-Tree Search over High-Level Game States in RTS Games
Marko Obradovic (supervisor: Manuel Heusner)
- 19.11.: Build order optimization in StarCraft
Daniel Federau (supervisor: Silvan Sievers)

Topic Assignment

Content generation & playing games

- 26.11.: Procedural Content Generation
Oleksandr Dombrovskyi (supervisor: Florian Pommerening)
- 26.11.: Techniques for AI-Driven Experience Management in Interactive Narratives
Kadir Özgür (supervisor: Florian Pommerening)
- 3.12.: Towards Automatic Personalized Content Generation for Platform Games
Maurus Dähler (supervisor: Salomé Simon)
- 3.12.: Answer Set Programming for Procedural Content Generation: A Design Space Approach
Mirko Riesterer (supervisor: Salomé Simon)
- 10.12.: Learning to Win by Reading Manuals in a Monte-Carlo Framework
Patrick Buder (supervisor: Thomas Keller)

Organization: Update

Update on seminar organization

- Due to the large number of seminar talks, everyone is only supposed to read **one paper per session** (instead of all papers).
- The paper to read is announced one week in advance (by mail)
- \LaTeX template for seminar papers will be available on website

Project Organization

Project Organization

Project topic

- Grid-based pathfinding competition
- Implementation of pathfinding algorithms on grids

Programming framework

- API based on the Grid-Based Path Planning Competition (<http://movingai.com/GPPC/>)
- Provides infrastructure (like parsing, basic search algorithm) for implementations of pathfinding algorithms
- Adapted infrastructure for project hosted at bitbucket.org
- Programming language: C++

Project Organization

Benchmarks

- “Real-world” game maps (Dragon Age, Starcraft, ...)
- Encoding of maps containing obstacles (trees, water, ...)
- Benchmark set publicly available at
<http://www.movingai.com/benchmarks/>
- File format described at
<http://www.movingai.com/benchmarks/formats.html>

Benchmark format

Benchmarks consist of two files

- .map: encoding of the **map** to search on
- .map.scen: the **scenario** (e. g., start and goal locations)

Project Organization

Organization

- Teams of at most 2 persons
- No fixed supervisor
- If you have questions or want to meet: contact us directly

Workflow

- 1 Create account at `bitbucket.org` and tell us your name
- 2 We will grant access to our repo on project infrastructure
- 3 Project work is done on (forked) bitbucket repository

For all project milestones

- Out of existing files, changes allowed only to `Entry.h/cpp`

Project Organization

Milestone 1

- Familiarize yourself with API and benchmark format
- Proof-of-concept implementation of **uniform-cost search**
- **Deadline:** October 22

Performance target for milestone 1

Solve AcrossTheCape with uniform-cost search in ≤ 1 minute.

Project Organization

Milestone 2

- Implementation of at least one additional **optimal** algorithm
- **Deadline:** November 19

Project Organization

Milestone 3

- Open (also **suboptimal** algorithms)
- In particular: Optimize for efficiency
- **Deadline:** December 17

Project Organization

Grading

- Performance (time, solution quality) on benchmark selection
- Quality of code
- Milestone presentations