
Advanced Artificial Intelligence

Lab 03

Outline

- A concrete problem
- Implementation of heuristic search algorithms for this problem
 - Greedy Best-First Search
 - A* Search
- Exercise

Remarks of Heuristic Search

- involve domain knowledge

-- Heuristic Function

- Complete / Optimal

Greedy Best-first Search

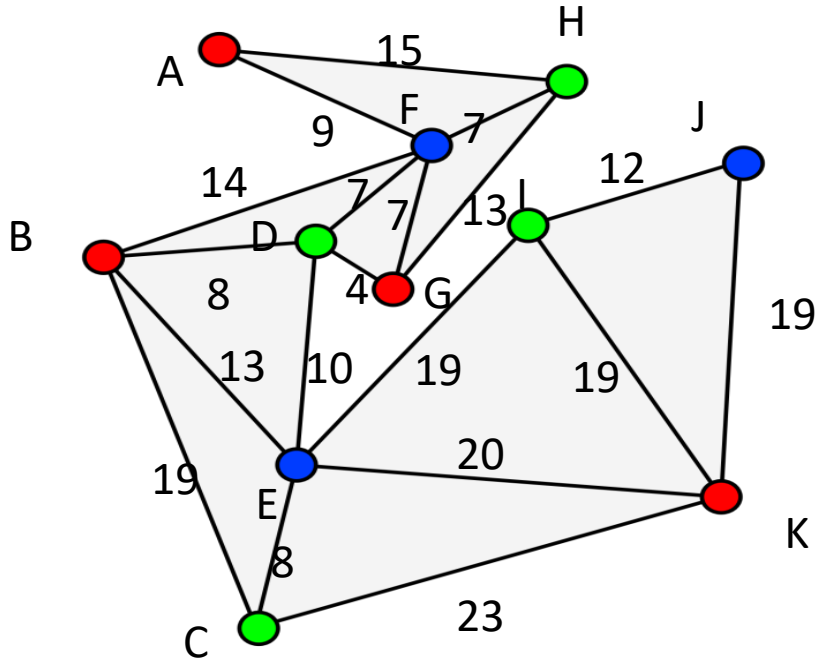
Incomplete & Not always optimal

A* Search

Complete & Optimal

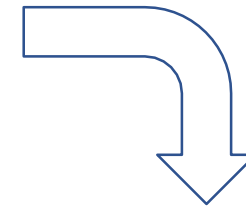
A Concrete Problem

Task: Find shortest Path from **H** to **C**



Straight-line dis to C

A	26
B	19
D	17
E	8
F	24
G	17
H	29
I	25
J	32
K	23



Domain knowledge(**Heuristic**)
i.e. $h(*)$

Greedy Best-first Search

Remarks of Greedy Best-First Search

- Idea: Expand the node that **seems closest** to the **Goal**.
- Expand node s that has the minimal $f(s) = h(s)$.
- **Complete?** No, can stuck in loops.
- **Optimal?** No.
- **Time?** $O(b^m)$, but good heuristics can give drastic improvement.
- **Space?** $O(b^m)$, keep all nodes in memory.

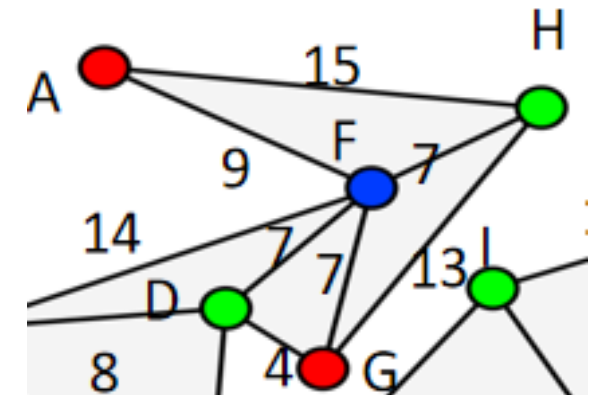
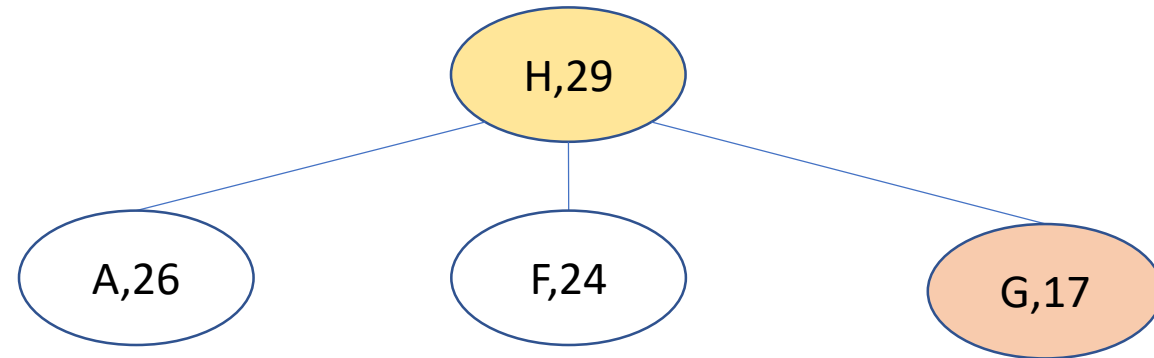
Greedy Best First Search

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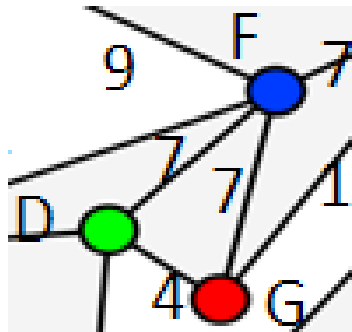
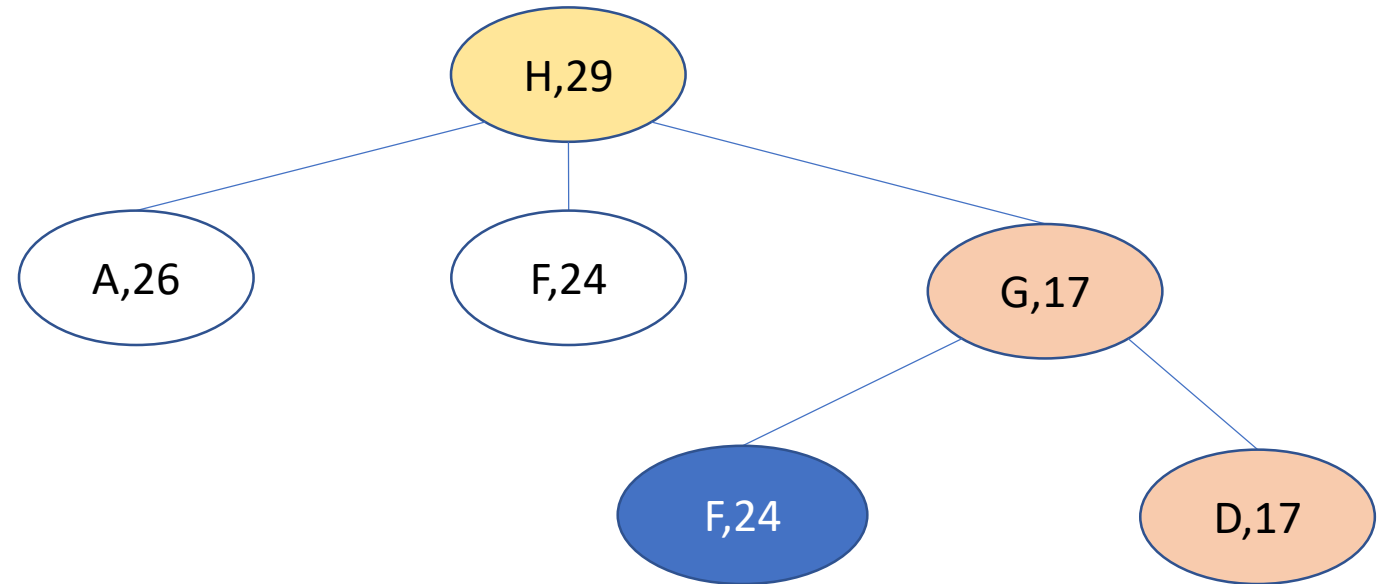
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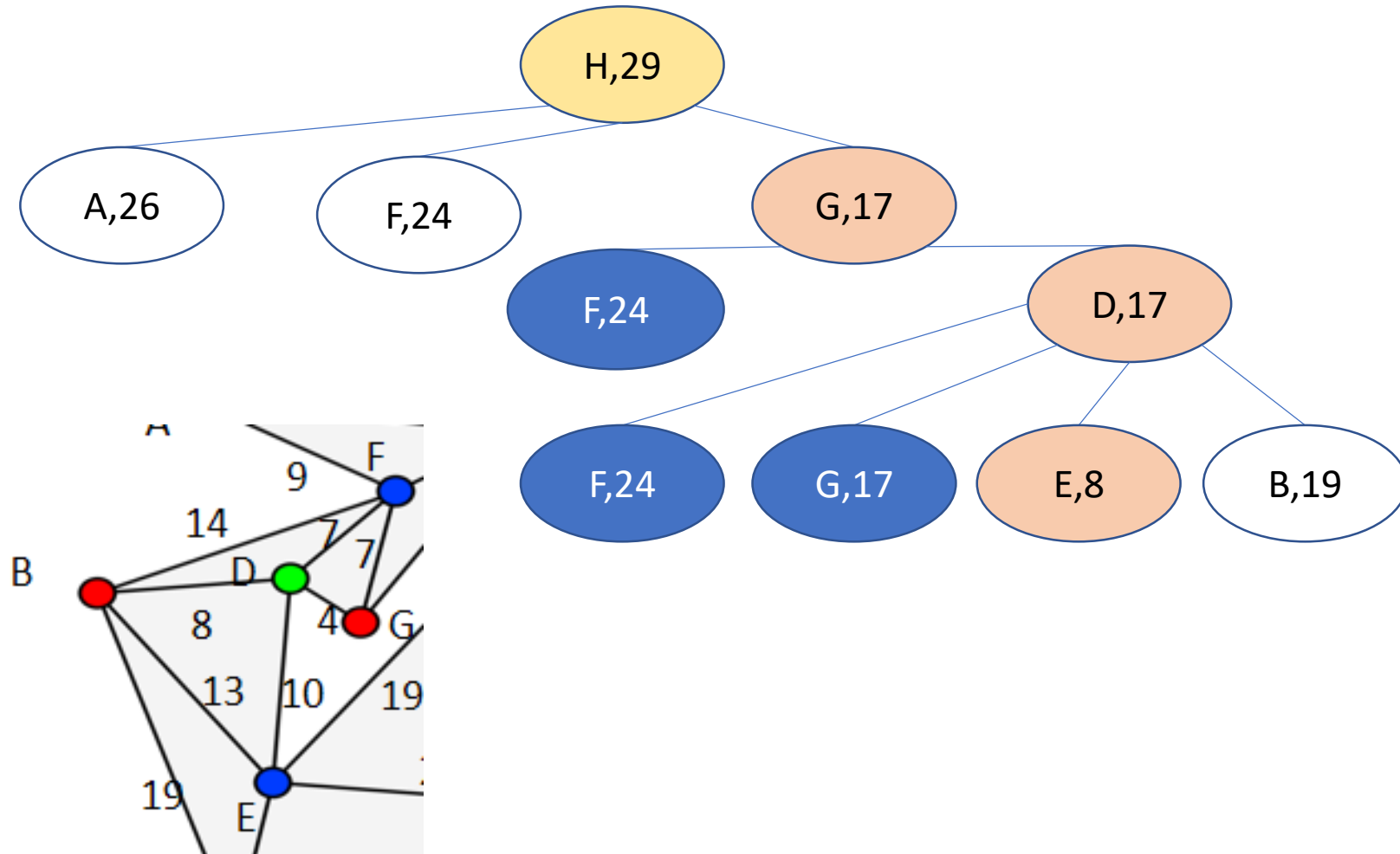
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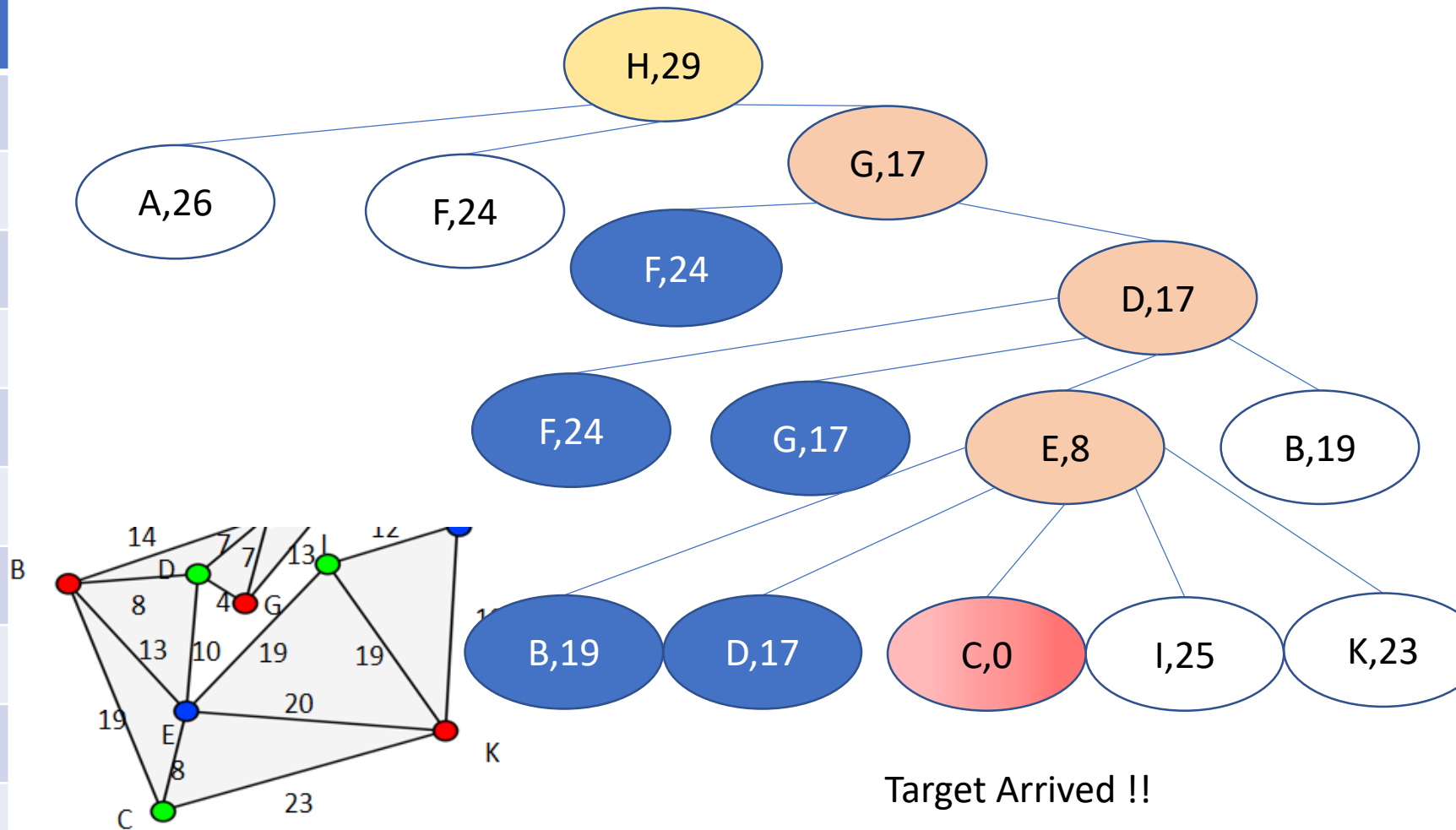
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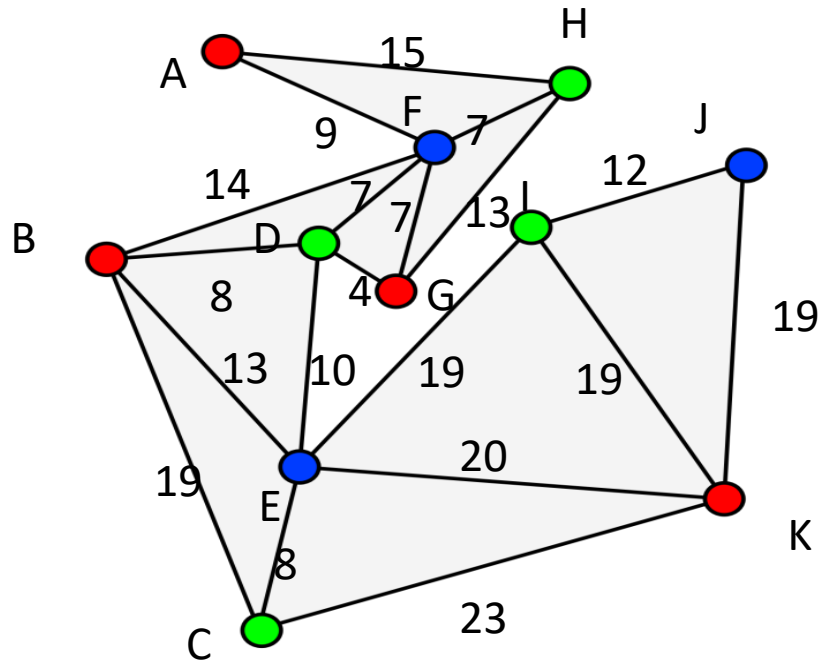


Greedy Best First Search

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Greedy Best First Search



- **Solution:**
H → G → D → E → C
- ***Distance*** = $13 + 4 + 10 + 8$
= 35 m

But it is not an optimal solution!

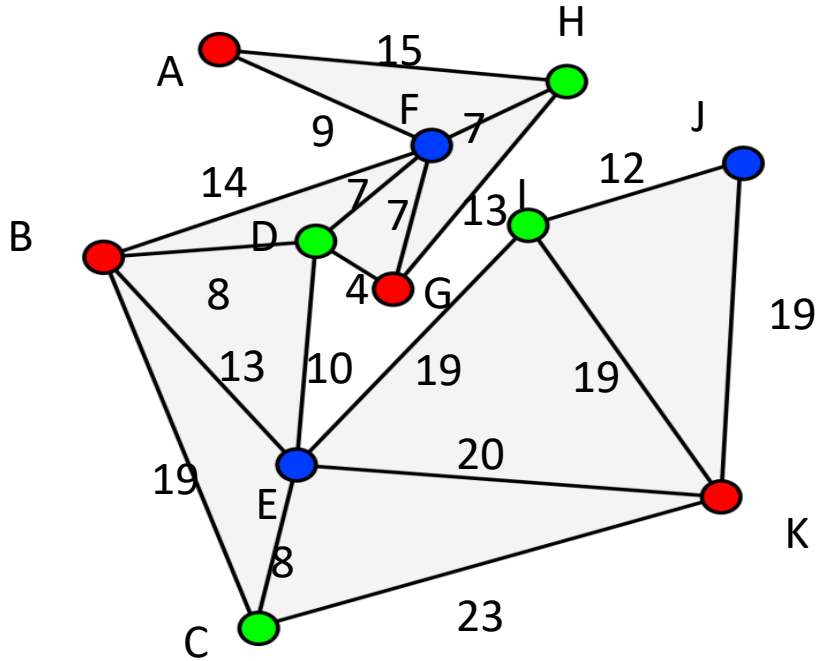
A* Search

Remarks of A* Search

- Idea: **avoid** expanding paths that are **already expensive**.
- Expand the node s that has the minimal $f(s) = h(s) + g(s)$
 - $g(s)$: cost from *Start* to s .
 - $h(s)$: estimated cost from s to *Goal*.
 - $f(s)$: estimated total cost of path from *Start* through s to *Goal*.
- **Theorem:** A* with h is optimal if h is admissible
 - Here we set h : SLD to C $h(s)$ is admissible
 - A* is complete and optimal in this case.

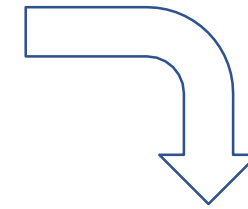
A* Search Illustration

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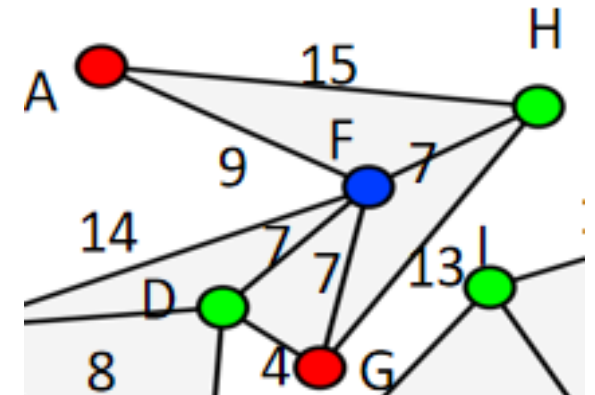
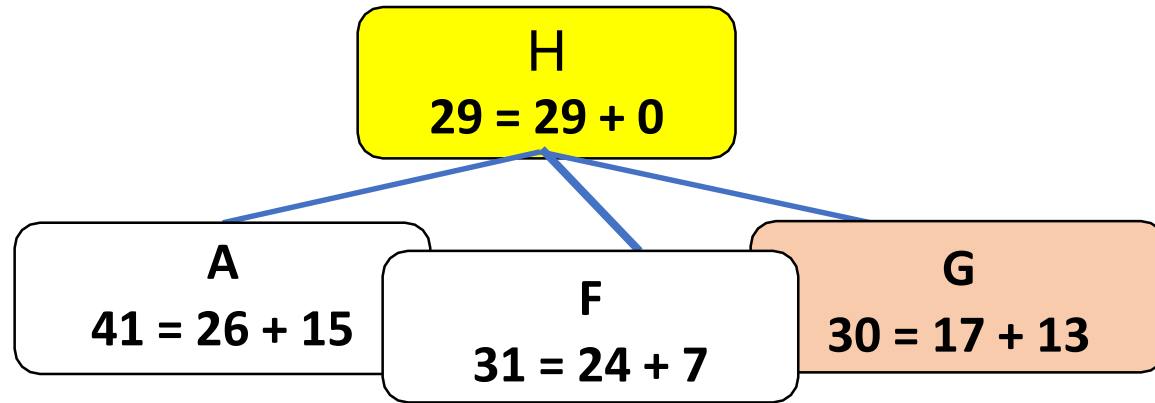
H

$$29 = 29 + 0$$

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

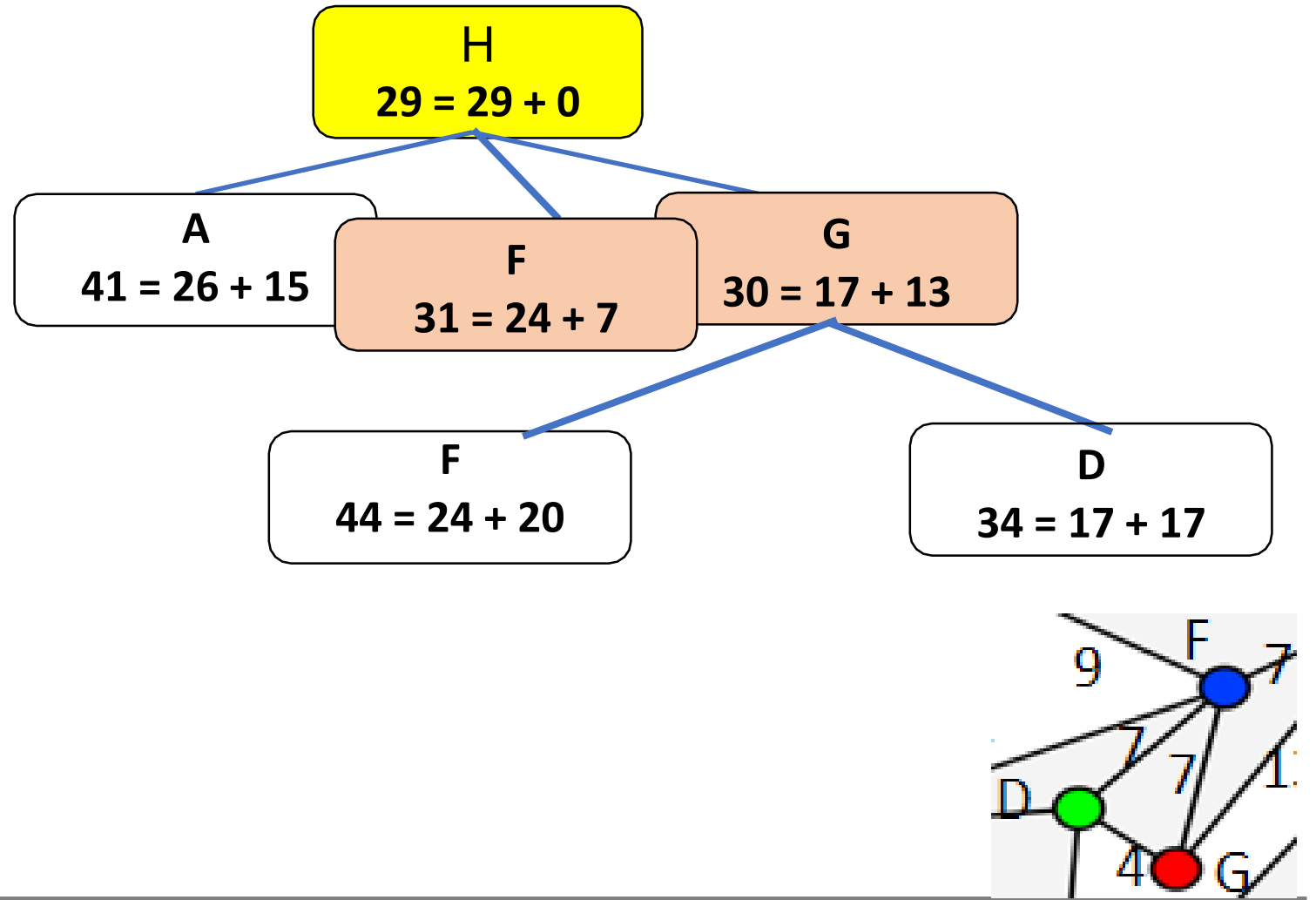
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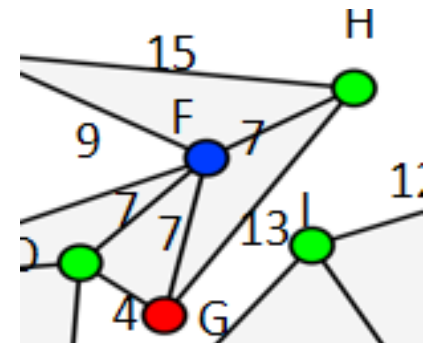
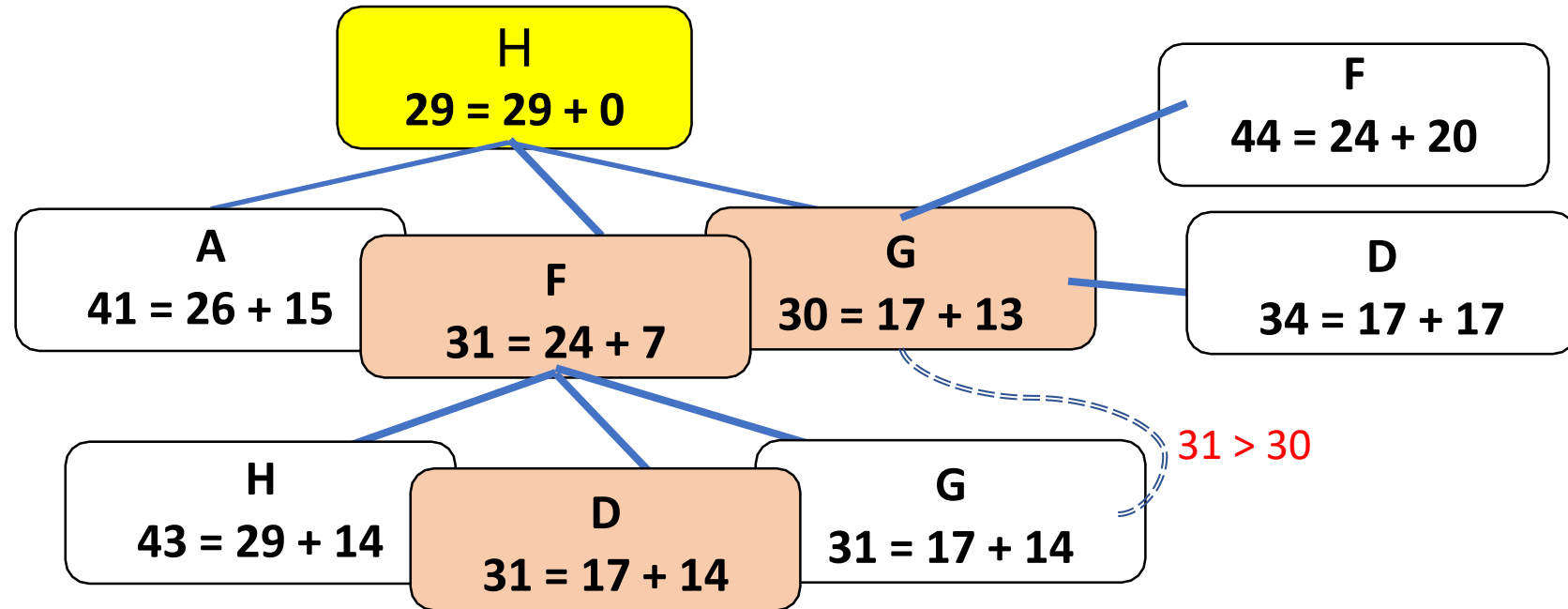
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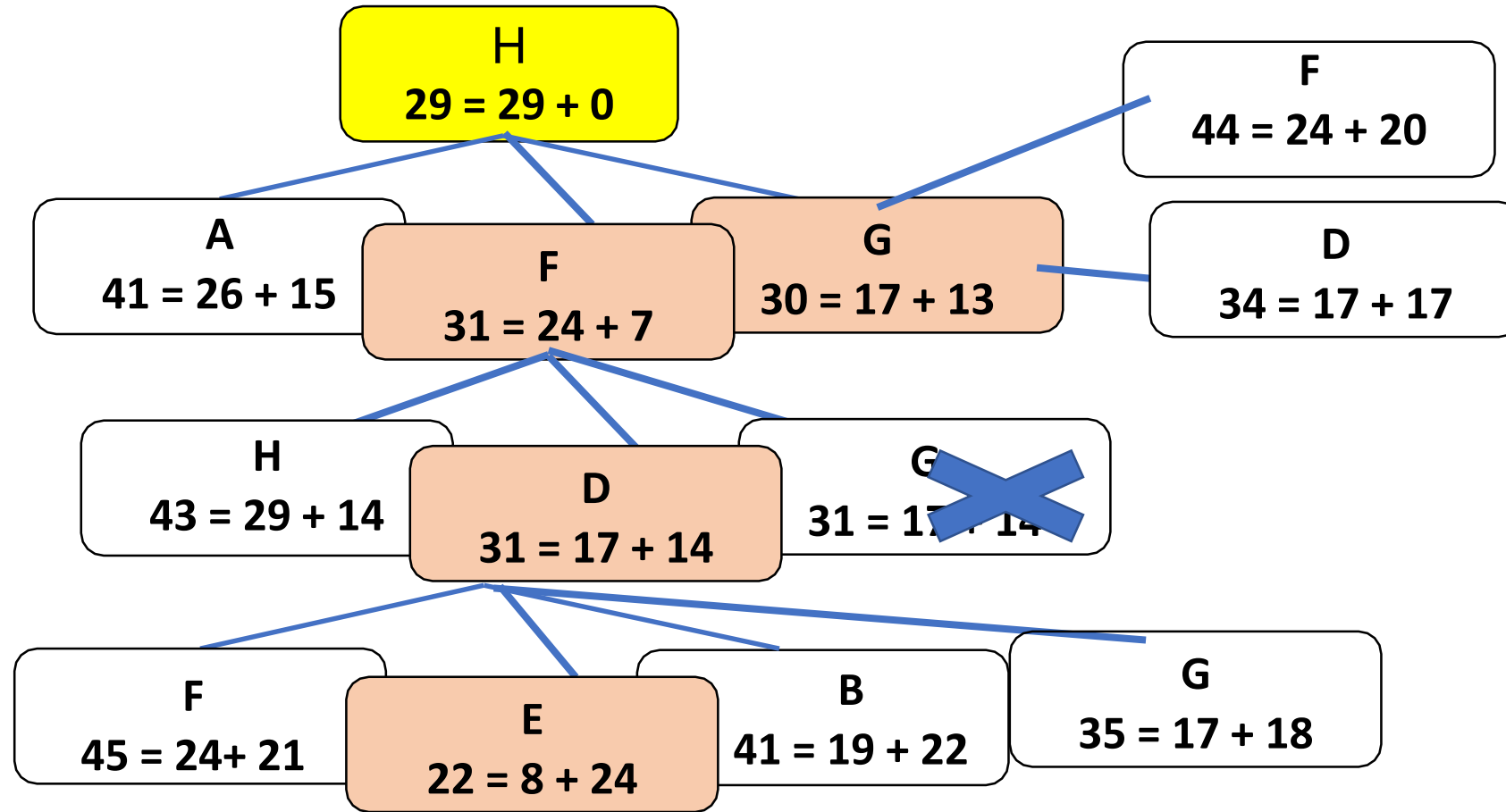
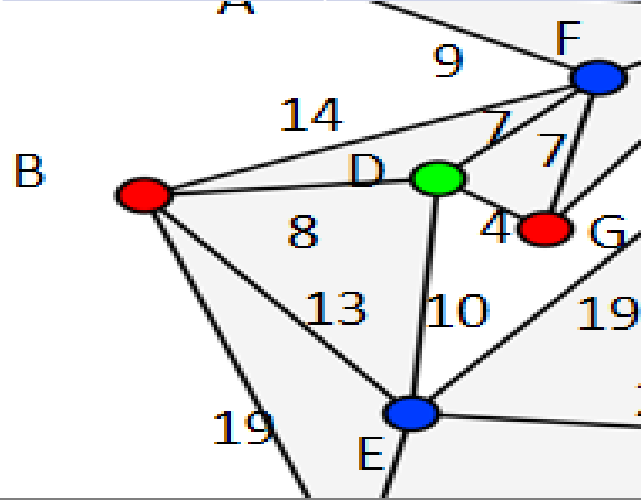
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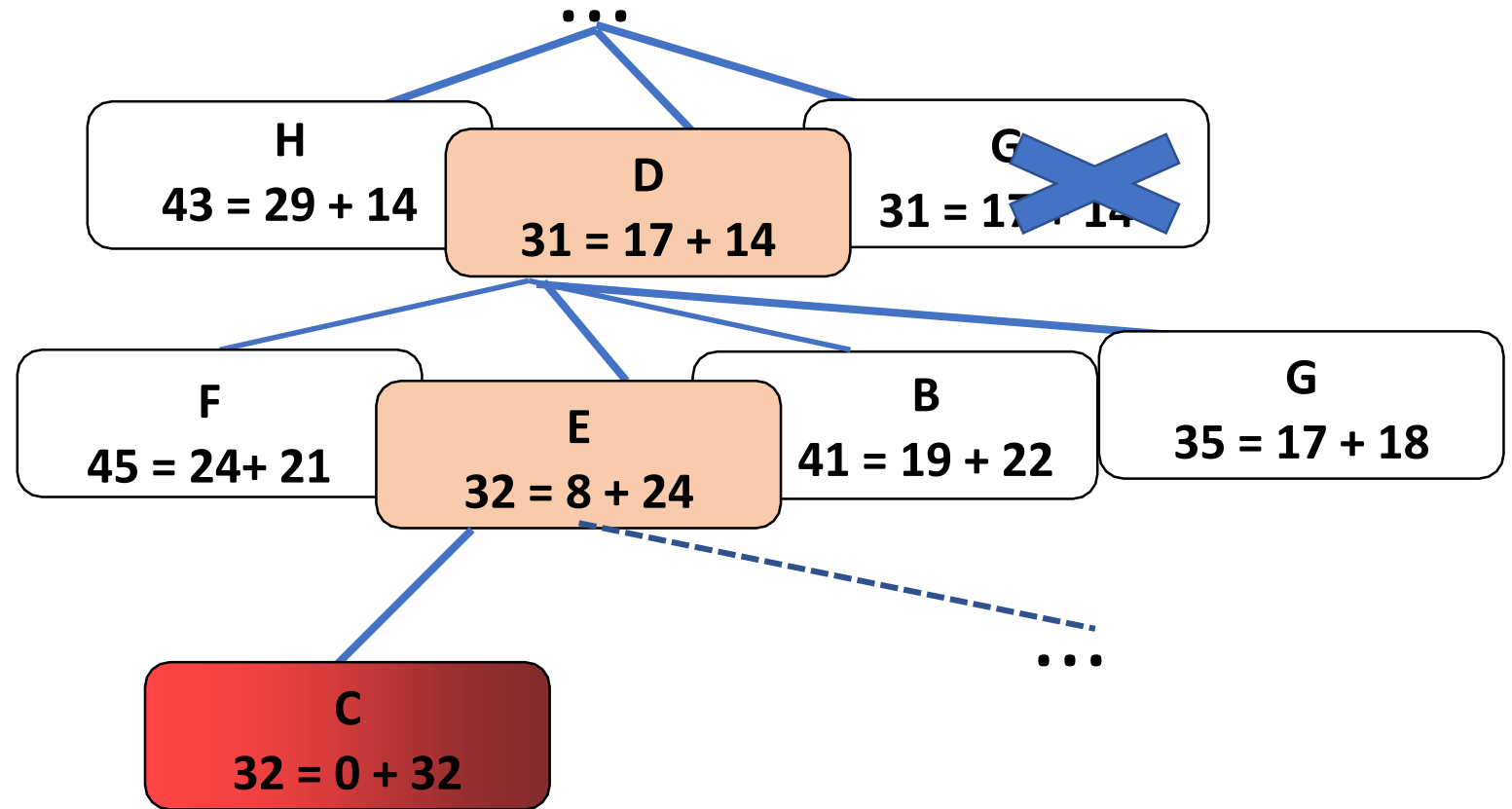
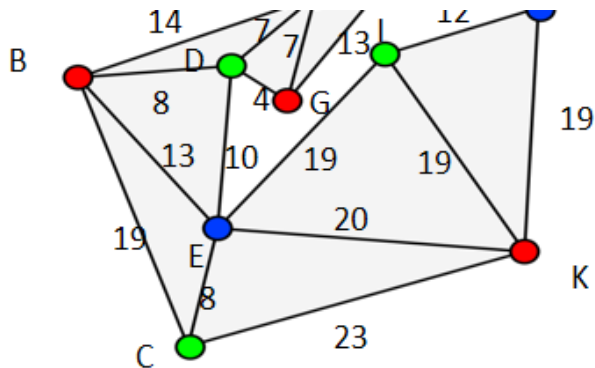
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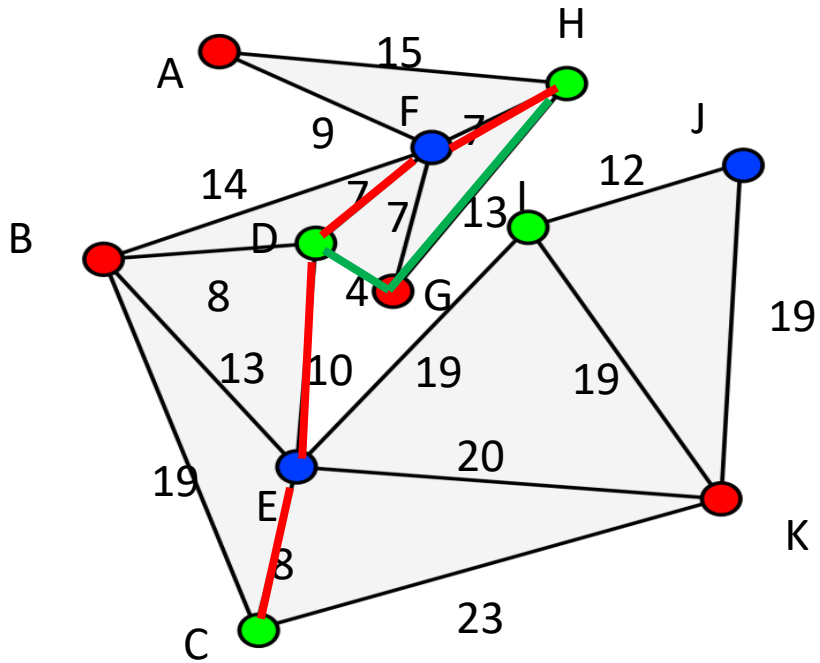
A* Search Illustration

Node	SLD to C
B	19
D	17
I	25
K	23
C	0



Target Arrived !

A* Search Illustration



- **Solution:**
H -> F -> D -> E -> C
- **Distance** = $7 + 7 + 10 + 8$
= 32 m
- **Solution by Greedy Search:**
35m

Brief Summary

Summary: Heuristic Search

- **Core idea**: expand the path that seems most **promising**.
- Node s with lowest $f(s) \rightarrow$ the most **promising**.
- Usually $f(s) = h(s) + ?$.

- Greedy: Incomplete & Not always optimal
- A*: Complete & Optimal

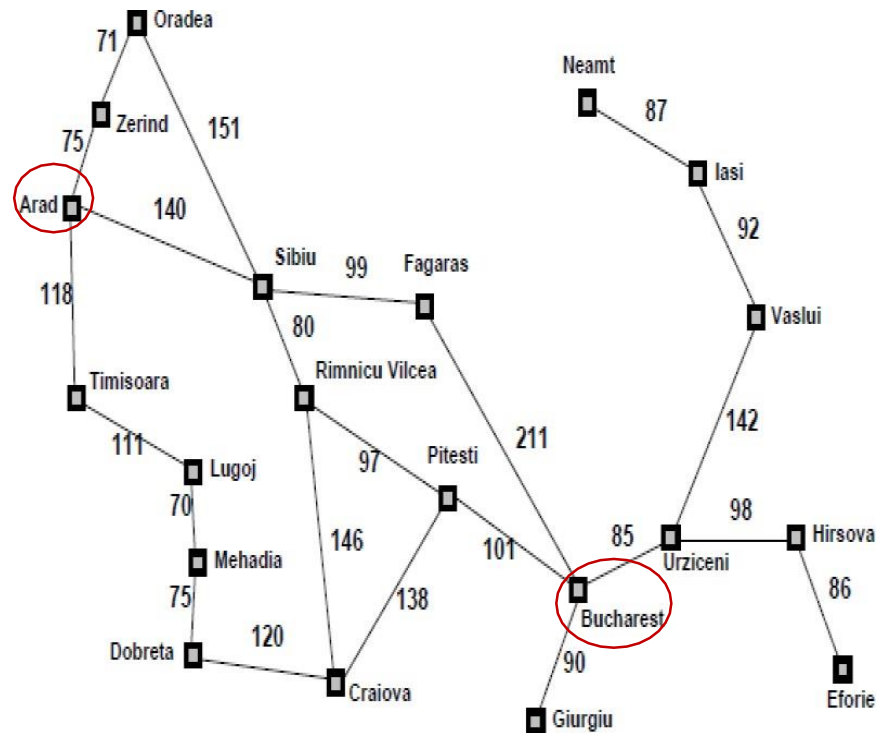
Summary: Search Methods with $f(s)$

- The choice of f determines the search methods.
- Uniform-cost search: $f(s) = g(s)$.
- Greedy best-first search: $f(s) = h(s)$.
- A* search: $f(s) = g(s) + h(s)$.

-
- $g(s)$: the path cost from Start to node s .
 - $h(s)$: the estimated cost from node s to Goal.

Exercise

Exercise 1



Use A* Search with the straight-line distance heuristic to solve the shortest path from Lugoj to Bucharest.

Please give the order of the node expansion with $f(s)$, $g(s)$, and $h(s)$ for each node.

Exercise 2

Heuristic Path Algorithm is a type of Best First Search and its evaluation function is $f(n) = (2-w)g(n) + w \cdot h(n)$.

- 1) Suppose h is admissible. how to set w to make it optimal?
- 2) When $w=0$, $w=1$, and $w=2$, which search algorithm does it represent? Explain your answer.