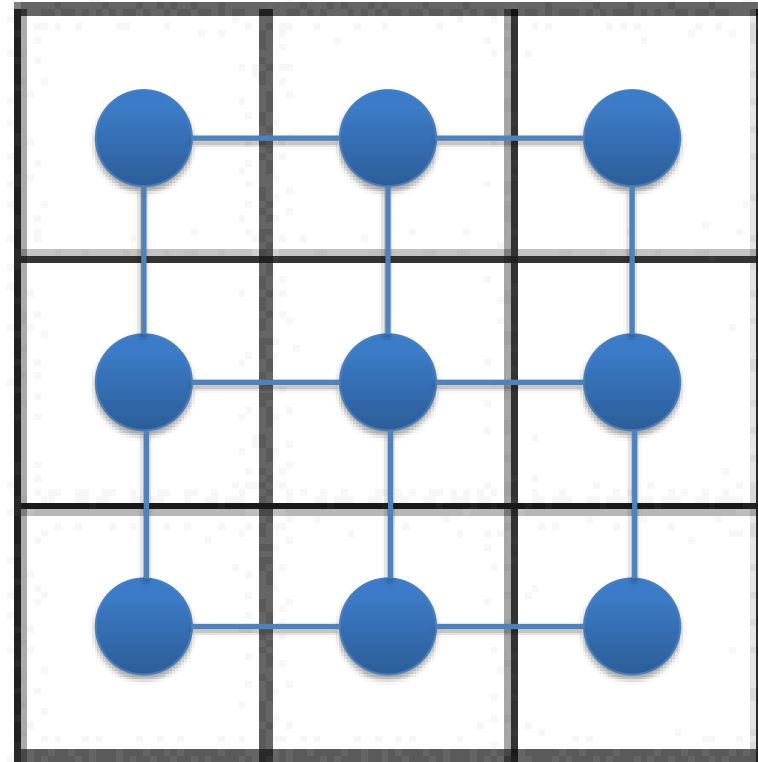
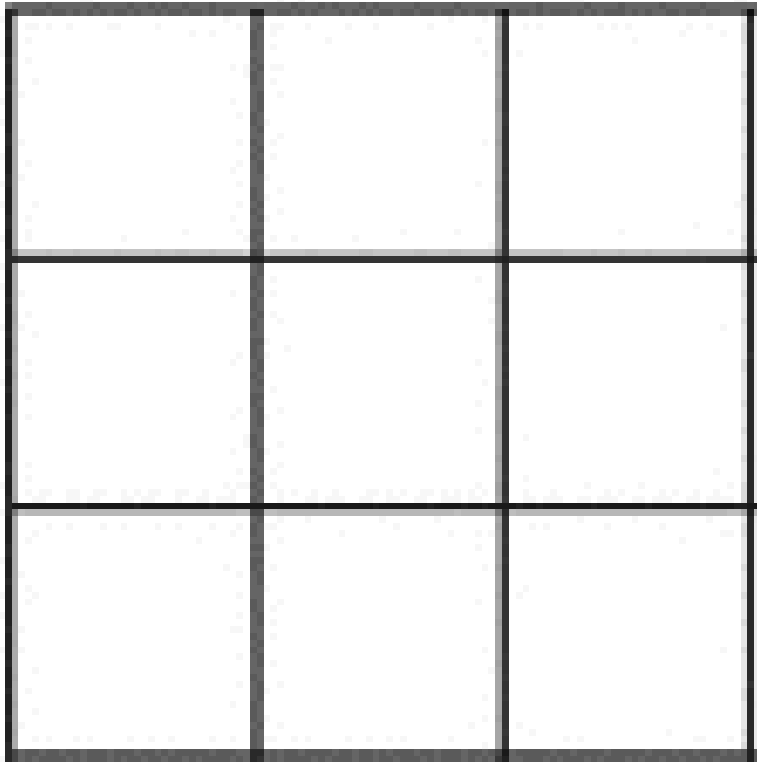


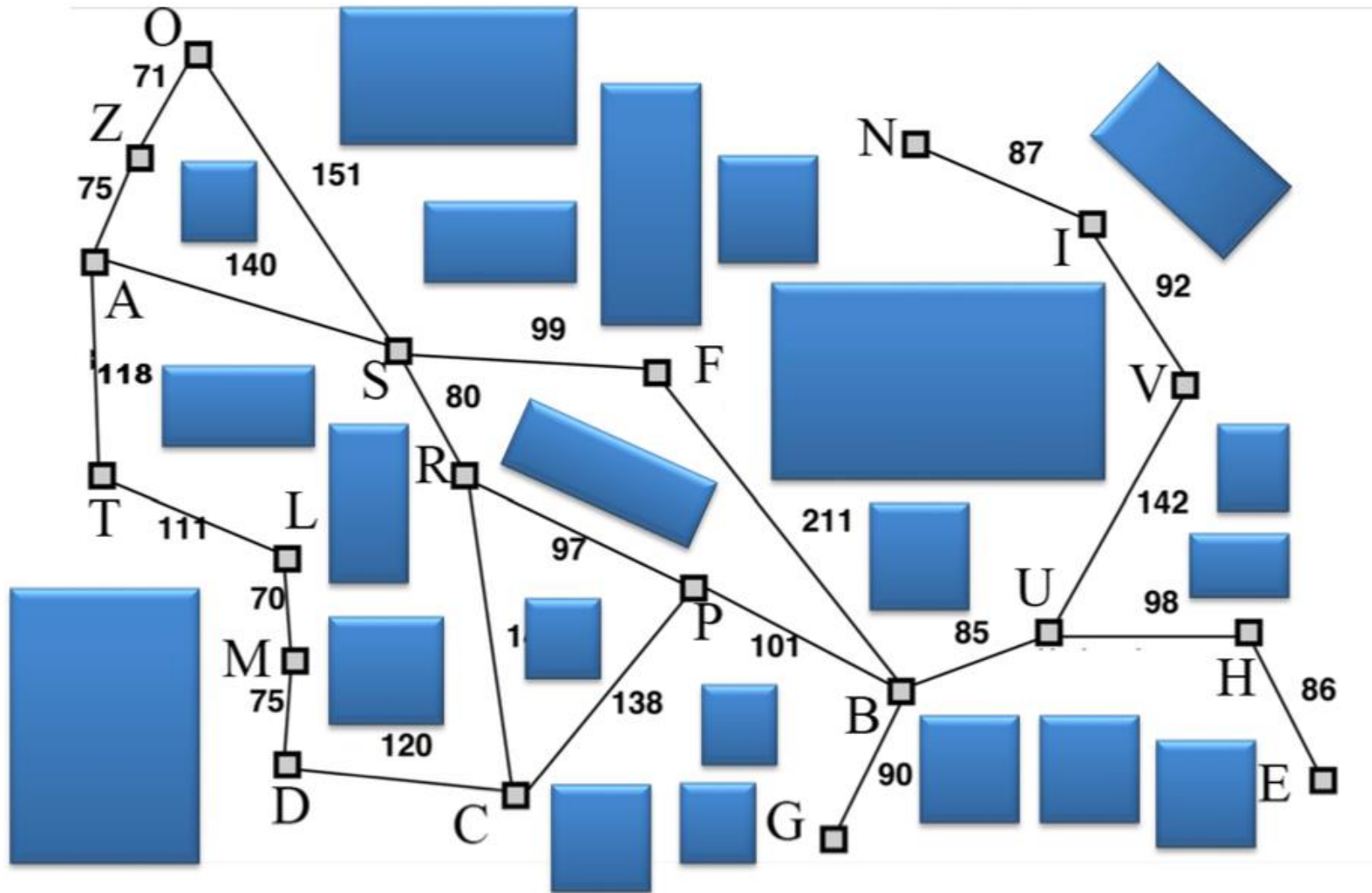
# Graphs: Killer App in GAI

- Navigation / Pathfinding
- Navgraph: abstraction of all locations and their connections
- Cost / weight can represent terrain features (water, mud, hill), stealth (sound to traverse), etc
- What to do when ...
  - Map features move
  - Map is continuous, or 100K+ nodes?
  - 3D spaces?

# Grid as Graph

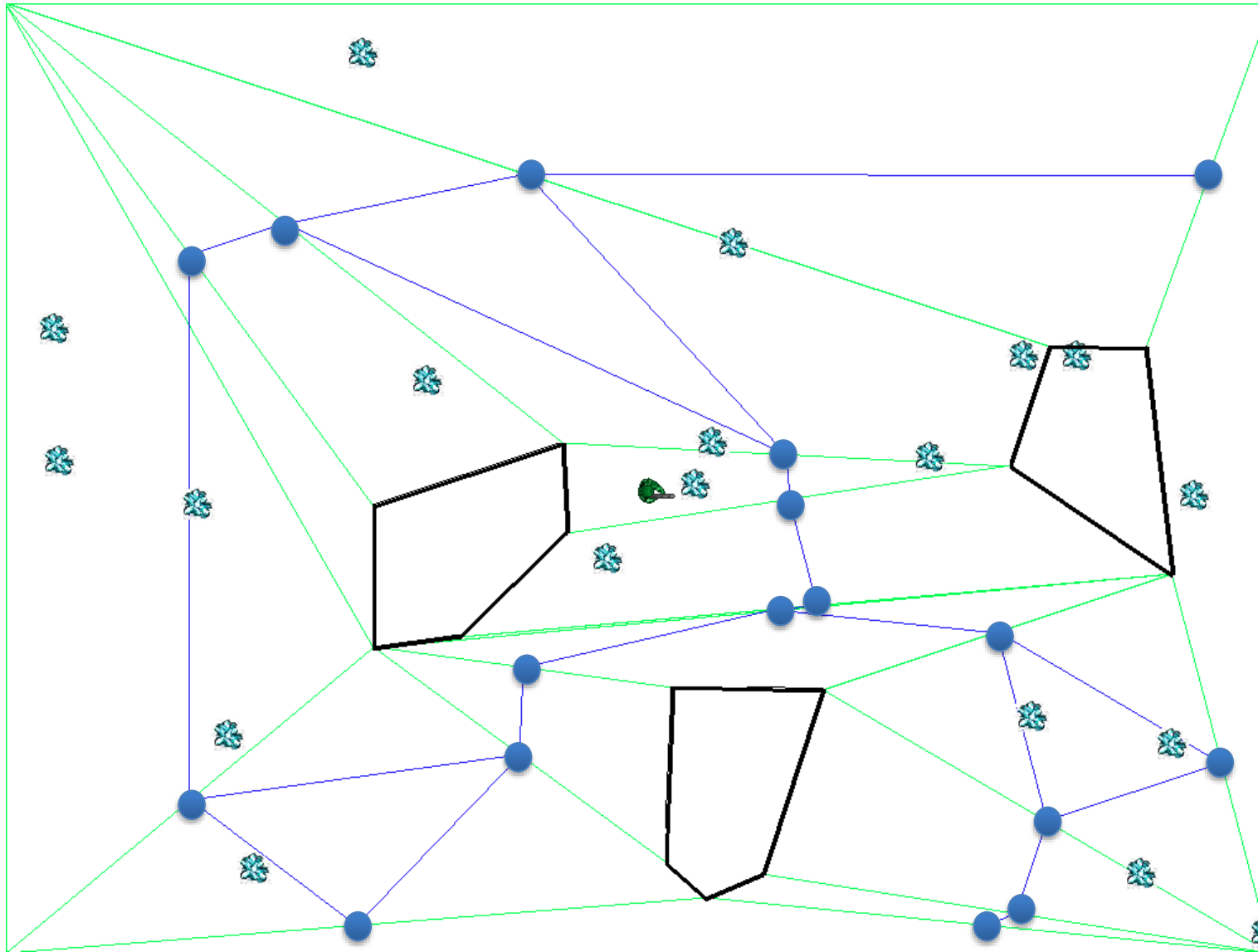


# Path Network as Graph



# Nav Mesh as Graph

(well actually path network again)



# Why talk about these as graphs?

- Standard, abstract way to discuss different spatial representations
- Allows for quantifiable comparison between different spatial representations (e.g. number of edges/nodes)
- Allows us to discuss different search approaches without worrying about the exact spatial representation

# Graph Search: Sorting Successors

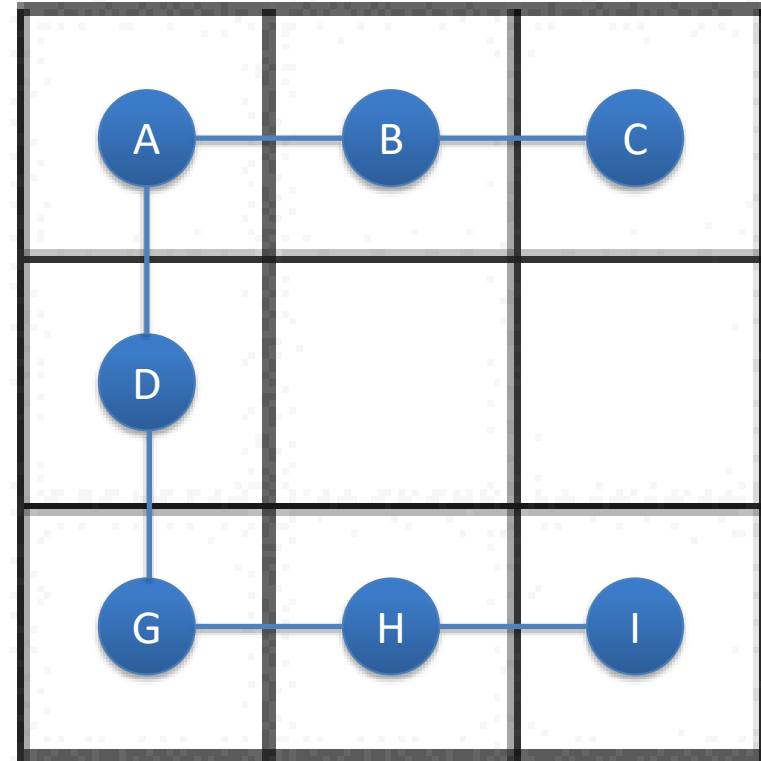
- Uninformed (all nodes are same)
  - Greedy
  - DFS (stack – lifo), BFS (queue – fifo)
  - Iterative-deepening (Depth-limited)
- Informed (pick order of node expansion)
  - Dijkstra – guarantee shortest path ( $E \log_2 N$ )
  - Floyd-Warshall
  - A\* (IDA\*).... Dijkstra + heuristic
  - D\*
- Hierarchical can help



# Greedy Algorithm Review

Find a path from start to goal node

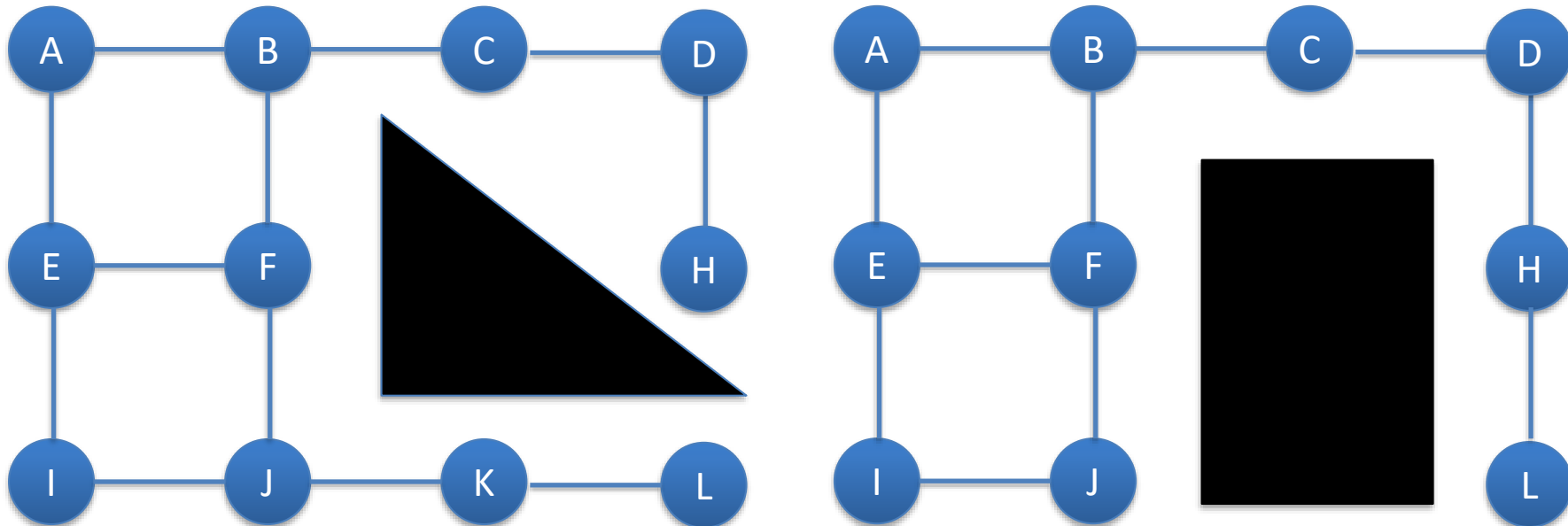
1. Add the neighbors of the current node to some open set list
  - We can get here!
2. Pick next current node from open set
3. If next node is goal, backtrack to start for path



# Question

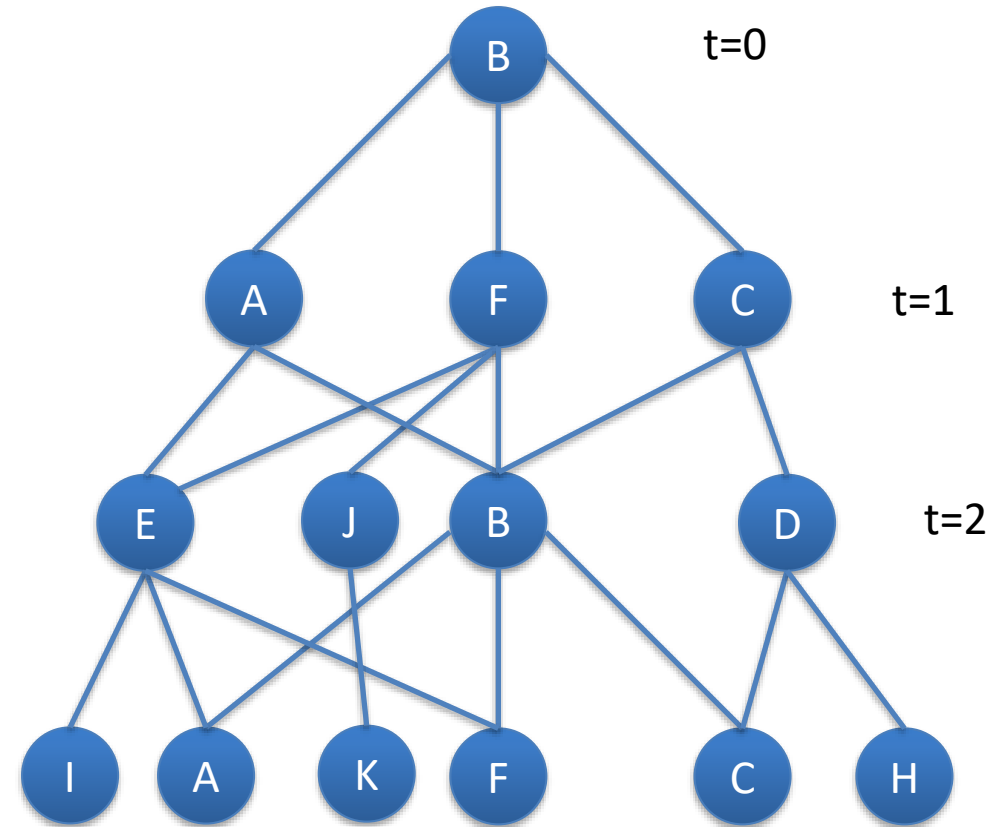
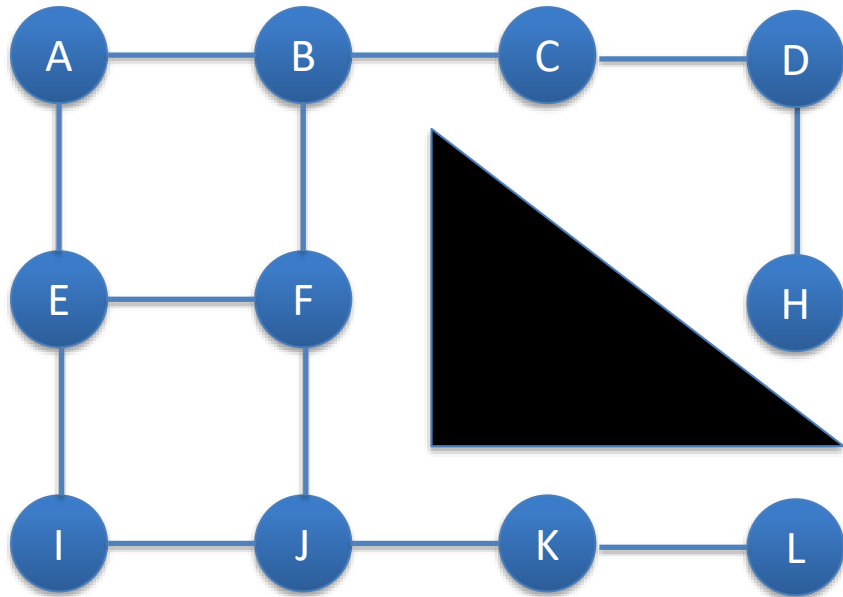
What heuristic could be used to get from B to L in both graphs the fastest?

- Fastest meaning with fewest current nodes chosen



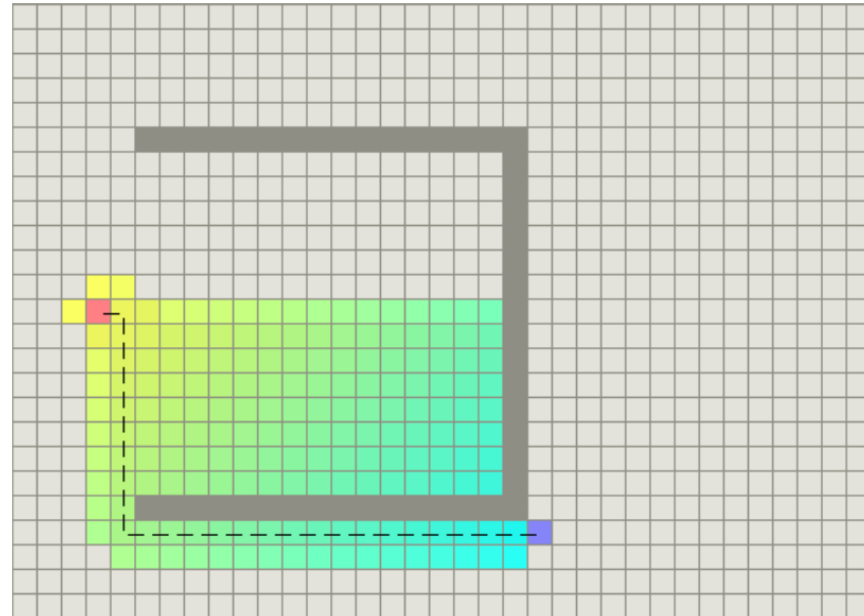


# Greedy as a tree



# Improvement over Greedy

- Beyond improving the heuristic, how can we improve the greedy pathing algorithm?
- When does it fail?



# A\*

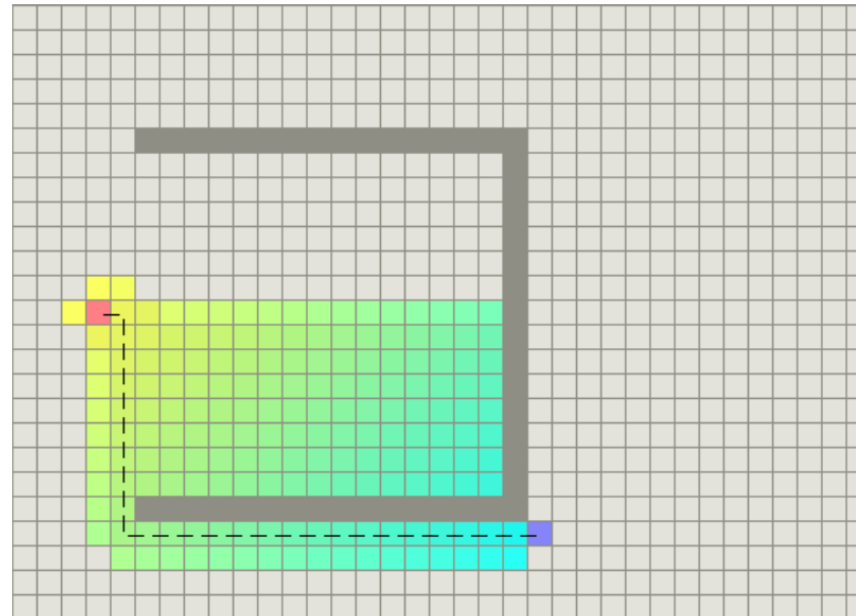
- Won't just have an open set, but also a closed set (nodes already evaluated)
- Open set will be a priority queue, so if we discover a better node we can immediately pick it
- Priority Queue: A queue that automatically sorts itself so minimum cost is at the top

# A\* Search

- 1968: Single source, single target graph search
- Guaranteed to return the optimal path if the heuristic is admissible
- Evaluate each state:  $f(n) = g(n) + h(n)$
- Open list: nodes that are known and waiting to be visited
- Closed list: nodes that have been visited

# A\*

- Nodes will have two costs:
  - G score: Cost from getting from start to here
  - H score: Estimated cost of getting from here to goal
  - F score:  $G+H$
- We will pick which node to choose next based on both of these scores



# A\*

add **start** to **openSet**

while **openSet** is not empty:

*current* = **openSet**.pop()

    if *current* == **goal**:

        return reconstruct\_path(*current*)

**closedSet**.Add(*current*)

    for each *neighbor* of *current*:

        if *neighbor* in **closedSet**:

            continue

*gScore* = *current.gScore* + dist(*current*, *neighbor*)

        if *neighbor* not in **openSet**:

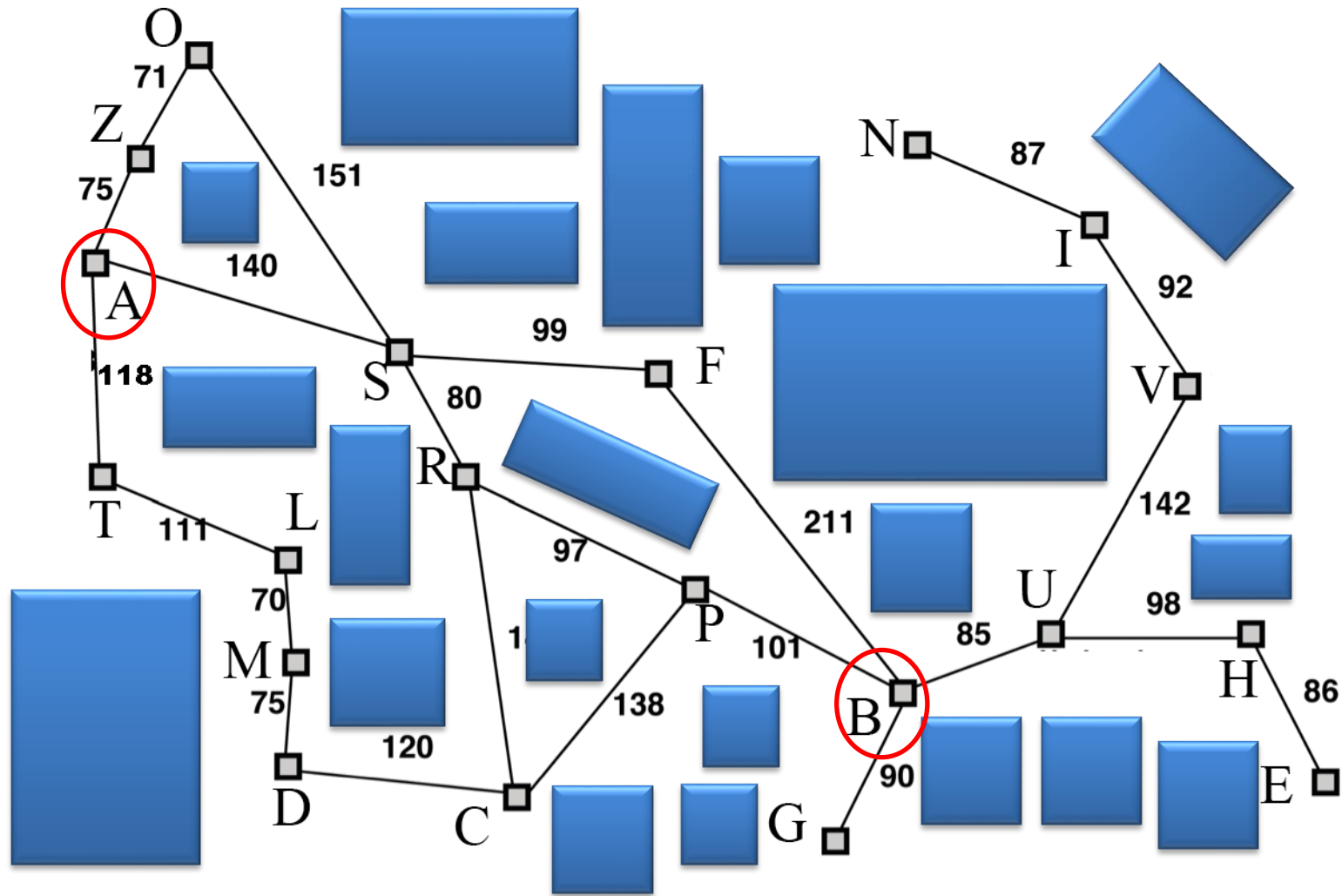
**openSet**.add(*neighbor*)

        else if *gScore* < **openSet**.get(*neighbor*).*gScore*

**openSet**.replace(**openSet**.get(*neighbor*), *neighbor*)

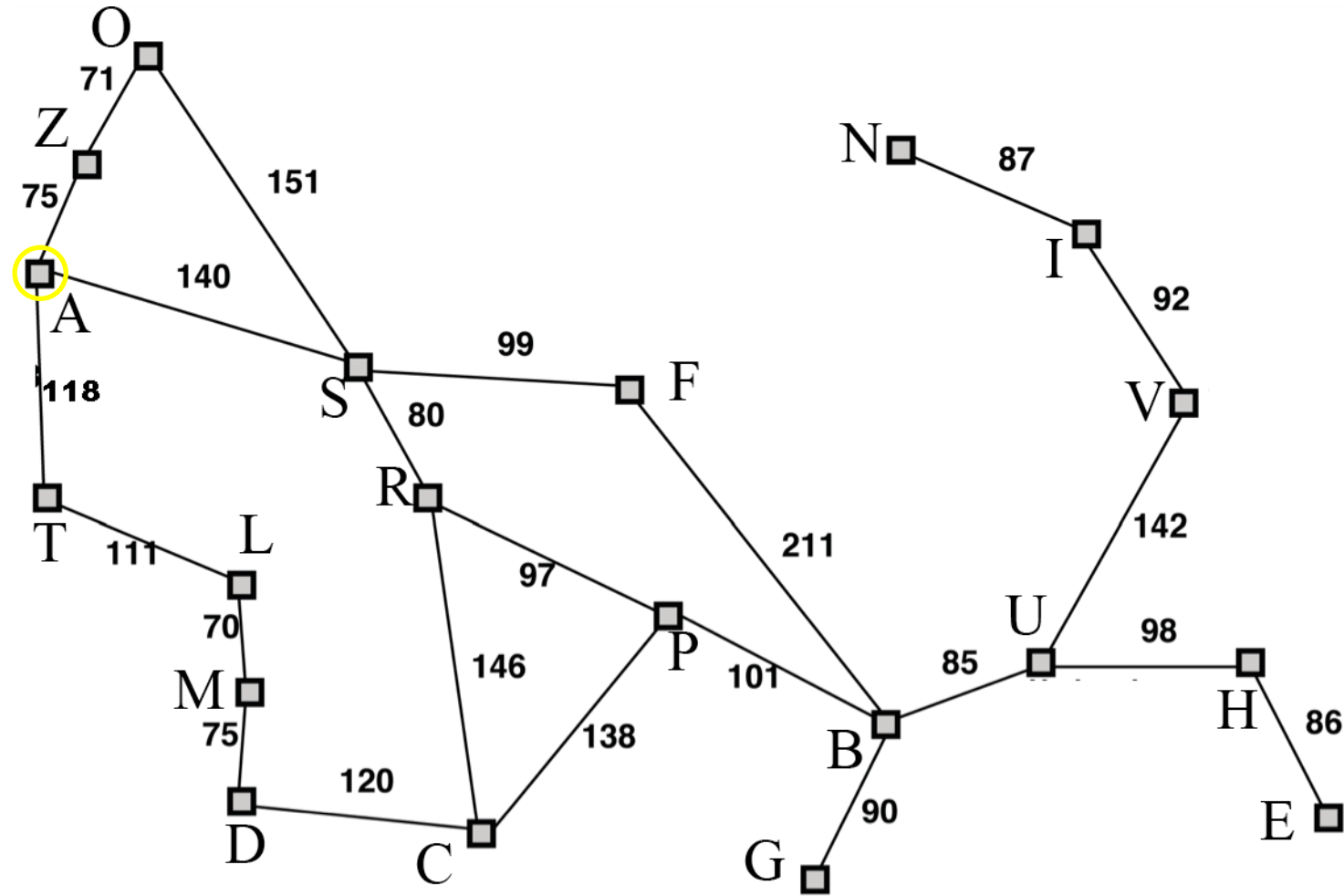
Heuristic Distance, A→B

A	366
B	0
C	160
D	242
E	161
F	176
G	77
H	151
I	226
L	244
M	241
N	234
O	380
P	100
S	253
T	329
U	80
V	199
Z	374



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

A	366
B	0
C	160
D	242
E	161
F	176
G	77
H	151
I	226
L	244
M	241
N	234
O	380
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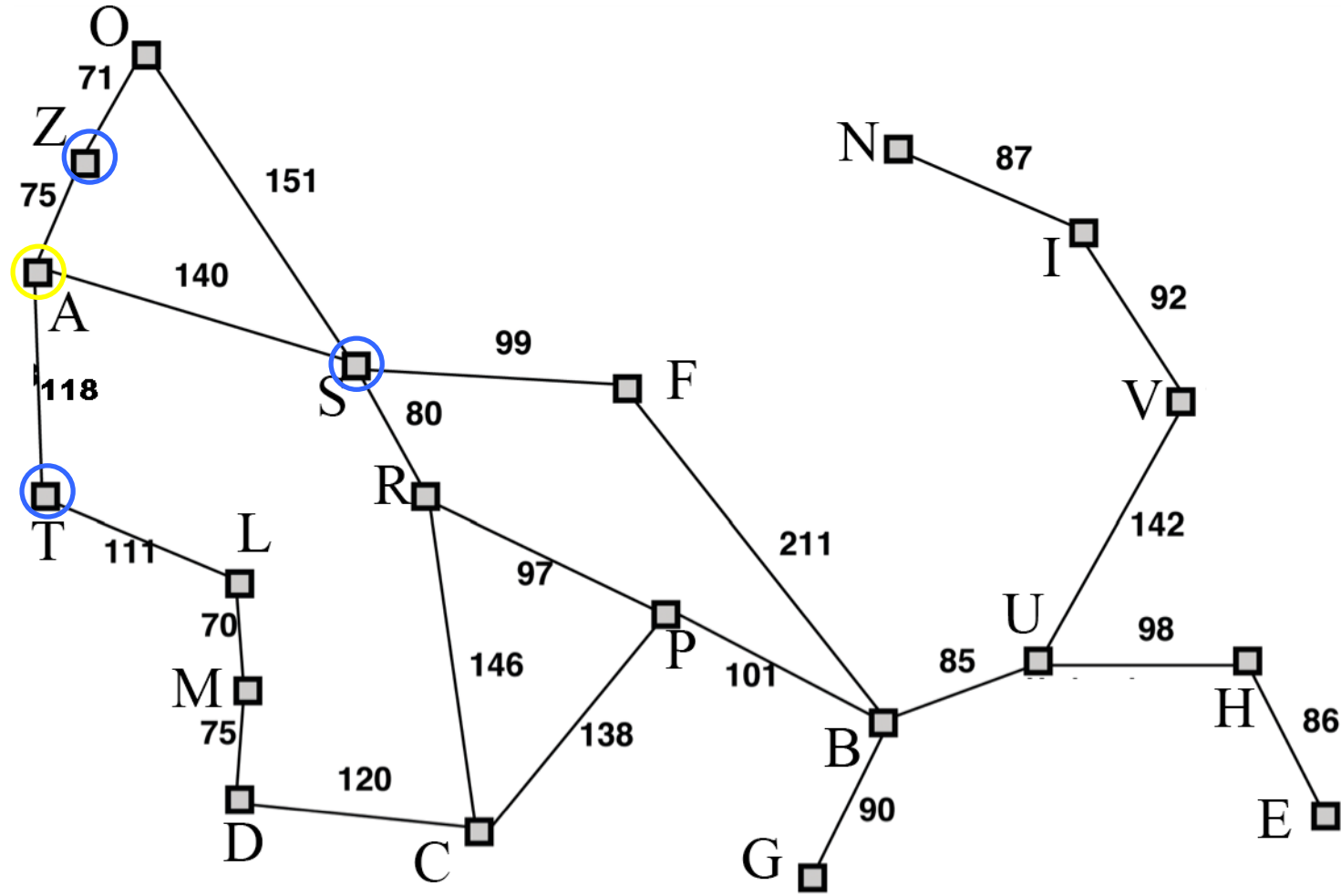
Open: A(366)

Closed:



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

A	366
B	0
C	160
D	242
E	161
F	176
G	77
H	151
I	226
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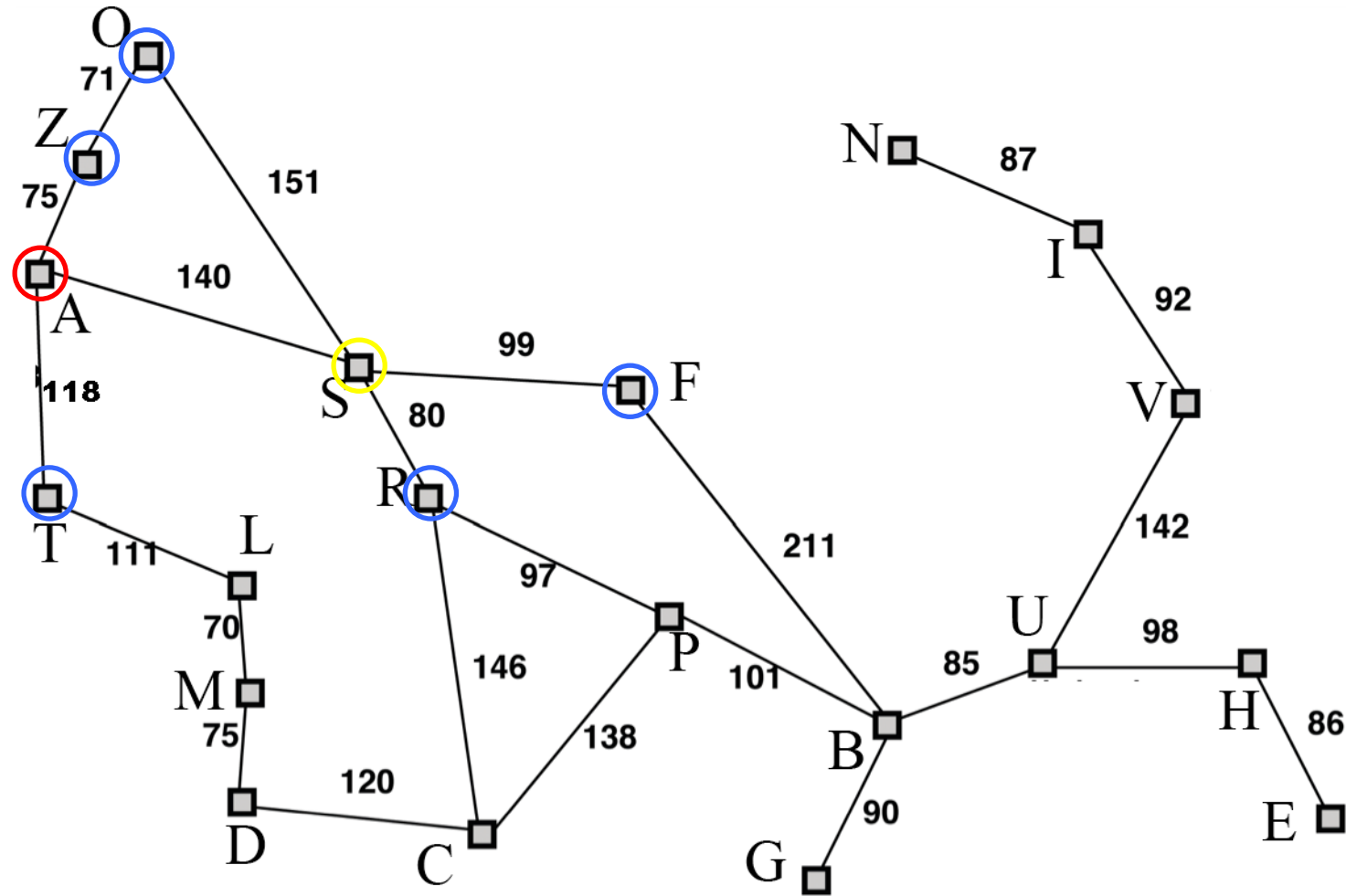


Open: S(253+140=393), T(329+118=447), Z(374+75=449)

Closed: A(366)

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

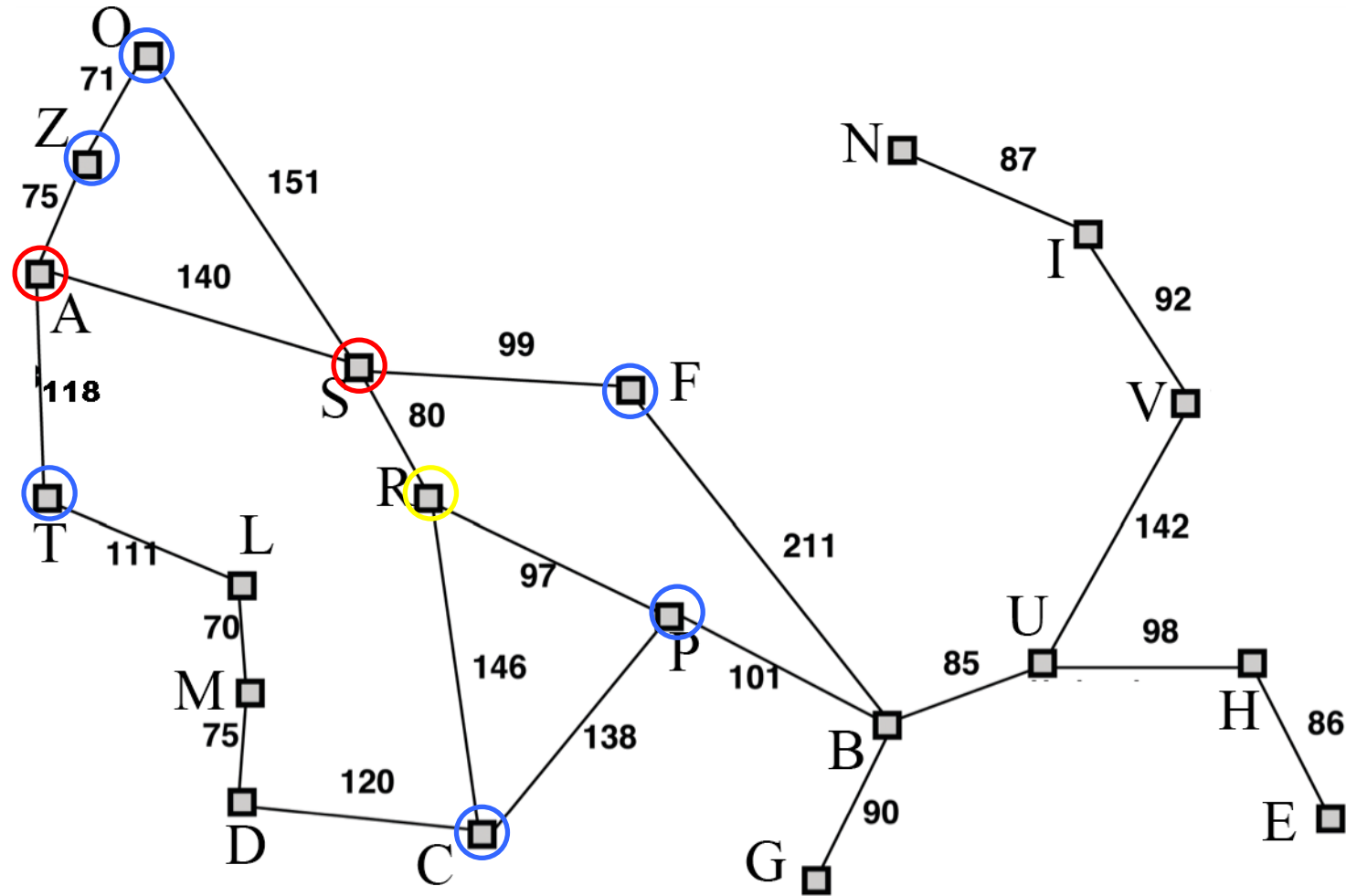
A	366
B	0
C	160
D	242
E	161
F	176
G	77
H	151
I	226
L	244
M	241
N	234
O	380
P	100
S	253
T	329
U	80
V	199
Z	374



Open: R(220+193=413), F(239+176=415), T(329+118=447), Z(374+75=449), O(291+380=671)  
 Closed: S(393), A(366)

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

A	366
B	0
C	160
D	242
E	161
F	176
G	77
H	151
I	226
L	244
M	241
N	234
O	380
P	100
S	253
T	329
U	80
V	199
Z	374

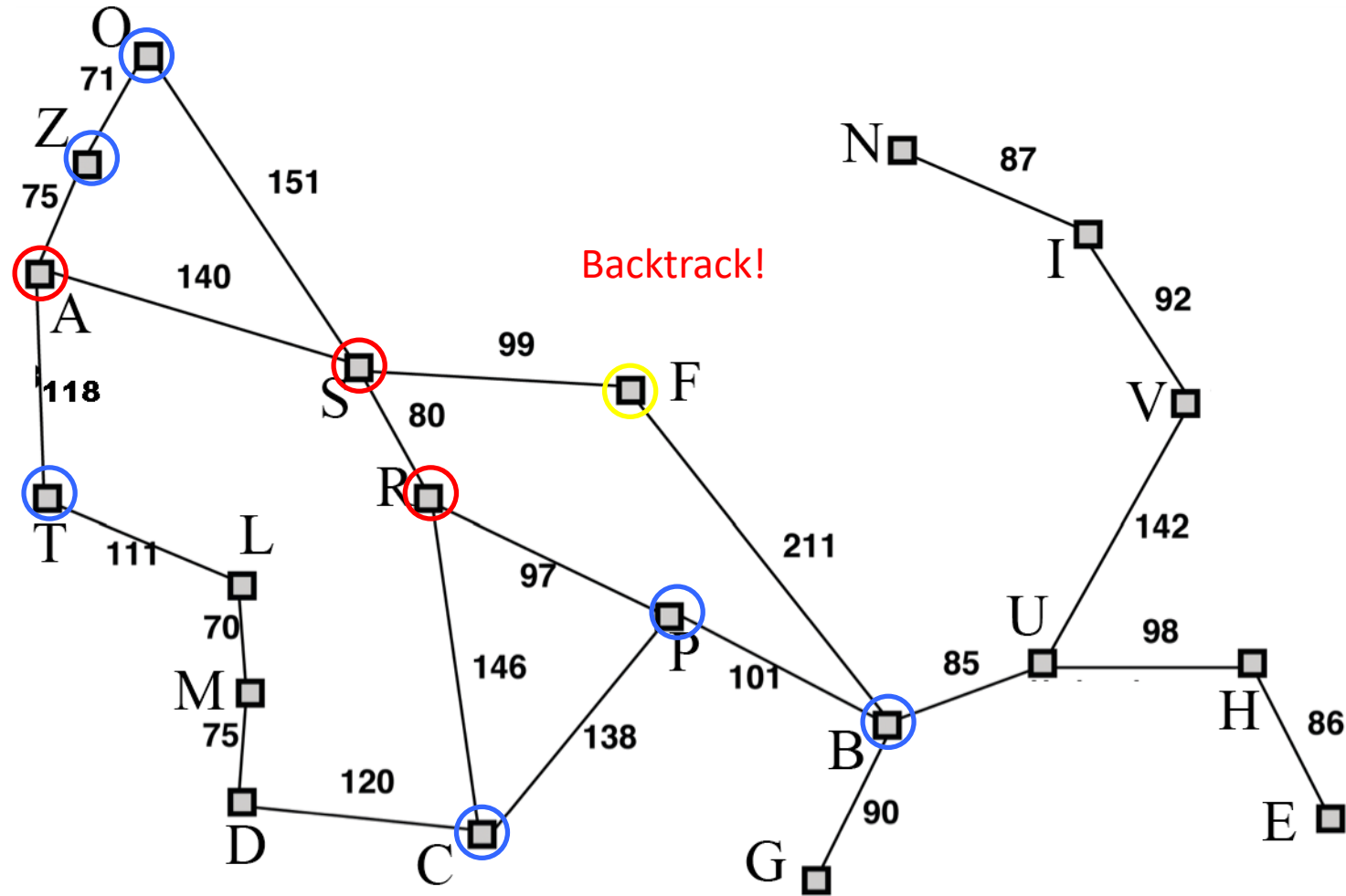


Open: F(239+176=415), P(317+100=417), T(329+118=447), Z(374+75=449), C(366+160=526), O(291+380=671)

Closed: R(413), S(393), A(366)

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

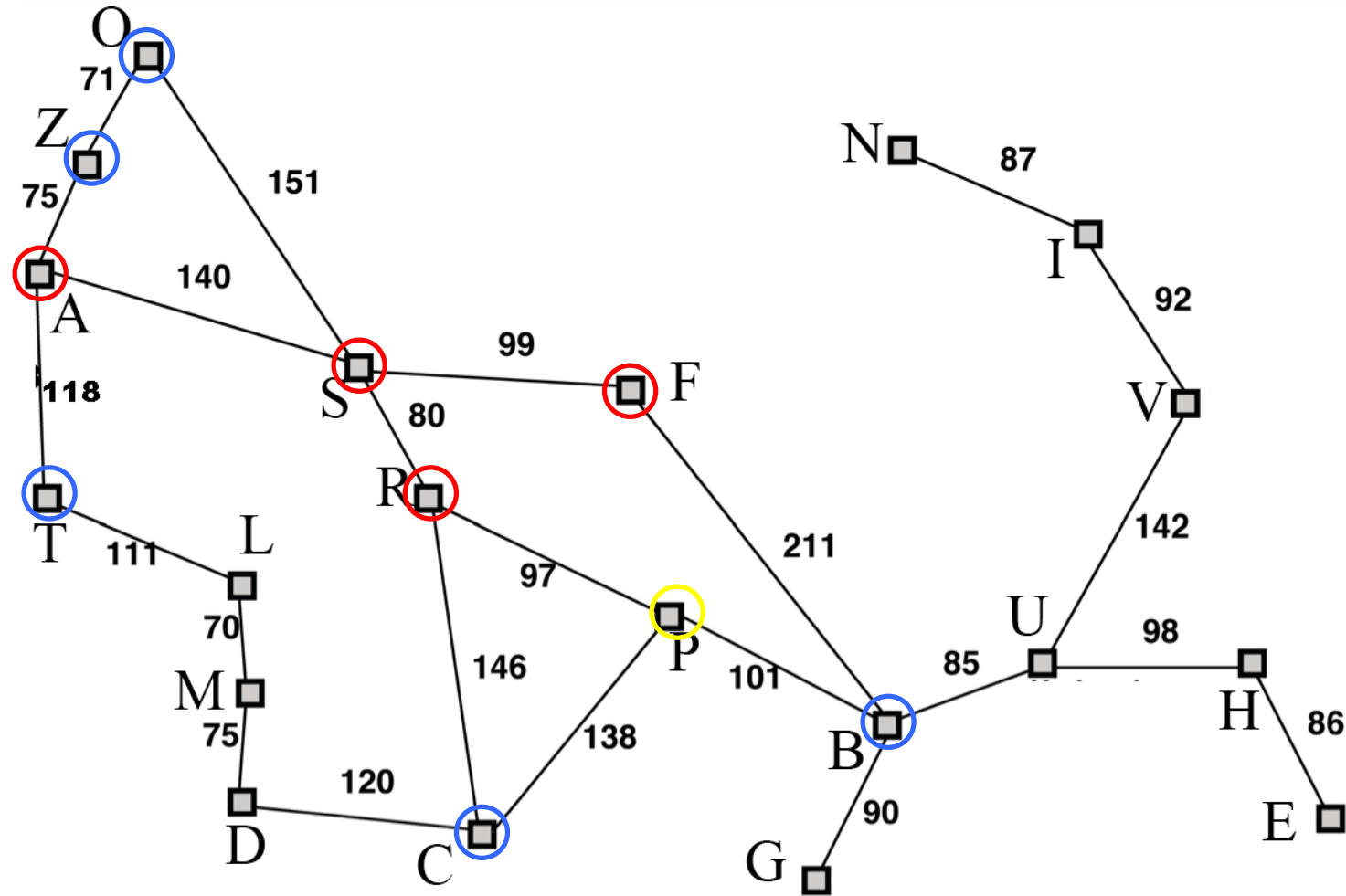
A	366
B	0
C	160
D	242
E	161
F	176
G	77
H	151
I	226
L	244
M	241
N	234
O	380
P	100
S	253
T	329
U	80
V	199
Z	374



Open: P(317+100=417), T(329+118=447), Z(374+75=449), B(450+0=450), C(366+160=526), O(291+380=671)  
 Closed: F(415), R(413), S(393), A(366)

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

A	366
B	0
C	160
D	242
E	161
F	176
G	77
H	151
I	226
L	244
M	241
N	234
O	380
P	100
S	253
T	329
U	80
V	199
Z	374

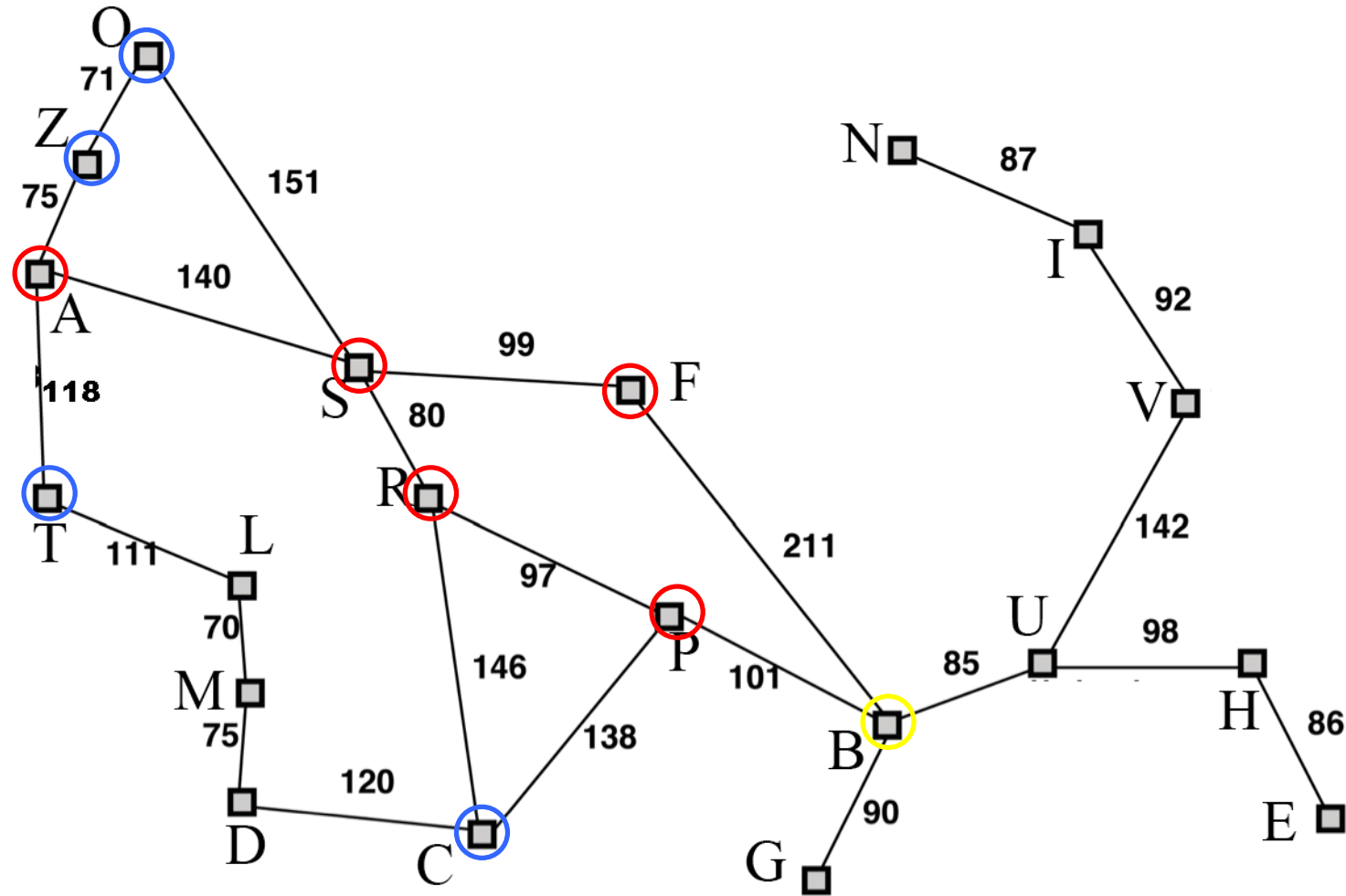


Open: B(418+0=418), T(329+118=447), Z(374+75=449), C(366+160=526), O(291+380=671)

Closed: P(417), F(415), R(413), S(393), A(366)

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

A	366
B	0
C	160
D	242
E	161
F	176
G	77
H	151
I	226
L	244
M	241
N	234
O	380
P	100
S	253
T	329
U	80
V	199
Z	374



Solution: A-S-R-P-B

Open: T(329+118=447), Z(374+75=449), C(366+160=526), O(291+380=671)

Closed: B(418), P(417), F(415), R(413), S(393), A(366)

# A\* Search

- A\* is optimal...
- ...but only if you use an **admissible** heuristic
- An admissible heuristic is mathematically guaranteed to underestimate the cost of reaching a goal
- What is an admissible heuristic for path finding on a path network?