## **Algorithms and Path Planning**

#### **Topics**

- Simple Search
- Depth First Search
- Breadth First Search
- Dijkstra's Search
- Greedy Search
- A\* Search

#### **Classes of interest**

- ECE2400: Computer Systems Programming
- CS4700: Foundations of Artificial Intelligence
- CS4701: Practicum of Artificial Intelligence
- CS3758/MAE4180: Autonomous Mobile Robots

## ECE 3400: Intelligent Physical Systems



## **End Game**

## 5 weeks left till competition day

#### Coverage

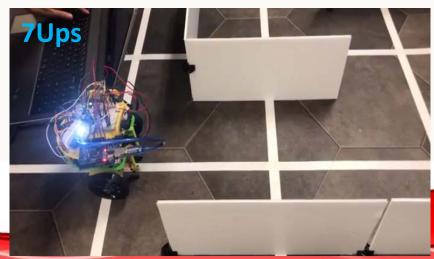
The full mazes will be 9 x 9 squares. The robot that maps the most of the maze correctly (wrt to walls and gaps) in a given round will receive 15 points. All other robots will receive scaled values thereof.

#### Treasures

- For every treasure which is located correctly: 1 point
- For every treasure that is located and color-identified correctly: 1 point
- For every treasure that is located and shape-identified correctly: 1 point
- · For every discovery of a treasure that is not there: -1 point
- The minimum score per round is 0 points; the maximum is 20 points.

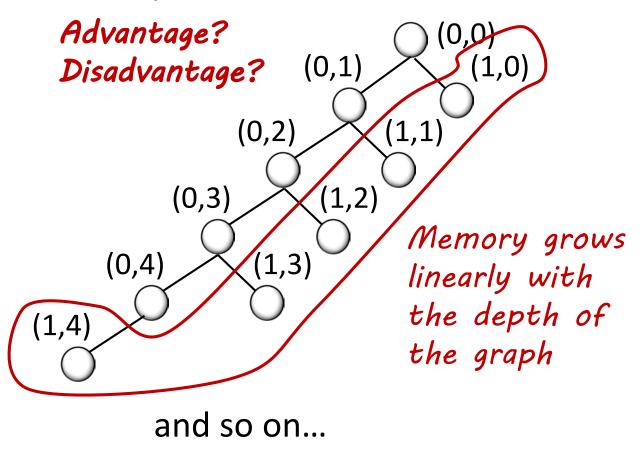
## Can you explore the entire maze?

- 15s avg. for 6 squares
- 3.4min for 81 squares
- Unlikely, but possible.



## Algorithms and Search

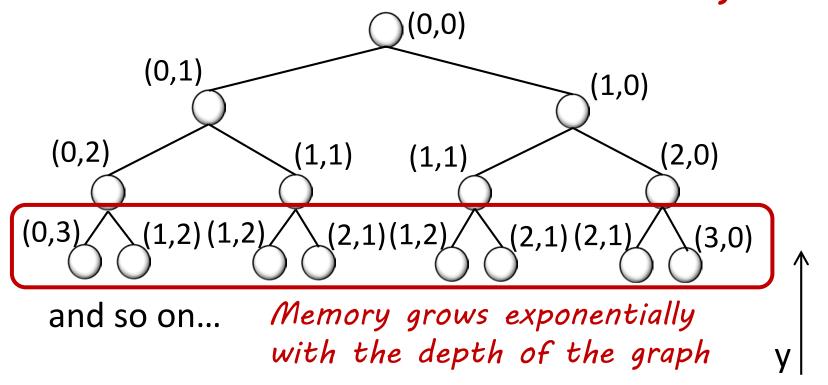
Depth First Search (DFS)

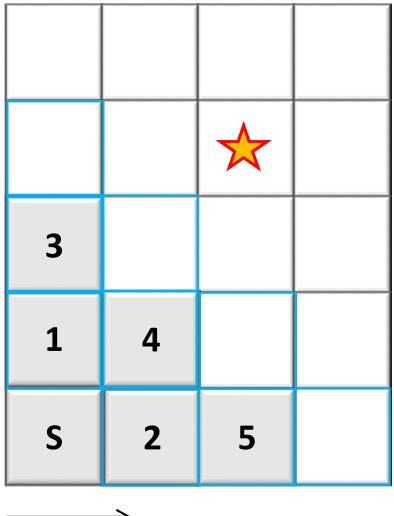


***	8
14	9
13	10
12	11
 <b>&gt;</b>	13

## Algorithms and Search

- Depth First Search (DFS)
- Breadth First Search (BFS) Advantage? Disadvantage?

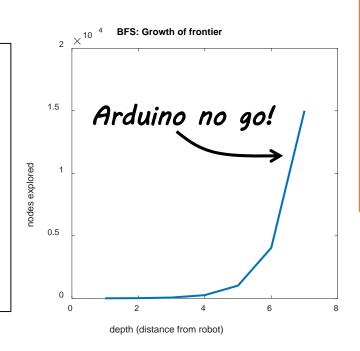


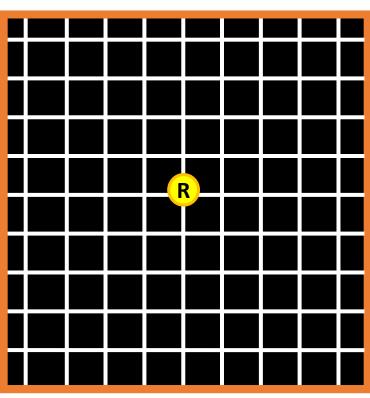


#### What do we need?

- Locations
- Example issue from last year...

```
n = state(init)
frontier.append(n)
while(frontier not empty)
n = pull state from frontier
if n = goal, return solution
for all actions in n
n' = a(n)
frontier.append(n')
```



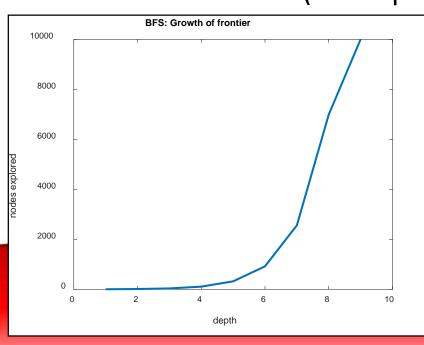


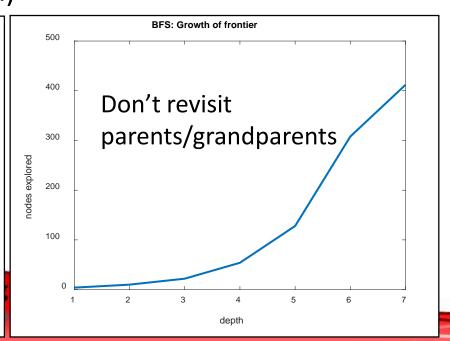
## What do we need?

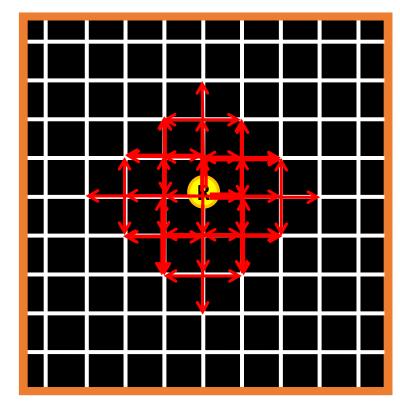
- Locations
- Parents

#### Frontier size:

- 4
- 12
- 36
- etc...
- mem =  $4 \cdot 3^{n-1}$  (n = depth)

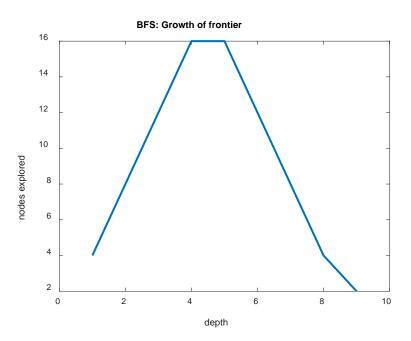




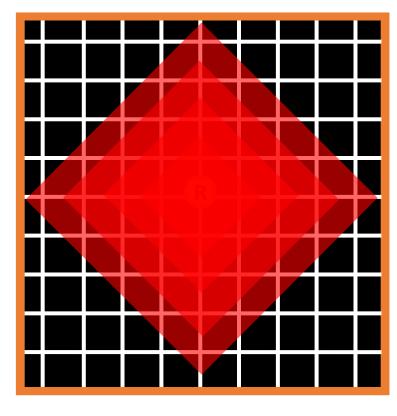


#### What do we need?

- Locations
- Parents
- Visited
  - What is the maximum size of the frontier now?



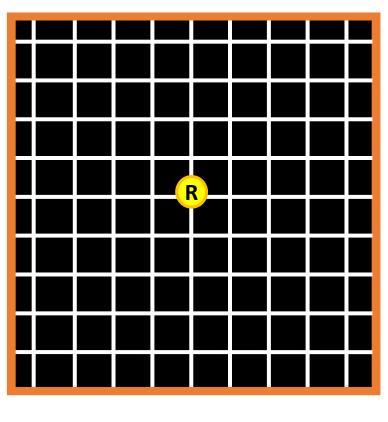
- What is the issue with this approach?
  - Store branches with lowest motion cost!

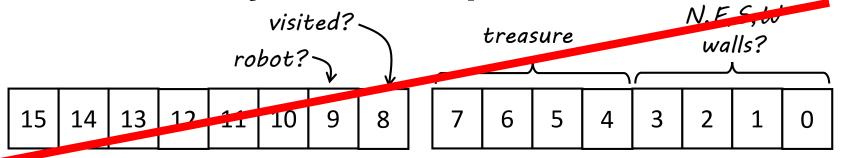


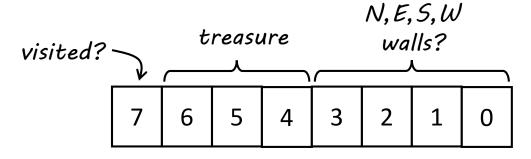
#### What do we need?

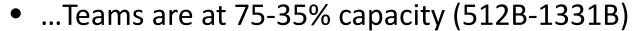
- Locations\*
- Parents\*
- Visited
- Cost\*
- Action\*

```
n = state(init)
frontier.append(n)
visited.append(n)
while(frontier not empty)
   n = pull state from frontier
   if n = goal, return solution
   for all actions in n
      n' = a(n)
      if n' not visited or cost is lower
            frontier.append(n')
            visited.append(n')
```

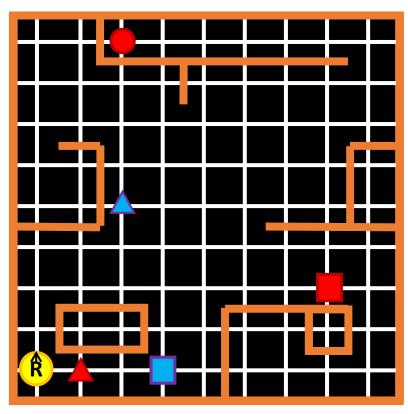




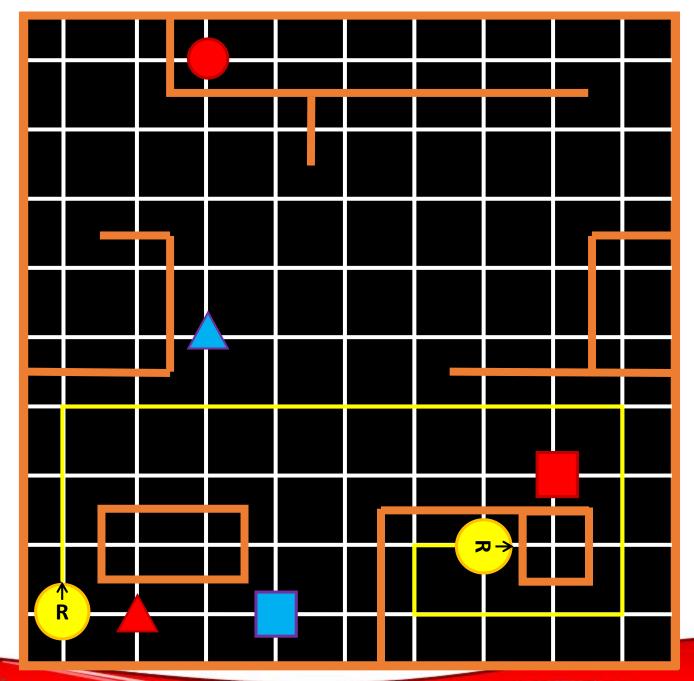




- Frontier (x,y-locations + parent + cost): 80B
- Visited: 81B, or 0B!
- Maze: 162B
- Maze: 81B

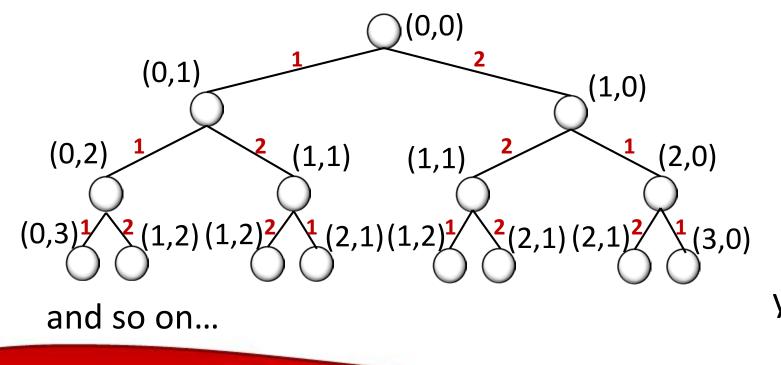


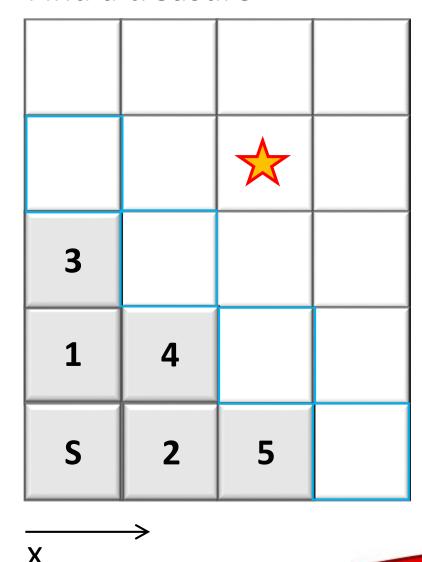
- Depth First Search
  - Search order:
    - Straight
    - Left, then straight
    - Right, then straight
    - U-turn, then straight
- If stuck, find shortest path to the next frontier in the tree
- What treasure does the robot find first?



## **Algorithms and Search**

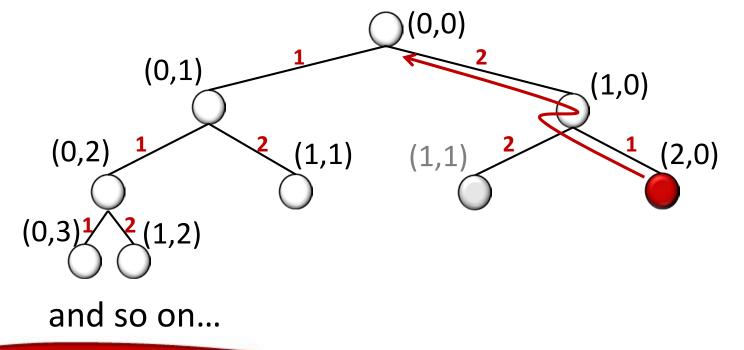
- Depth First Search (DFS)
- Breadth First Search (BFS)
- Add motion cost
- Dijkstra's to save computation/memory





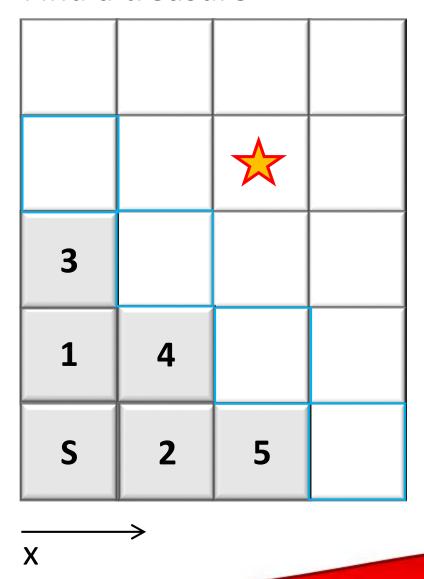
## Algorithms and Search

- Depth First Search (DFS)
- Breadth First Search (BFS)
- Add motion cost
- Dijkstra's to save computation/memory

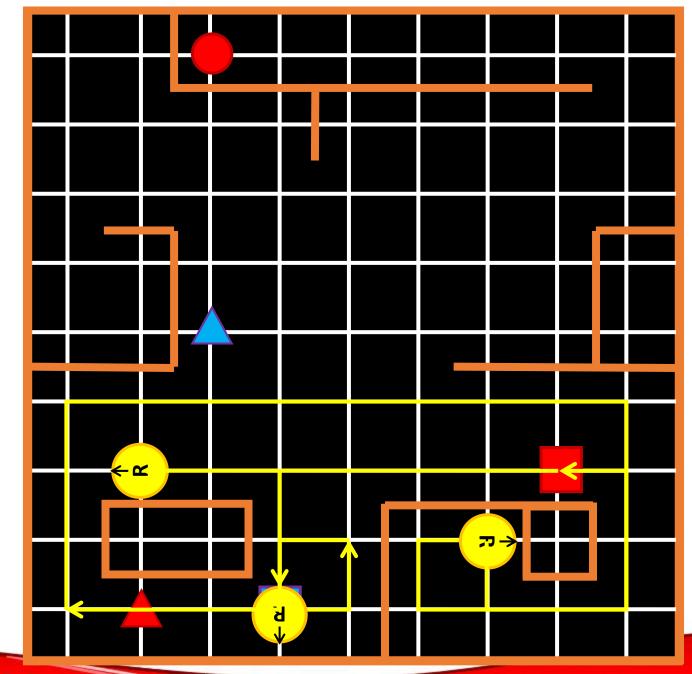


#### Find a treasure

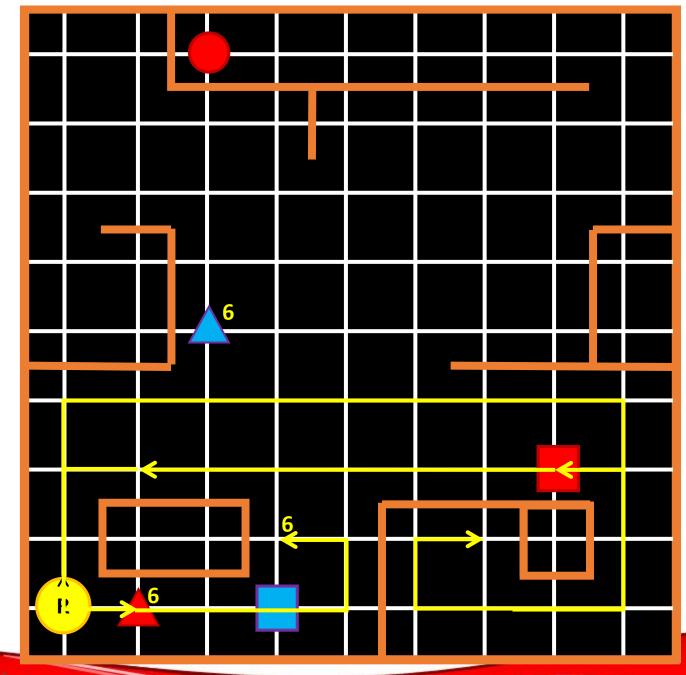
У



- Depth First Search
  - Search order:
    - Straight
    - Left, then straight
    - Right, then straight
    - U-turn, then straight
- If stuck, find shortest path to the next frontier in the tree
- What treasure does the robot find first?
- What treasure does the robot find second?
- Could we be more efficient?

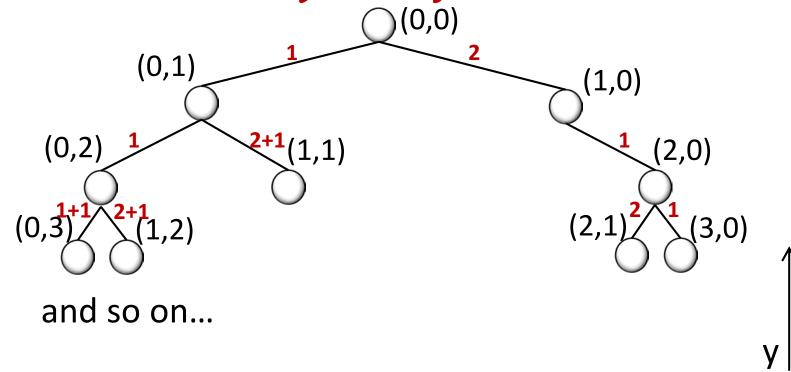


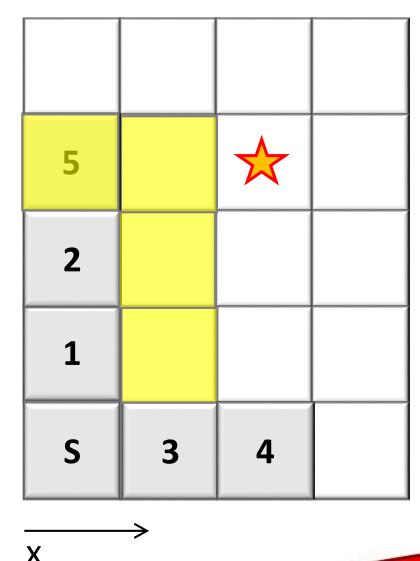
- Dijkstra to find the next frontier
  - Search order:
    - Straight
    - Left, then straight
    - Right, then straight
    - U-turn, then straight
- What treasure does the robot find first?
- Next treasure?
- Extra computation (Dijkstra for every square), but maybe better
- Better path planning?
  - Add cost for revisiting nodes



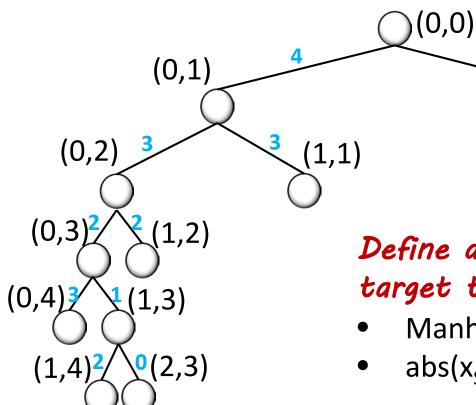
Only reasons about the Find a treasure

- Dijkstra's Search cost to get there...
- Could you be more efficient by looking ahead?





Greedy Search

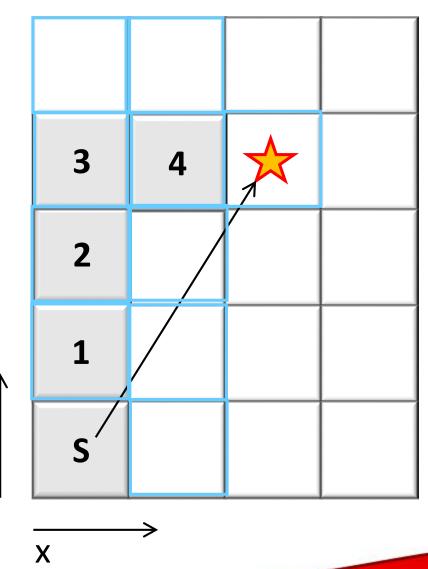


Define a heuristic to target the goal

- Manhatten distance
- $abs(x_S-x_G)+abs(y_S-y_G)$

#### Find a treasure

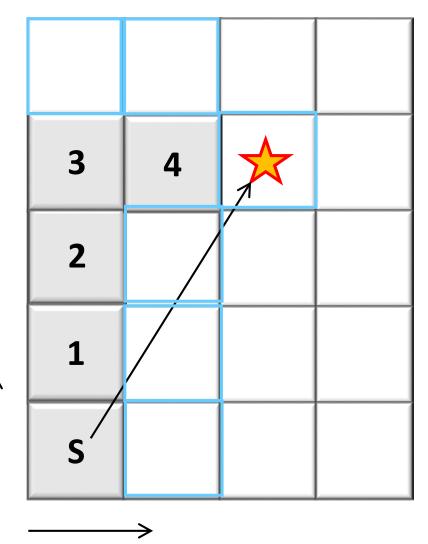
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Greedy Search

## Cause for concern?

```
n = state(init)
frontier.append(n)
while(frontier not empty)
   n = pull state from frontier
   visited.append(n)
   if n = goal, return solution
   for all actions in n
      n' = a(n)
      if n' not visited
            priority = heuristic(goal,n')
            frontier.append(priority)
```



Search order: N, E, S, W

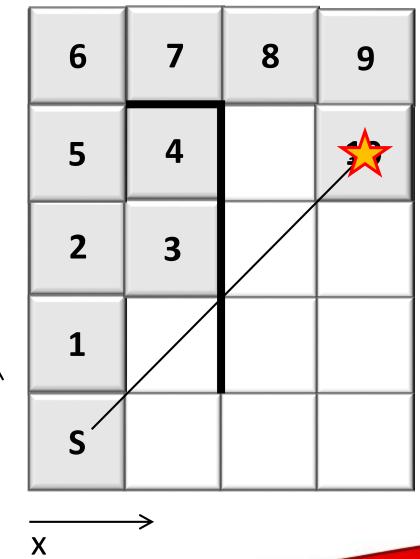
## **Informed Search**

**Greedy Search** 

Cause for concern?

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Faster, but does not guarantee optimal

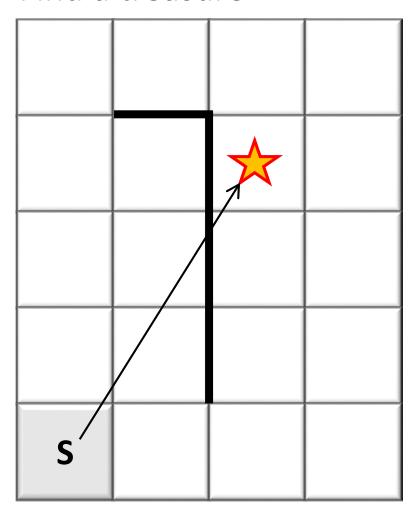


- Breadth First Search
  - Guarantee: Finds a path
  - Searches everything
- Dijkstra's Algorithm Considers parent cost
  - Guarantee: Finds the shortest path
  - ...but it wastes time exploring in directions that aren't promising
- Greedy Search Considers goal
  - Guarantee: Finds a path
  - …only explores promising directions

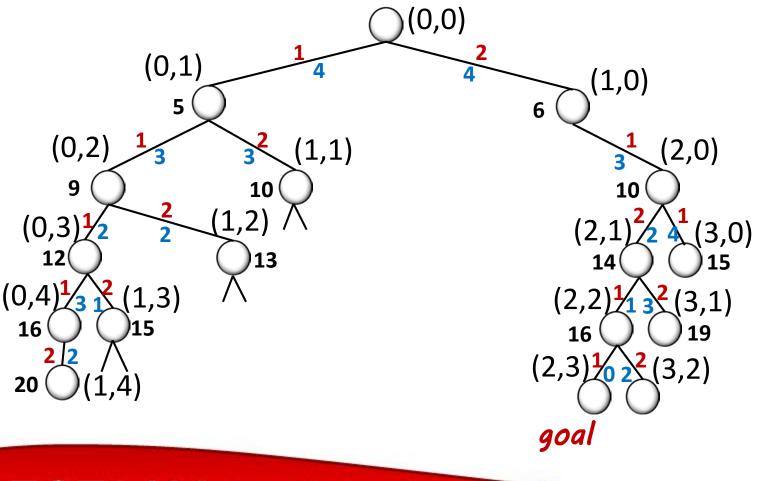
Can we do better?

A\* ("A-star")

```
n = state(init)
frontier.append(n)
while(frontier not empty)
   n = pull state from frontier
   if n = goal, return solution
   for all actions in n
      n' = a(n)
      if ((n' not visited or
         (visited and n'.cost < n old.cost))
            priority = heuristic(goal,n')+cost
            frontier.append(priority)
            visited.append(n')
```

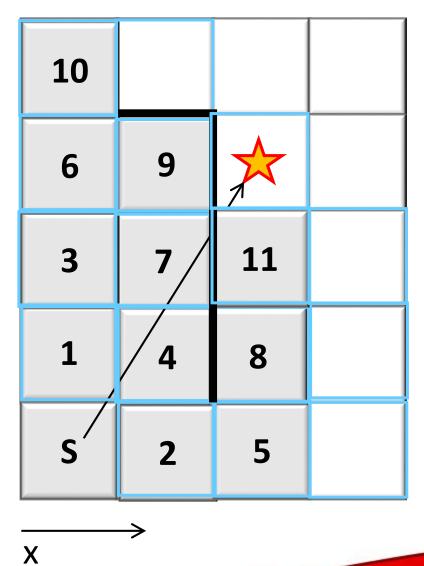


- A\* ("A-star")
  - Cost and goal heuristic



#### Find a treasure

У



- What if the heuristic is too optimistic?
  - Estimated cost < true cost</li>
- What if the heuristic is too pessimistic?
  - Estimated cost > true cost
  - No longer guaranteed to be optimal
- What if the heuristic is just right?
  - Pre-compute the cost between all nodes
  - Feasible for you?



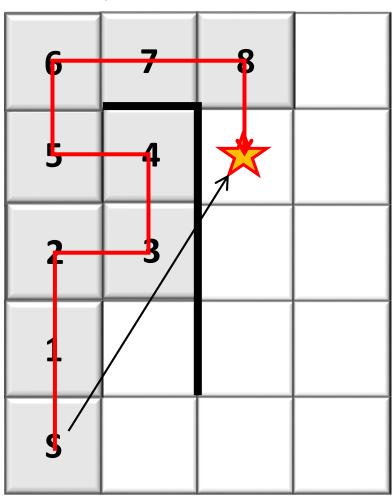
inadmissible heuristic



## **Summary**

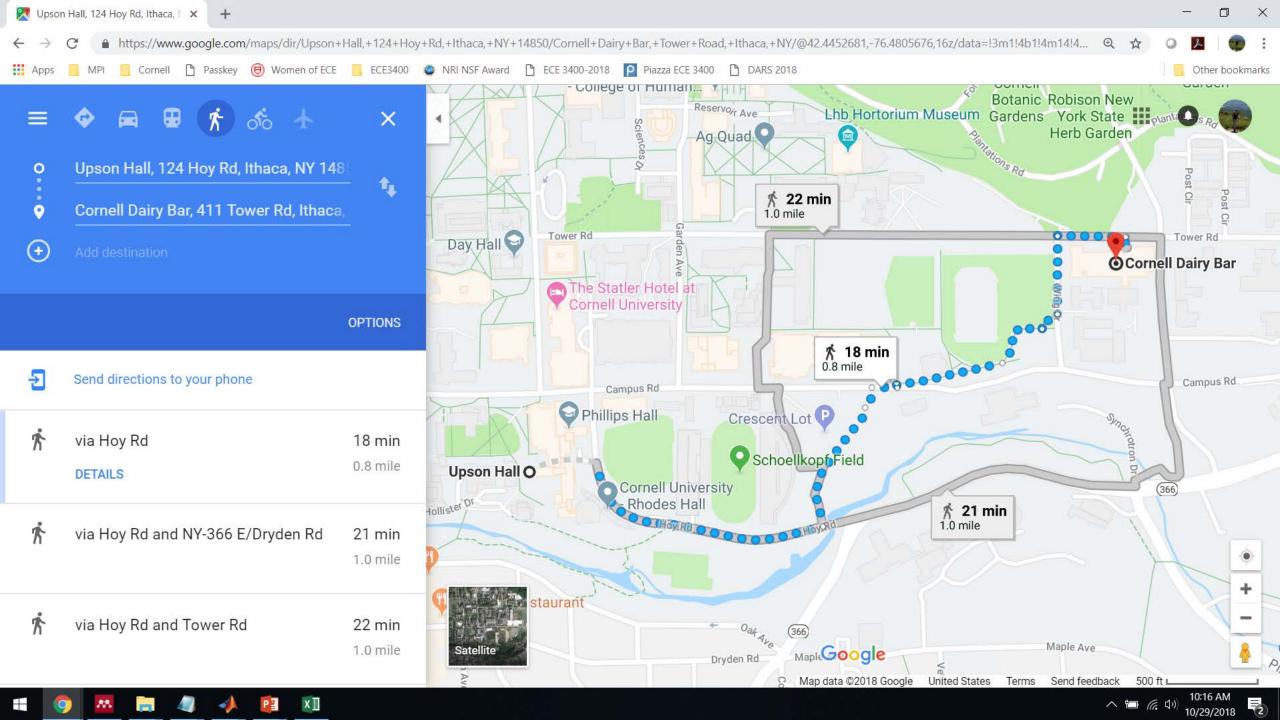
Dijkstra *minimum path* Greedy

7	12	15	
4	10	*	
2	8	13	
1	5	11	14
S	3	-6	9



minimum path and efficient

10			
6	9		
3	7/	11	
1	4	8	
s	2	5	



## **Game Theory**

- Pick a whole number between 1 and 100.
- The winner is the person who picks the value which is closest to two thirds of the class average.
- E.g.
  - [10, 20, 60].
  - Class average 30.
  - Winner: 20.
- https://bit.ly/2z9R56F
- The poll will close at the end of the class (12.10pm) 10/29<sup>th</sup>)



# Go Build Robots!



Class website: <a href="https://cei-lab.github.io/ece3400-2018/">https://cei-lab.github.io/ece3400-2018/</a>

Piazza: <a href="https://piazza.com/cornell/fall2018/ece3400/home">https://piazza.com/cornell/fall2018/ece3400/home</a>