## Motion planning: Beyond Navmeshes

CMSC425.01 Fall 2019

## Today's questions

Big question: Making intelligent agents First question: Navigation

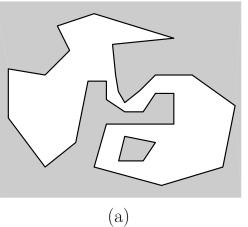
# Finding paths in polygonal configuration space

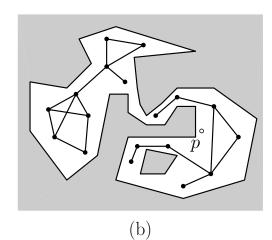
Version 1: Navmesh

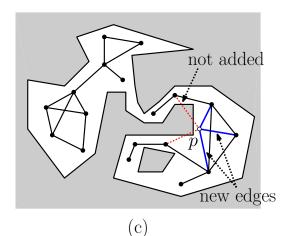
• Others?

Version 7: Randomized

placement (sampling)



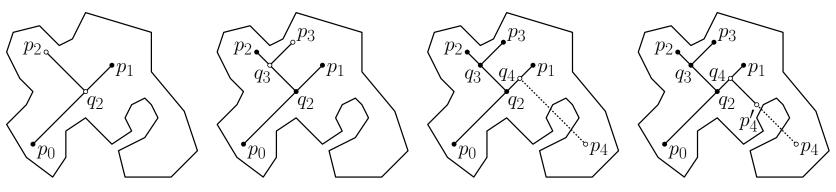




## Finding paths in polygonal configuration space

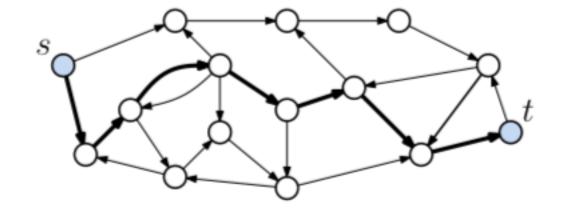
- Version 1: Navmesh
- Others?

 Version 8: Rapidly-expanded Random Trees (RRTs)



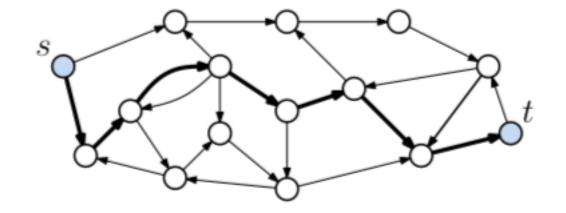
## Computing shortest path

- Reduce navigation to path finding in graphs
  - Directed?
  - Weighted?
- $\bullet$  G = (V, E)
  - Vertices  $V = \{u, v, ...\}$
  - Edges  $E = \{ (u, v), ... \}$
  - Weight function  $w(u, v) \rightarrow reals$



## Computing shortest path

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- Path sequence of nodes
  - $\bullet P = \langle u_{0}, u_{1}, \dots, u_{k} \rangle$
- Path cost
  - $cost(P) = \sum_{i=0}^{k} w(u_{i}, u_{i+1})$
- Lowest cost path  $\partial(s,t)$

## First: what's the problem?

Compute one shortest path?

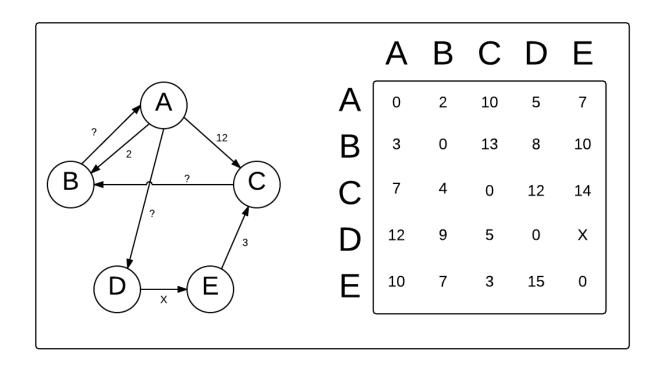
Compute all shortest paths to store?

## First: what's the problem?

Compute path here to there?

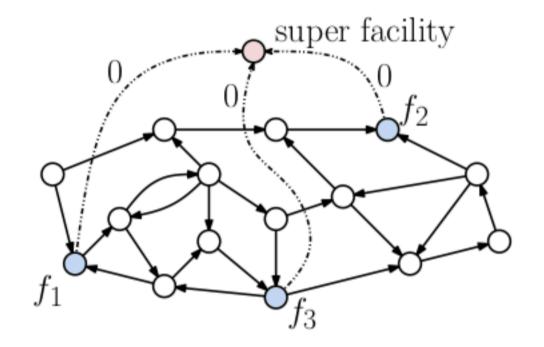
- Find fastest way to home base?
  - Reverse edges
  - Find shortest path to all from home
- Find closest facility (health, etc)?
  - Add Supernode connected to all facilities.

- Compute all shortest paths to store?
  - Floyd-Warshall



## First: what's the problem?

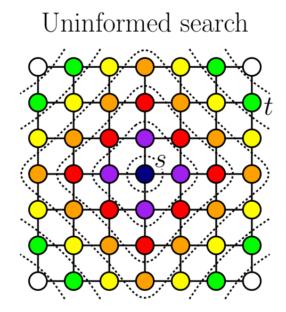
- Find closest facility (health, etc)?
  - Add Supernode connected to all facilities.



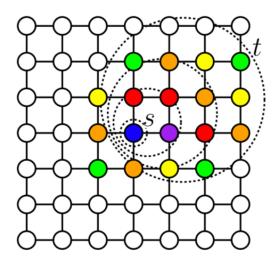
#### Uninformed vs. informed search

- Uninformed follow weights
  - Pick next node on distance to d[u]
- Informed add bias towards destination

- Heuristic
  - Pick next node on distance to goal h(u)

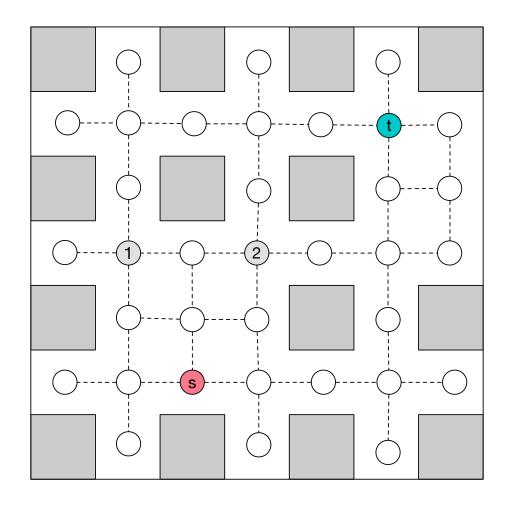


Informed search



#### Informed search

- Distance functions
  - w(u,v) distance node u to v
  - d[u] distance traversed from start to node u
  - dist(u,t) distance from u to t
- w(s,1) = \_\_\_\_ dist(1,t) =\_\_\_\_
- w(s,2) = \_\_\_ dist(1,t) = \_\_\_\_



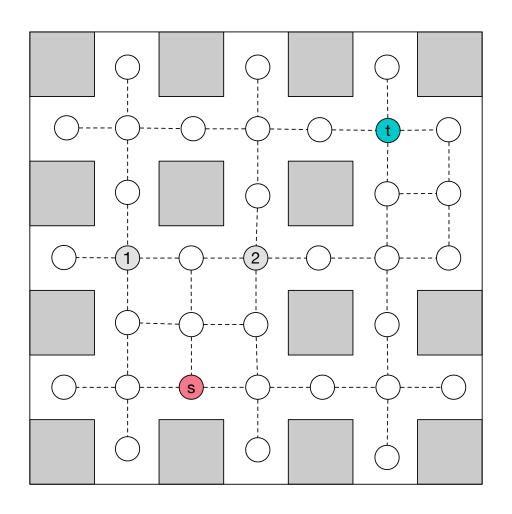
#### Informed search

- Distance functions
  - w(u,v) distance node u to v
  - d[u] distance traversed from start to node u
  - dist(u,t) distance from u to t

• 
$$w(s,1) = 3$$
  $dist(1,t) = 6$ 

• 
$$w(s,2) = 3$$
  $dist(1,t) = 4$ 

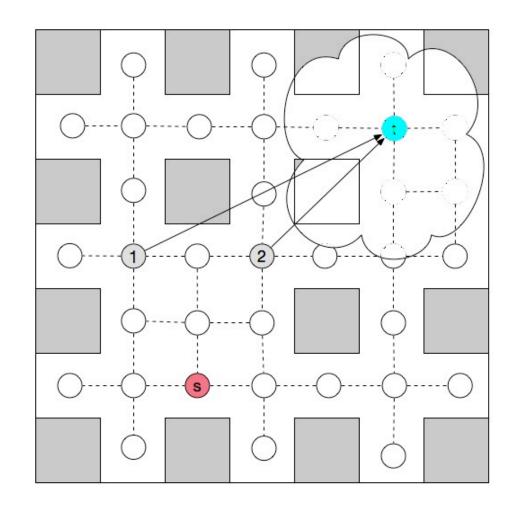
• dist(u,t) is a *heuristic* 



## Less perfect information?

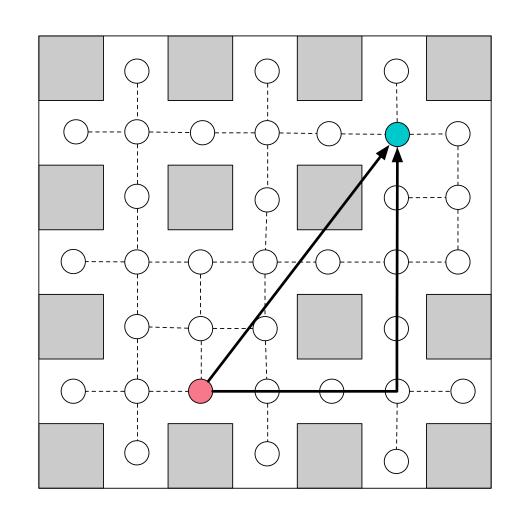
- Can't see rest of graph until you expand it
- Need guess on what's to come

- dist(u,t) as Euclidean distance
- Approximates actual cost



#### Footnote

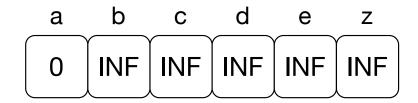
- Euclidean distance
  - distE(p1,p2) = sqrt((x1-x2)^2 + (y1-y2)^2)
- Manhattan distance
  - distM(p1,p2) = abs(x1-x2) + abs(y1-y2)



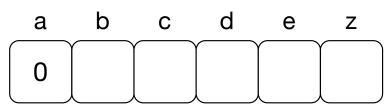
```
Dijkstra(G, s, t) {
foreach (node u) {
                                      // initialize
  d[u] = +infinity; mark u undiscovered
d[s] = 0; mark s discovered // distance to source is 0
repeat forever {
                                      // go until finding t
  let u be the discovered node that minimizes d[u]
                          // arrived at the destination
  if (u == t) return d[t]
  else {
    for (each unfinished node v adjacent to u) {
      d[v] = min(d[v], d[u] + w(u,v)) // update d[v]
      mark v discovered
    mark u finished
                                      // we're done with u
```

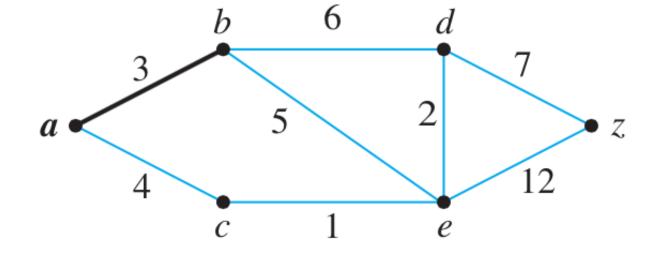
## Example

- w(u,v) as given
- Start with d array as



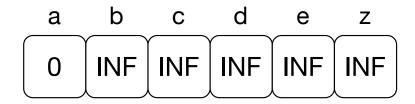
• End with?



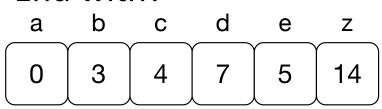


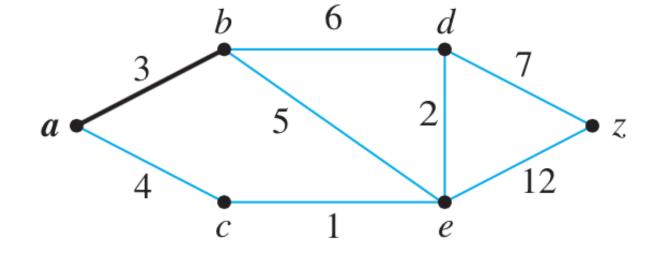
## Example

- w(u,v) as given
- Start with d array as



• End with?

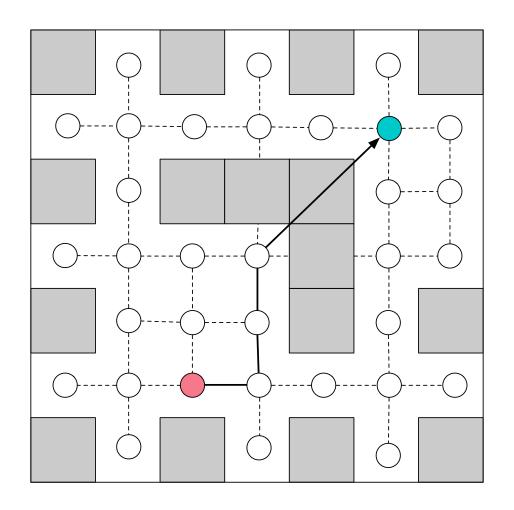




```
BestFirst(G, s, t) {
 foreach (node u) {
                                      // initialize
  d[u] = +infinity; mark u undiscovered
d[s] = 0; mark s discovered // distance to source is 0
 repeat forever {
                                      // go until finding t
  let u be the discovered node that minimizes dist(u,t)
   if (u == t) return d[t]
                          // arrived at the destination
  else {
    for (each unfinished node v adjacent to u) {
      d[v] = min(d[v], d[u] + w(u,v)) // update d[v]
      mark v discovered
    mark u finished
                                      // we're done with u
```

### Best first bad case ...

• Trapped in local minimum



#### **A**\*

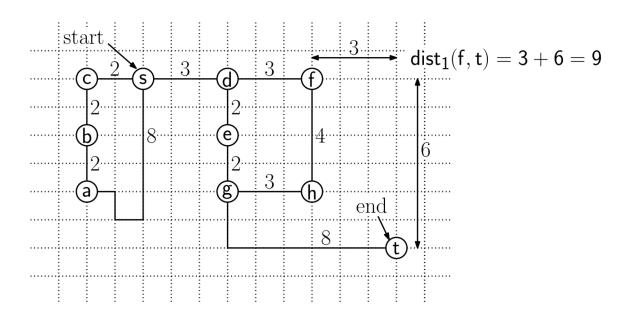
 Pick next node to expand based on sum of distance so far and heuristic

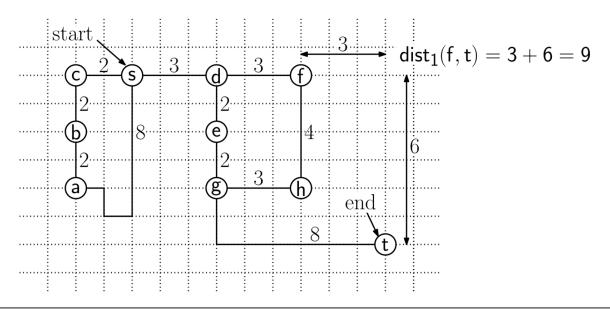
$$f(u) = d[u] + h(u) = d[u] + \operatorname{dist}(u, t)$$

```
A-Star(G, s, t) {
 foreach (node u) {
                                      // initialize
  d[u] = +infinity; mark u undiscovered
 d[s] = 0; mark s discovered // distance to source is 0
 repeat forever {
                                      // go until finding t
   let u be the discovered node that minimizes d[u] + dist(u,t)
                              // arrived at the destination
   if (u == t) return d[t]
   else {
    for (each unfinished node v adjacent to u) {
      d[v] = min(d[v], d[u] + w(u,v)) // update d[v]
      mark v discovered
    mark u finished
                                       // we're done with u
```

## A\* Example

Manhattan distance





A* Search – Each entry is $d[u]: f(u)$										
Stage	d[s]	d[a]	d[b]	d[c]	d[d]	d[e]	d[f]	d[g]	d[h]	d[t]
h(u)	15	13	15	17	12	10	9	8	5	0
Init	0:15	∞:13	∞:15	∞:17	∞:12	∞:10	∞:9	∞:8	$\infty:5$	$\infty:0$
1: s	0	8:13	_	2:17	<u>3:12</u>	_	_	_	_	_
2: d	$\downarrow$	8:13	_	2:17	3	<u>5:10</u>	6:9	_	_	_
3: e		8:13	_	2:17	↓	5	<u>6:9</u>	7:8	_	_
4: f		8:13	_	2:17		↓	6	7:8	_	<u>15:0</u>
5: t		8:13	_	2:17			$\downarrow$	7:8	_	15
Final	0	8	$\infty$	2	3	5	6	7	$\infty$	15

#### Good heuristics

• For A\* to compute correctly the heuristic h(u) must be:

 Admissible: h(u) never overestimates the graph distance from node u to goal t

• Consistent:  $h(u') \le delta(u',u'') + h(u'')$