

# Motion planning

## Chapter 10

Introduction to Robotics:  
Mechanics, Planning, and Control  
Frank Park and Kevin Lynch

## Some definitions

- $q$  is the configuration (e.g.,  $q = (\theta_1, \dots, \theta_n)$ )
- $C$  is the configuration space (C-space)
- $C_{\text{free}}$  is the collision-free C-space
- $x = (q, v)$  is the state
- $q(x)$  returns the configuration associated with  $x$
- $u$  is a control
- $U$  is the set of possible controls

# The problem definition

Equations of motion:

$$\begin{aligned} \dot{x} &= f(x, u) \\ \text{or } x(T) &= x(0) + \int_0^T f(x(t), u(t)) dt \end{aligned} \quad (10.2)$$

*Given an initial state  $x(0) = x_{start}$  and a desired final state  $x_{goal}$ , find a time  $T$  and a set of controls  $u : [0, T] \rightarrow \mathcal{U}$  such that the motion (10.2) satisfies  $x(T) = x_{goal}$  and  $q(x(t)) \in \mathcal{C}_{free}$  for all  $t \in [0, T]$ .*

# Types of motion planning problems

- Path planning (piano mover's) vs. motion planning
- Fully actuated vs. underactuated (e.g., a car)
- Online vs. offline
- Optimal vs. satisficing
- Exact vs. approximate
- With vs. without obstacles

# Properties of motion planners

- Multiple queries vs. single queries
- “Anytime” planning
- Completeness
  - complete
  - resolution complete
  - probabilistically complete
- Computational complexity

# Motion planning methods

- Complete methods
- Grid methods
- Sampling methods
- Virtual potential fields
- Nonlinear optimization

# A summary of (many) path planning methods

robot + obstacles  $\rightarrow$

discretized graph representation of  $C_{\text{free}}$   $\rightarrow$

search of that graph for a path from  $q_{\text{start}}$  to  $q_{\text{goal}}$

# C-space obstacles: 2R arm

Robot's configuration is treated as a point in C-space.

Q: How many connected components does  $C_{\text{free}}$  have?

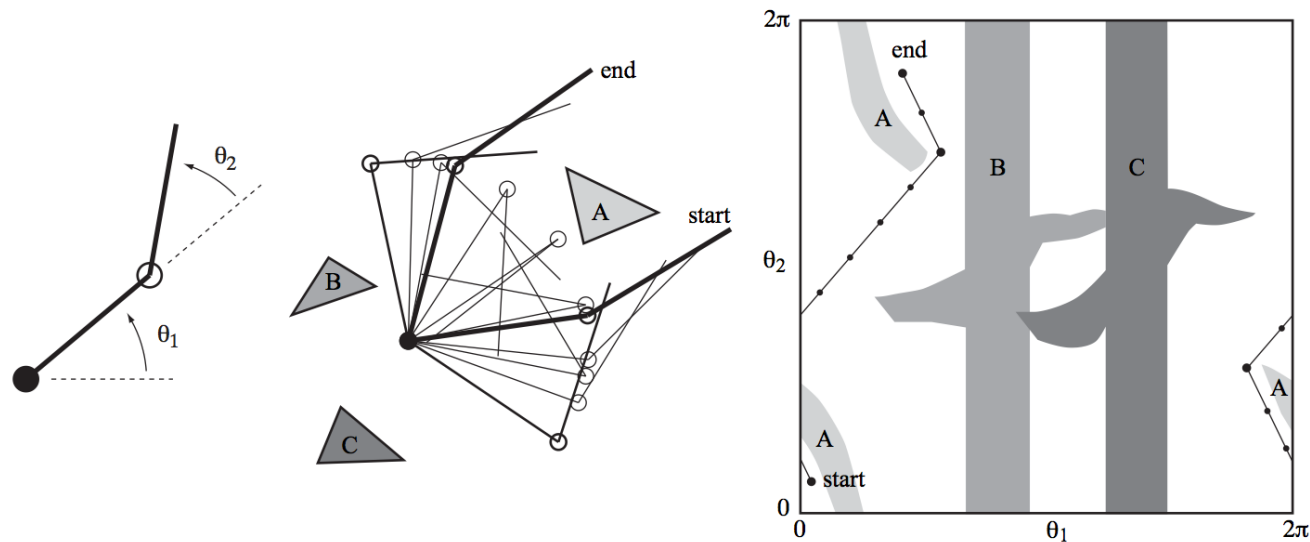


Figure 10.2: (Left) The joint angles of a 2R robot arm. (Middle) The arm navigating among obstacles. (Right) The same motion in C-space.



# C-space obstacles: circular mobile robot

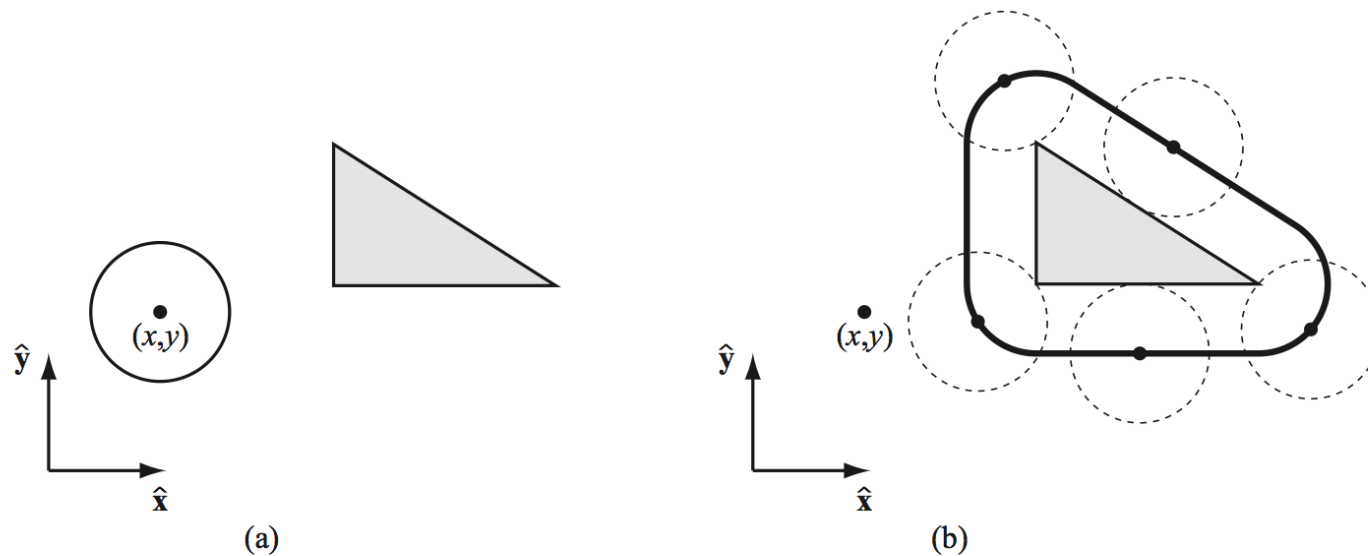
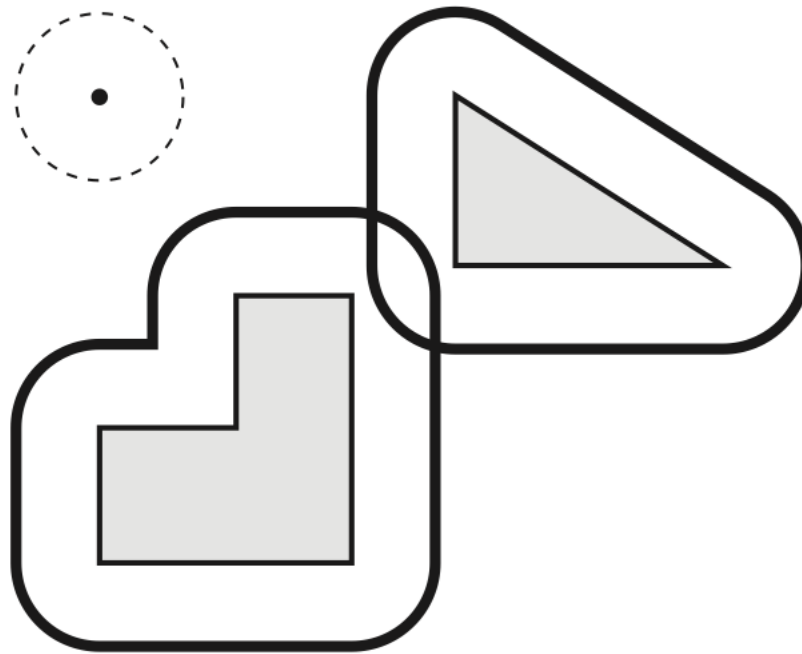
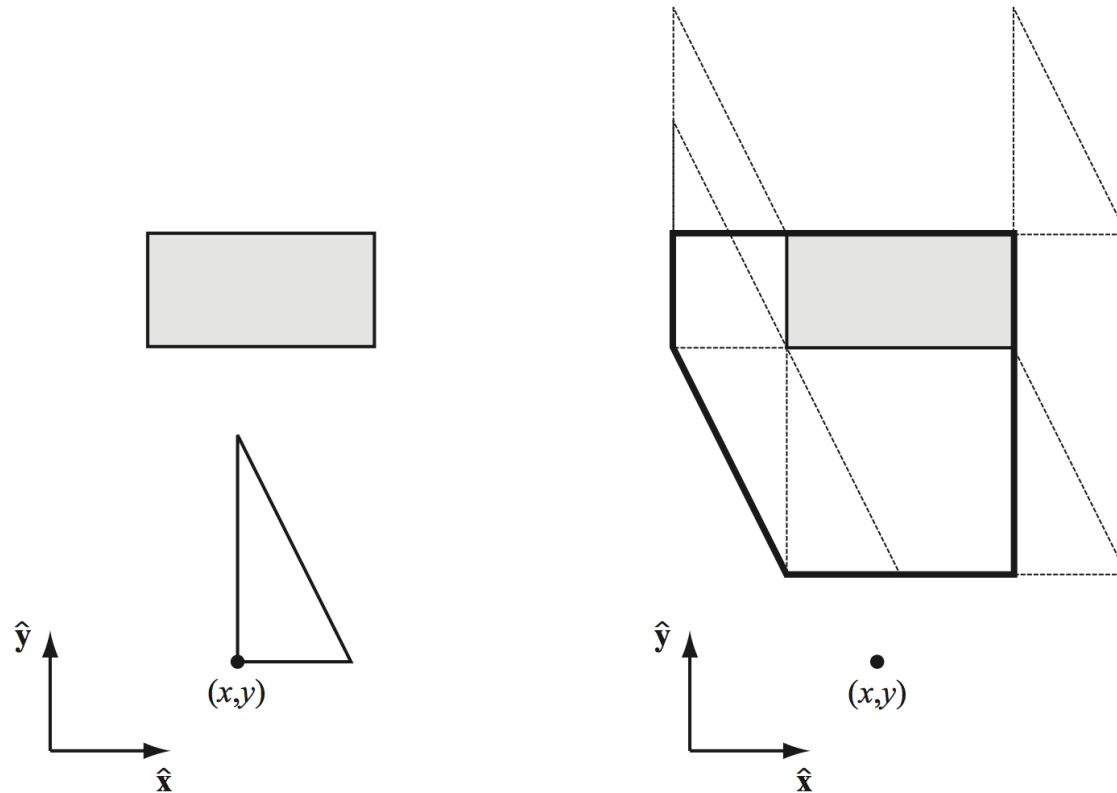


Figure 10.3: (a) A circular mobile robot (white) and a workspace obstacle (grey). The configuration of the robot is represented by  $(x,y)$ , the center of the robot. (b) In the C-space, the obstacle is “grown” by the radius of the robot and the robot is treated as a point. Any  $(x,y)$  configuration outside the dark boundary is collision-free.

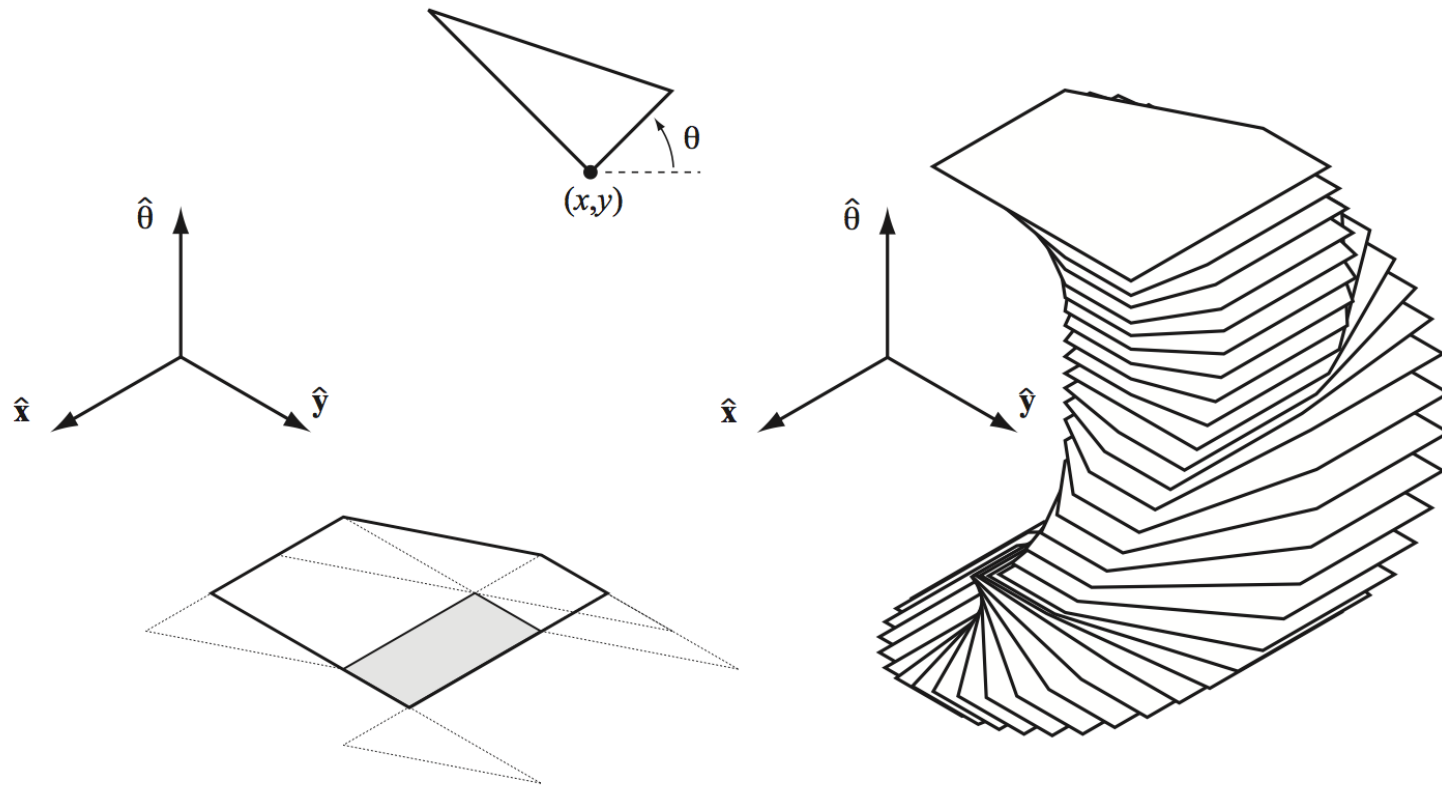
## C-space obstacles: circular mobile robot



# C-space obstacles: polygonal mobile robot



# C-space obstacles: rotating/translating polygon



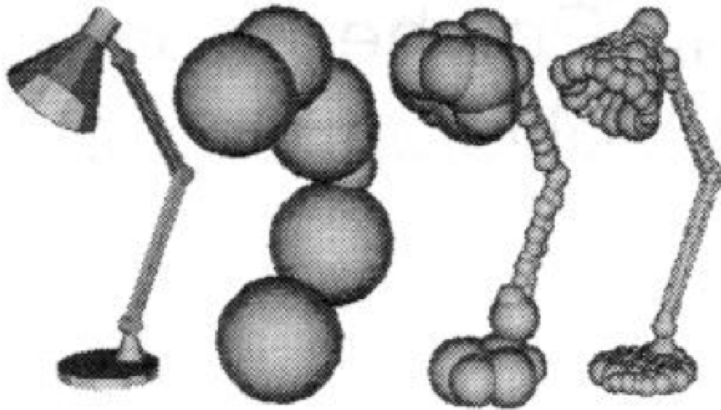
## Distance to C-obstacle $\mathcal{B}$

$d(q, \mathcal{B}) > 0$	no contact with the obstacle
$d(q, \mathcal{B}) = 0$	contact
$d(q, \mathcal{B}) < 0$	penetration.

*A distance-measurement algorithm* returns  $d$ .

*A collision-detection algorithm* returns true if  $q$  is in collision, false otherwise.

# An approximation approach

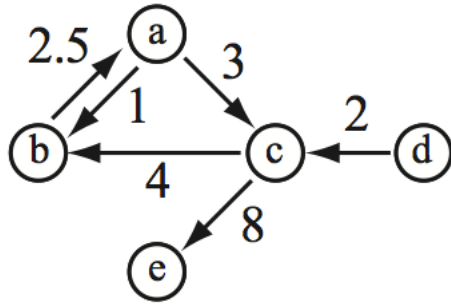


$r_i(q)$  is the center of robot sphere  $i$   
 $R_i$  is the radius of robot sphere  $i$   
 $b_j$  is the center of obstacle sphere  $j$   
 $B_j$  is the radius of obstacle sphere  $j$

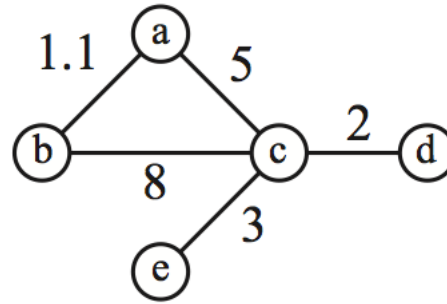
$$d(q, \mathcal{B}) = \min_{i,j} \|r_i(q) - b_j\| - R_i - B_j$$

Other primitives (cylinders, rectangular prisms, meshes or polygon soups) can also be used, with increasing accuracy and computational complexity.

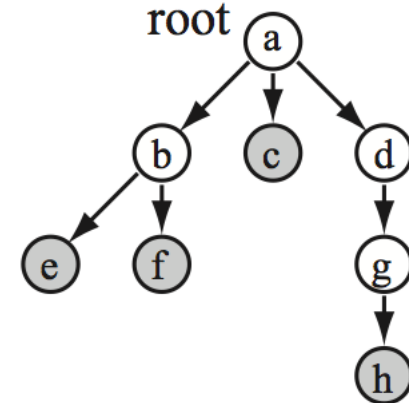
# Graphs and trees



weighted directed  
graph (digraph)



weighted  
undirected graph



tree  
(leaves are in gray)

# Complete path planning using a roadmap

Reduce the complex high-dimensional  $C_{\text{free}}$  to a one-dimensional roadmap  $R$  (or a graph) with the following properties:

- (i) *Reachability*. From every point  $q \in C_{\text{free}}$ , a free path to a point  $q' \in R$  can be found trivially (e.g., a straight-line path).
- (ii) *Connectivity*. For each connected component of  $C_{\text{free}}$ , there is one connected component of  $R$ .

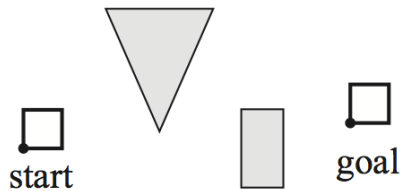


# Constructing a roadmap

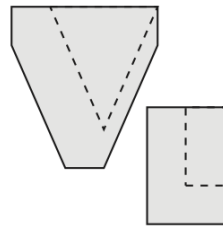
Very difficult to do in general (see John Canny's PhD thesis, 1988), but

- easy for some simple problems
- approximations are possible (e.g., probabilistic roadmap PRM)

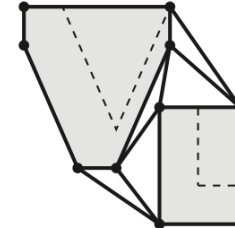
# Visibility graph for translating polygon



(a)

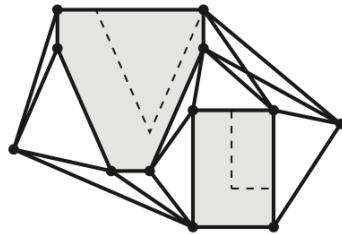


(b)



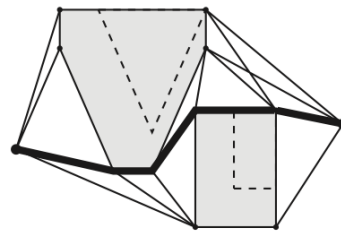
(c)

connect all  
vertices visible  
to each other

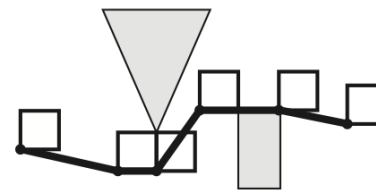


(d)

connect  
start and goal



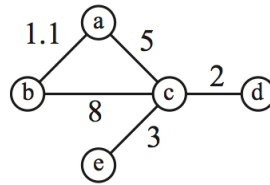
(e)



(f)

This weighted graph roadmap allows direct  
search for a shortest path.

# Finding a shortest path: A\* search



- Keep a list OPEN of nodes reached so far in the search, sorted by the estimated cost of a path going through that node to the goal (the sum of the minimum cost known to reach the node, plus an underestimate to reach the goal).
- Pick the first node from OPEN. If it's at the goal, done.
- For each neighbor of node that has not already been searched from, check if the minimum cost known to reach it (and its parent node) should be replaced.
- Insert these nodes in OPEN.

# Finding a shortest path: A\* search

---

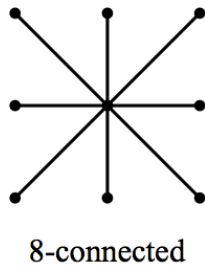
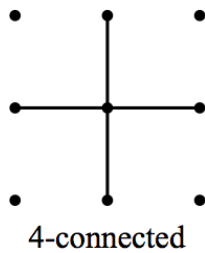
**Algorithm 1** A\* search.

---

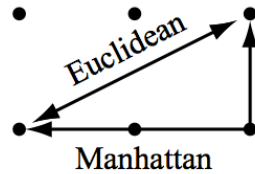
```
1: OPEN  $\leftarrow \{1\}$ 
2: past_cost[1]  $\leftarrow 0$ , past_cost[node]  $\leftarrow \text{infinity}$  for node  $\in \{2, \dots, N\}$ 
3: while OPEN is not empty do
4:   current  $\leftarrow$  first node in OPEN, remove from OPEN
5:   add current to CLOSED
6:   if current is in the goal set then
7:     return SUCCESS and the path to current
8:   end if
9:   for each nbr of current not in CLOSED do
10:    tentative_past_cost  $\leftarrow$  past_cost[current] + cost[current, nbr]
11:    if tentative_past_cost < past_cost[nbr] then
12:      past_cost[nbr]  $\leftarrow$  tentative_past_cost
13:      parent[nbr]  $\leftarrow$  current
14:      put (or move) nbr in sorted list OPEN according to
        est_total_cost[nbr]  $\leftarrow$  past_cost[nbr] +
        heuristic_cost_to_go(nbr)
15:    end if
16:  end for
17: end while
18: return FAILURE
```

---

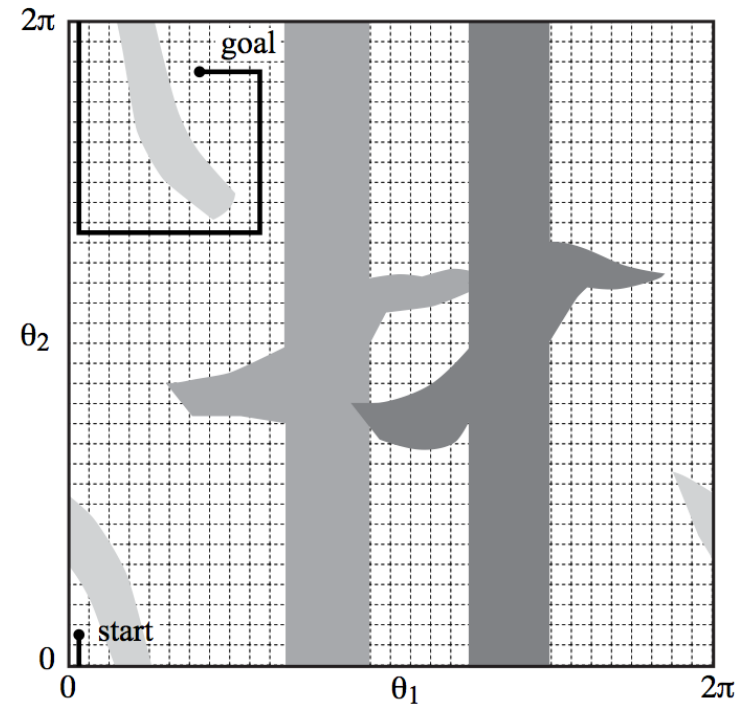
# A\* search on a grid



(a)



(b)



(c)

Need not explicitly construct the graph in advance.