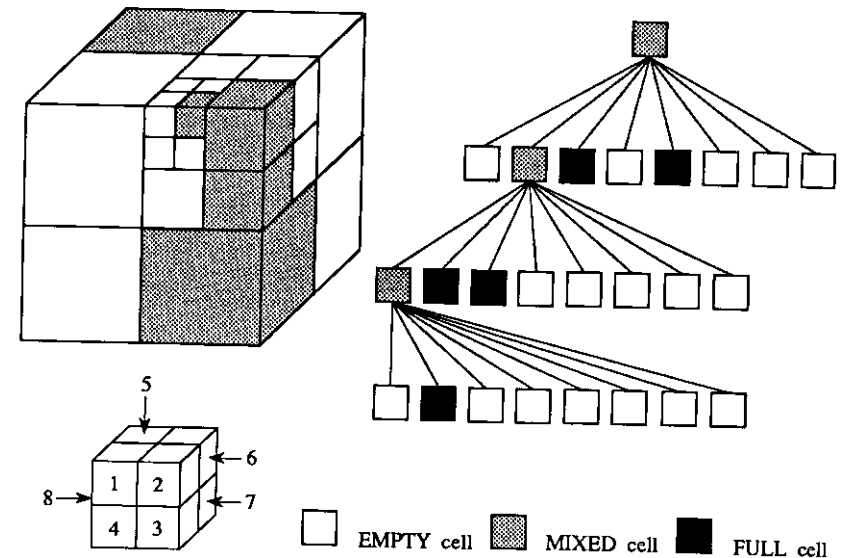
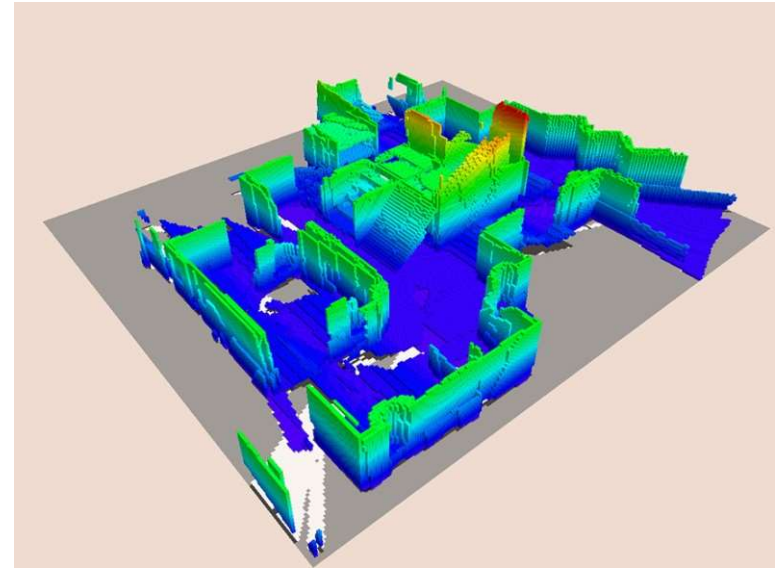


# Path Planning in 3D Maps

# 3D Occupancy Grid

- 3D regular grid
  - occupancy, free space, unknown
  - $x, y, z \sim$  metric Cartesian coordinates
  - simple but memory intensive (predominant for 2D, less for 3D)
- octree
  - recursive decomposition in 8 cells
  - each occupied cell further divided



# 3D Occupancy Grid

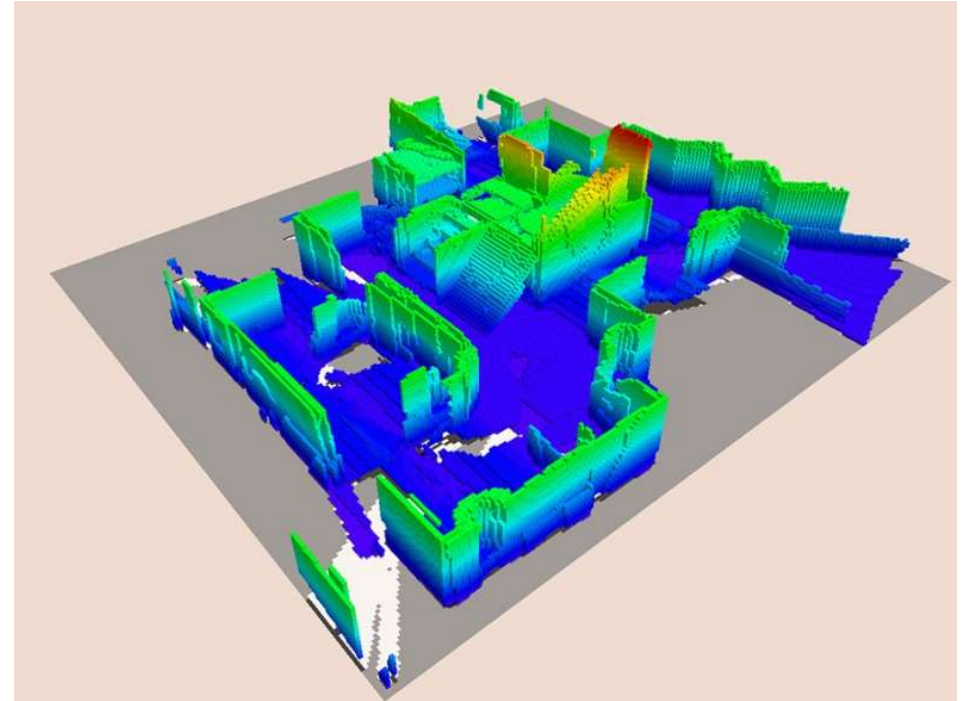
3D path-planning

**aerial & underwater** systems

- just like in 2D
- roadmaps by adjacency
- A\* or Dijkstra for planning

**ground** system

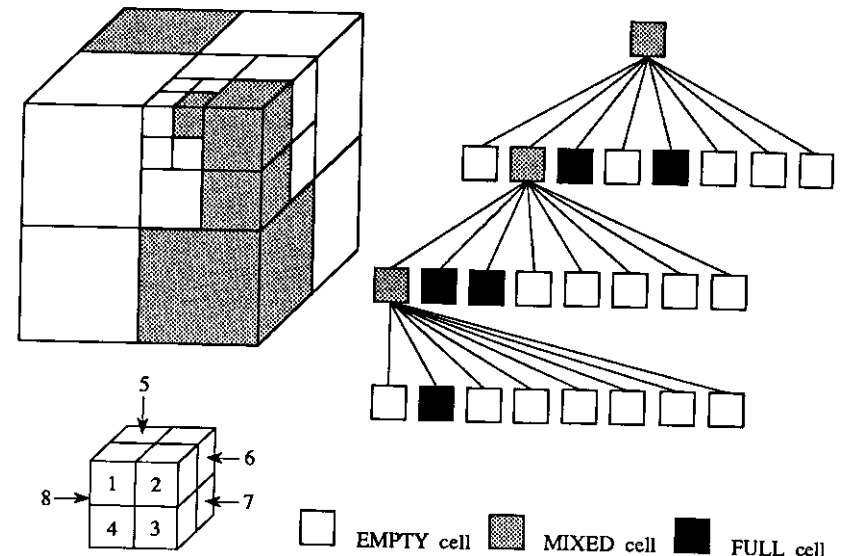
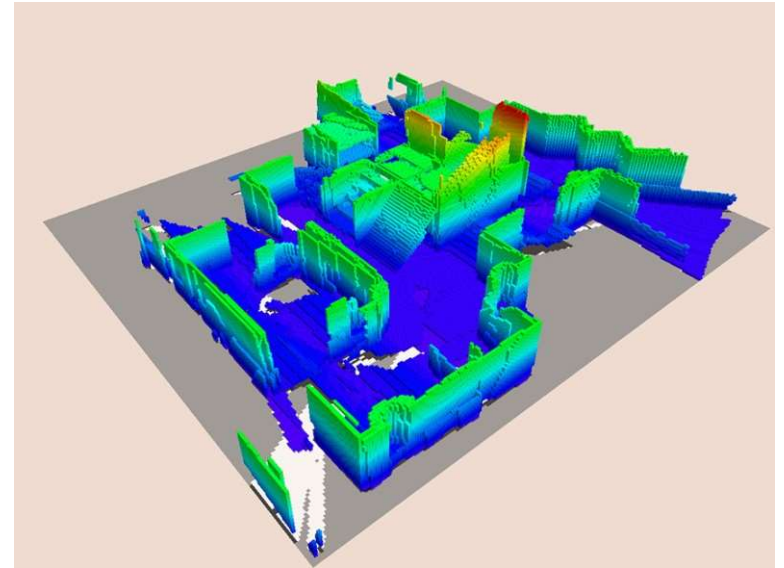
- drives on 2D surface
- down-project 3D to 2D or 2.5D



# 3D Occupancy Grid & Octree

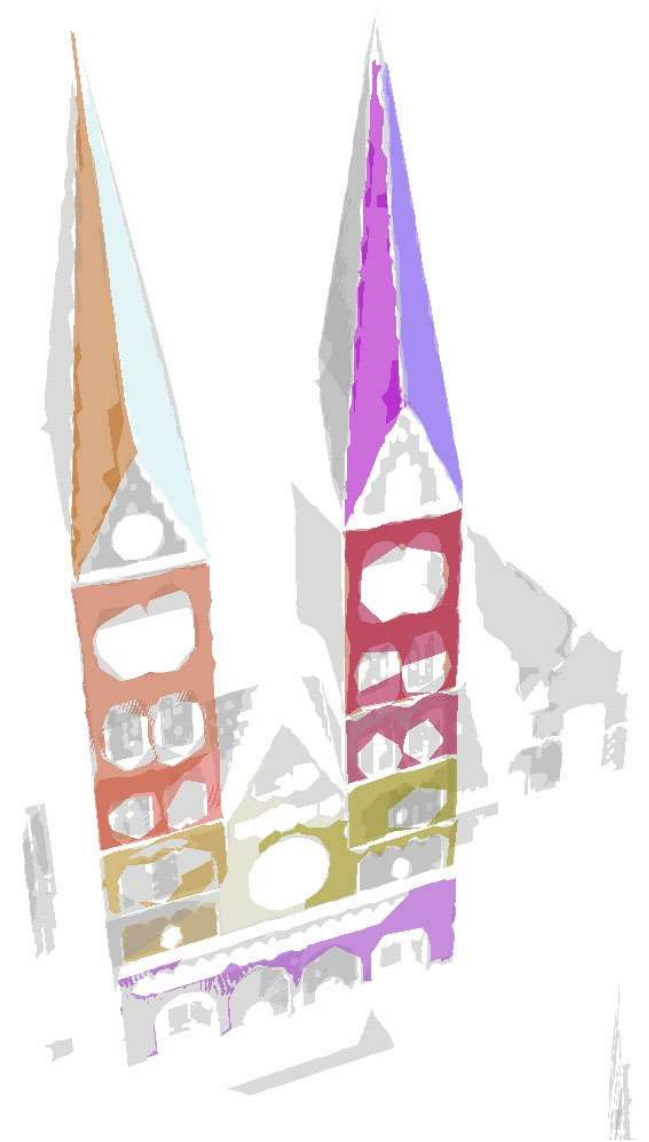
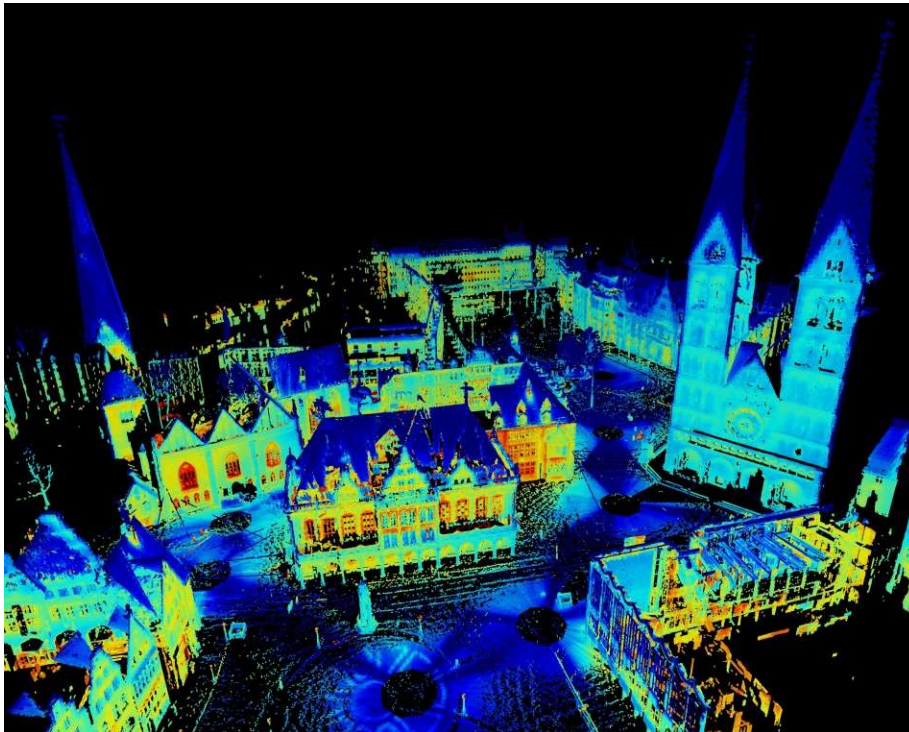
## Volumetric Representations

- 3D regular grid
  - simple but memory intensive
  - predominant for 2D, less for 3D
- octree
  - recursive decomposition in 8 cells
  - each occupied cell further divided
  - compact representation
  - but not straightforward to use for path-planning
    - can use adjacency and cell centers
    - for roadmap generation and A\*
    - but does not lead to shortest paths (consider a large empty volume)



# 3D Surface Models

- in contrast to volumetric (grid or octree)
- surface representations, e.g.,
  - generate meshes from points
  - or fit (larger) surfaces, e.g., planes into the raw data of range sensors (point cloud)



# Sampling-based Path Planning

aka Randomized Graph Search

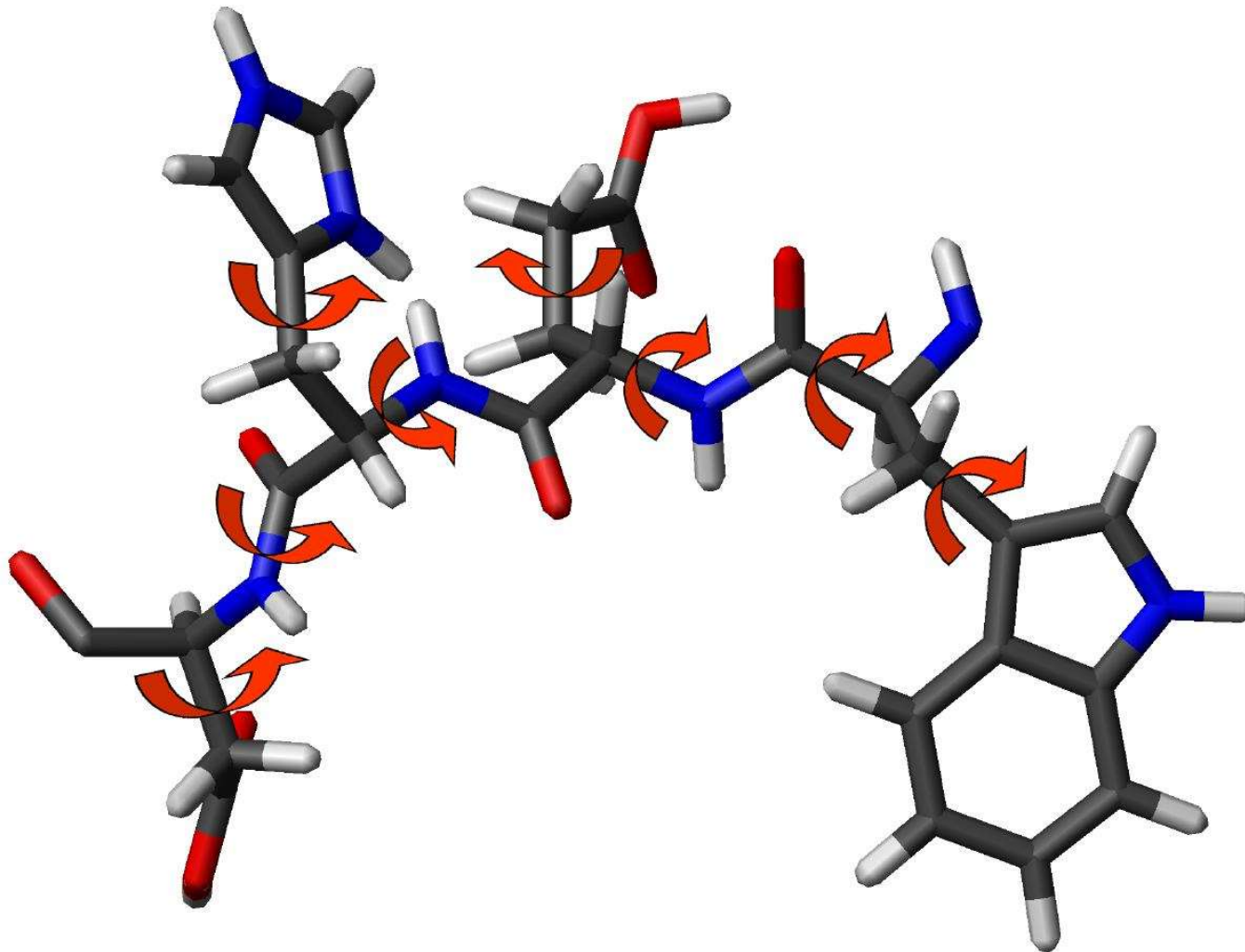
- maps can get large in 3D
    - and even already in 2D
    - especially for grids, and even quad/octrees
  - plus even more so for multiple DoFs
    - robot-arms, bio-informatics, etc.
    - i.e., when planning in high-dimensional C-space
- => very large search space

also, how to handle surface representations?



# Example: Bioinformatics

- motion planning with many DoF
- search whether there is a configuration of a molecule
- that “fits” to an other molecule (e.g., for drug design)



# Probabilistic Roadmap (PRM)

Start with empty  $R=(V,E)$

Generate a random free location  $c$  and add to  $V$

Choose a subset  $V_c$  of candidate neighbors around  $c$

Try to connect  $c$  to each of selected nodes in  $V_c$

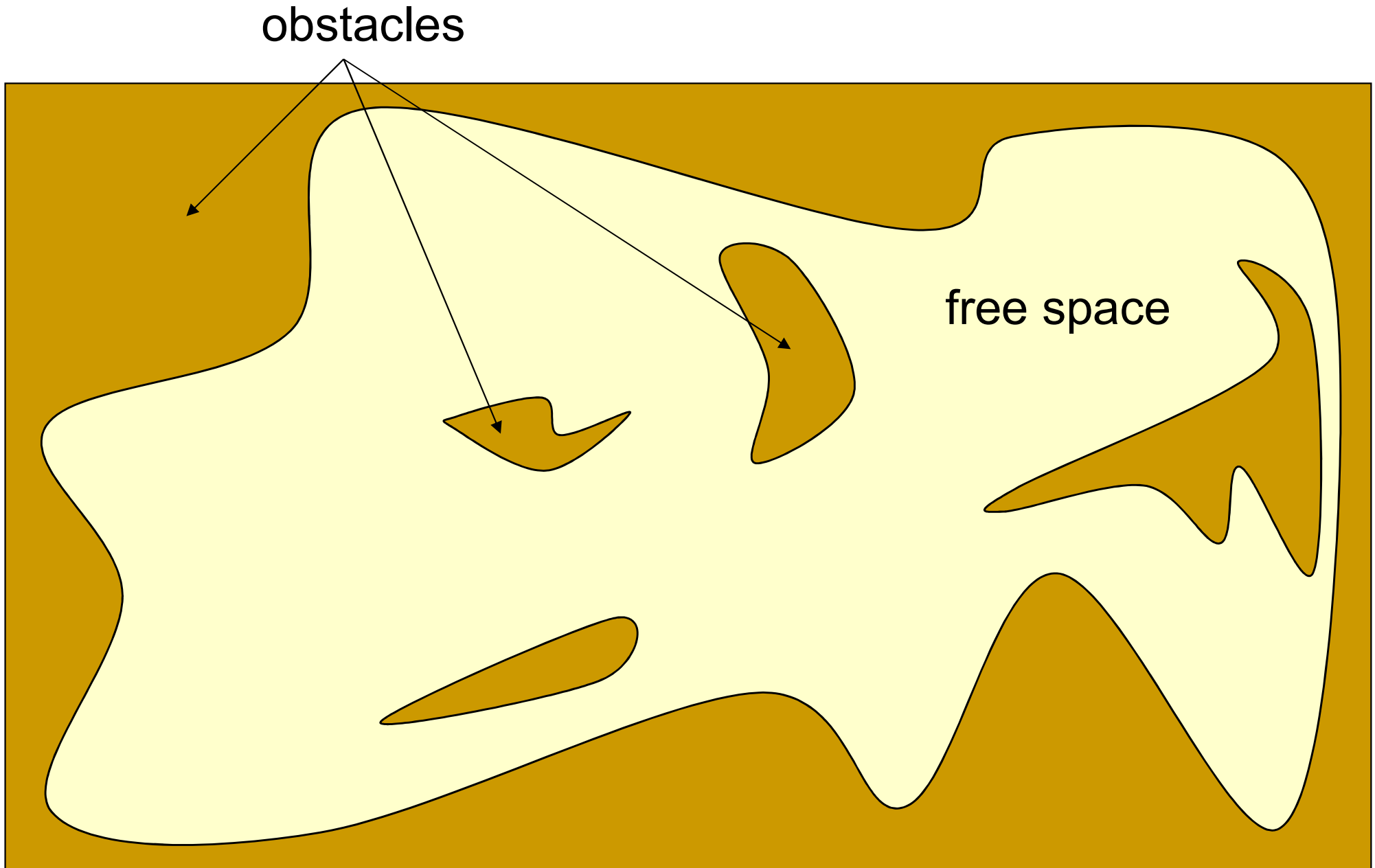
- select only the nodes not graph-connected to  $c$
- use maybe a local planner

Add the edge found to  $E$

Repeat the above until satisfied

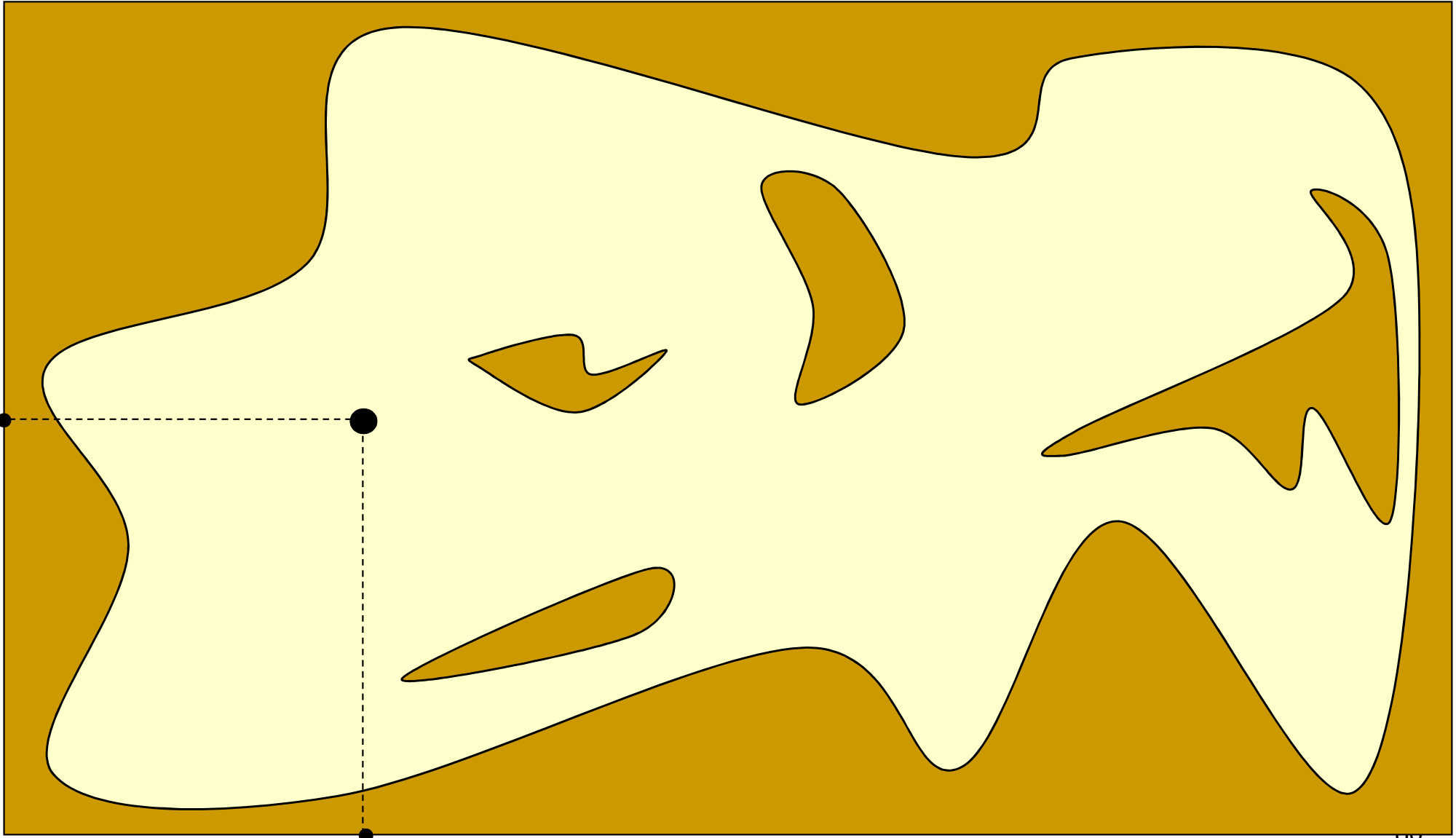


# Probabilistic Roadmap (PRM)



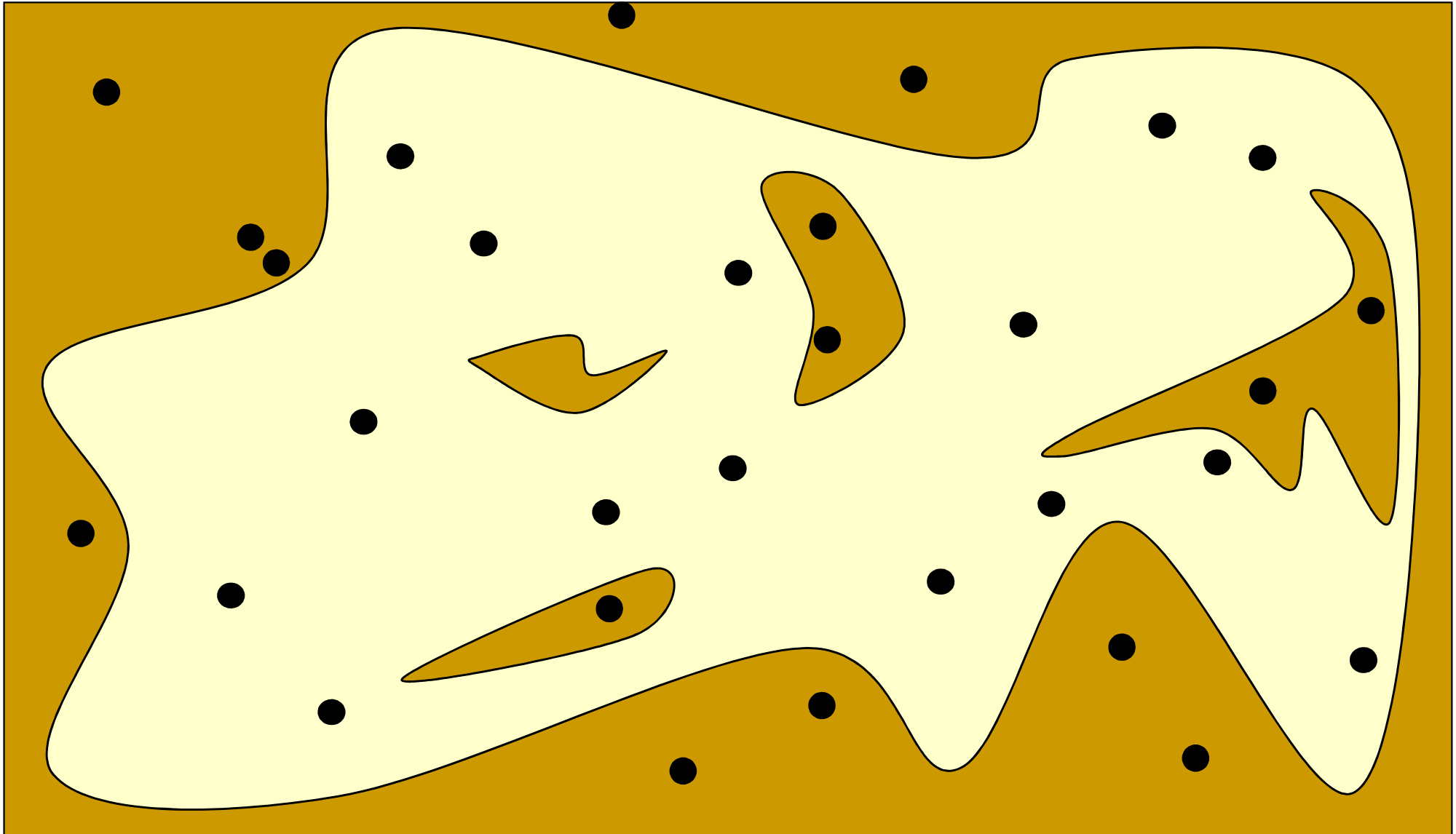
# Probabilistic Roadmap (PRM)

Configurations are sampled by picking coordinates at random



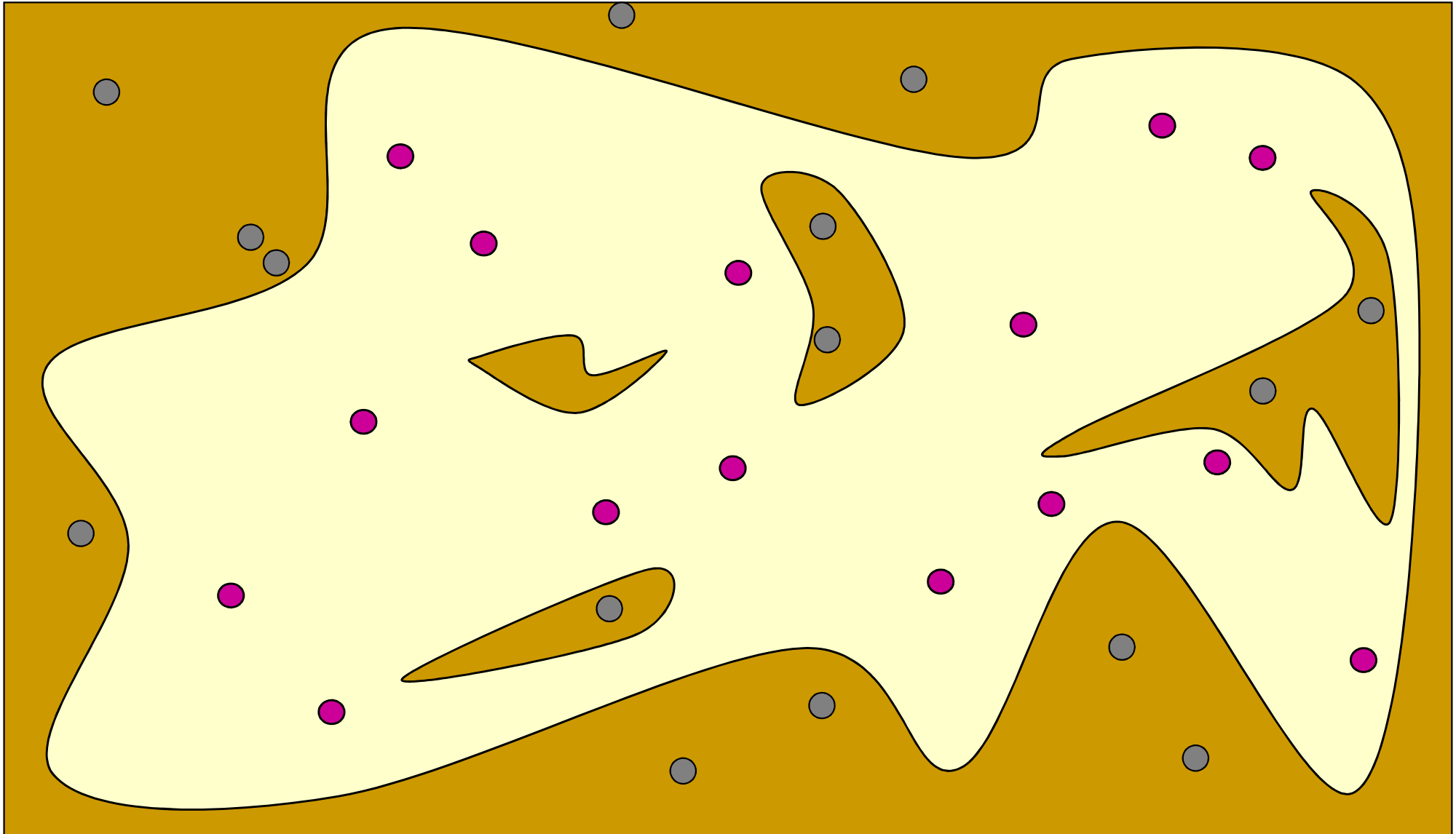
# Probabilistic Roadmap (PRM)

Configurations are sampled by picking coordinates at random



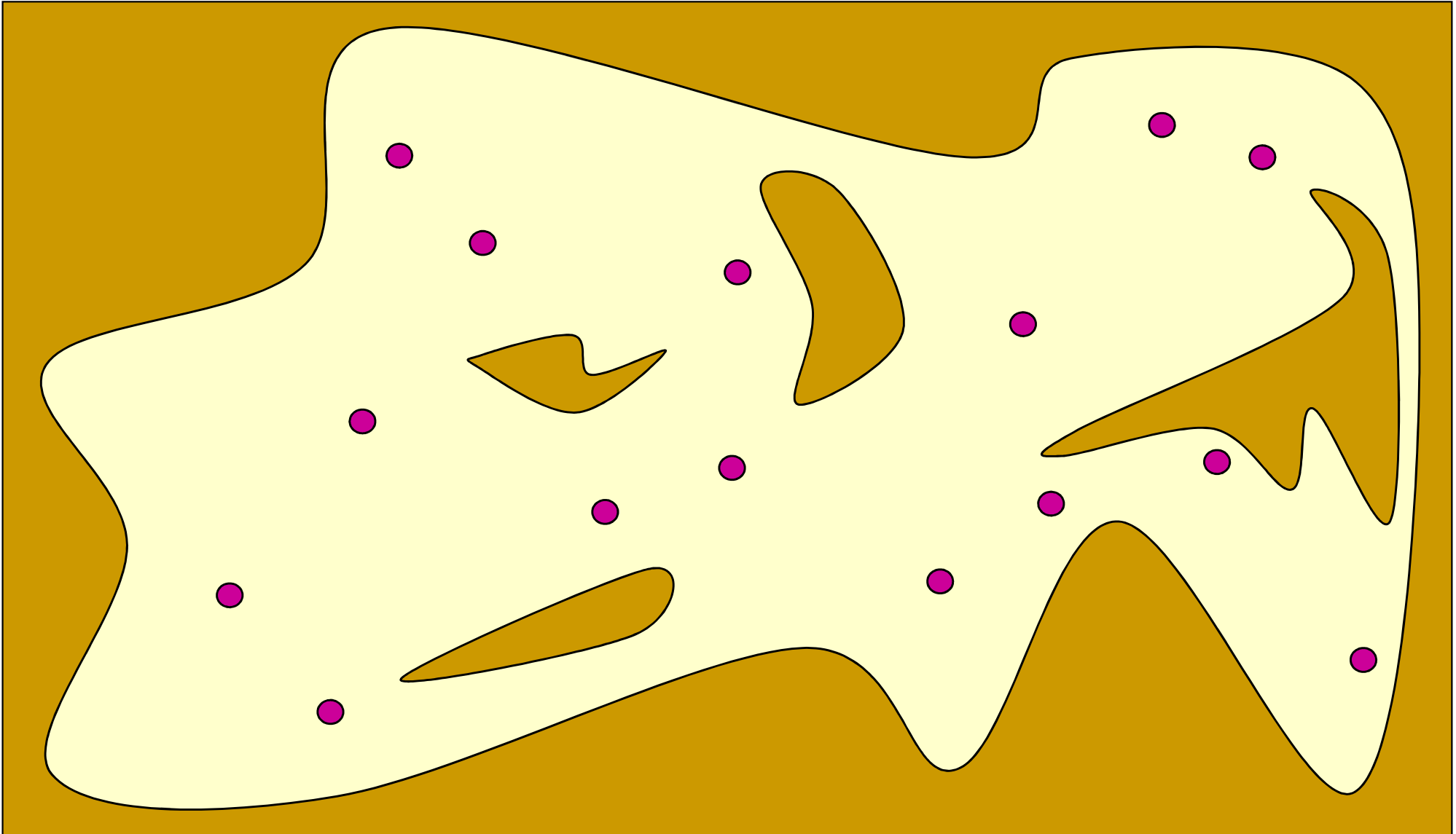
# Probabilistic Roadmap (PRM)

Sampled configurations are tested for collision



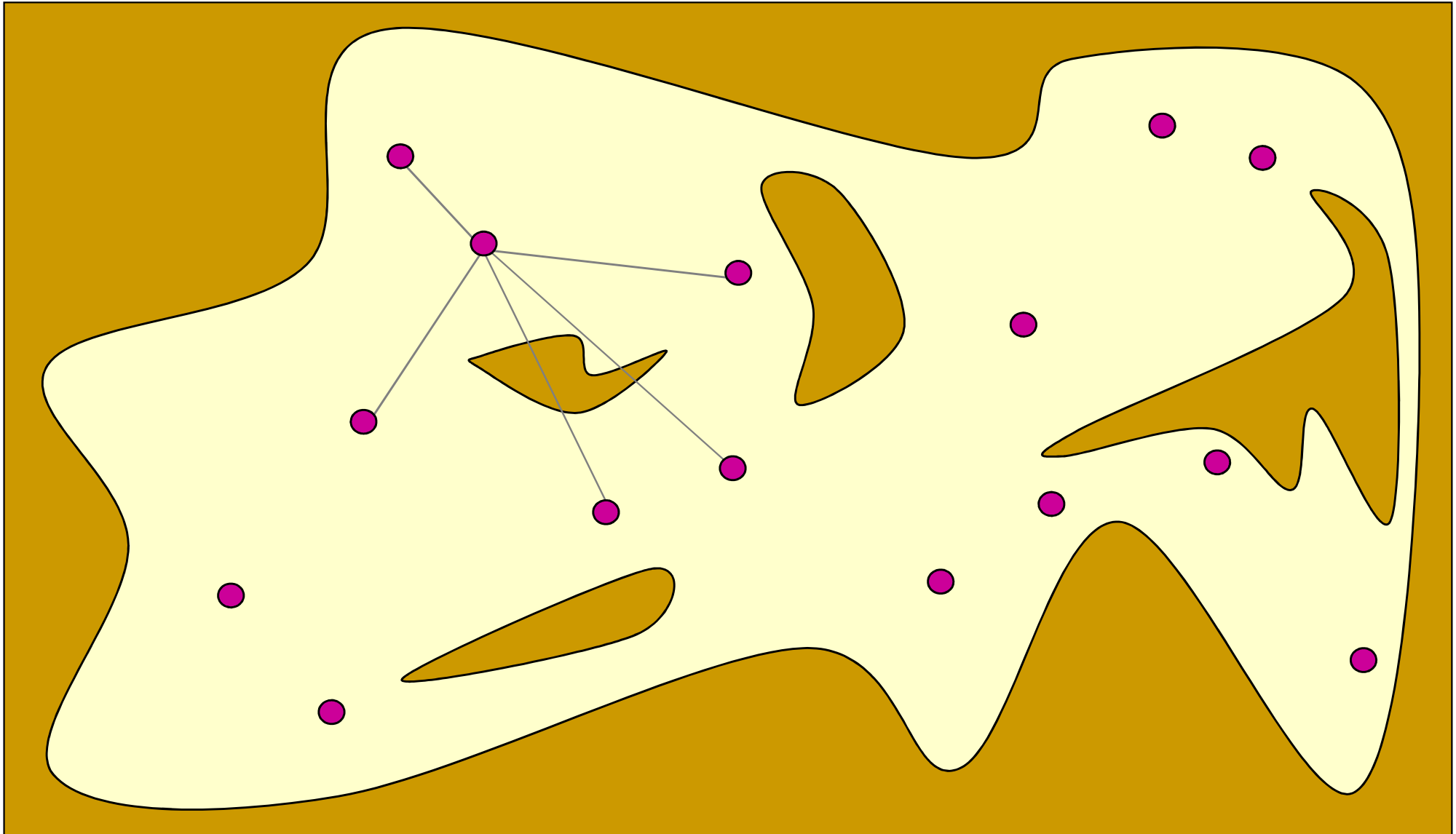
# Probabilistic Roadmap (PRM)

The collision-free configurations are retained as **milestones**



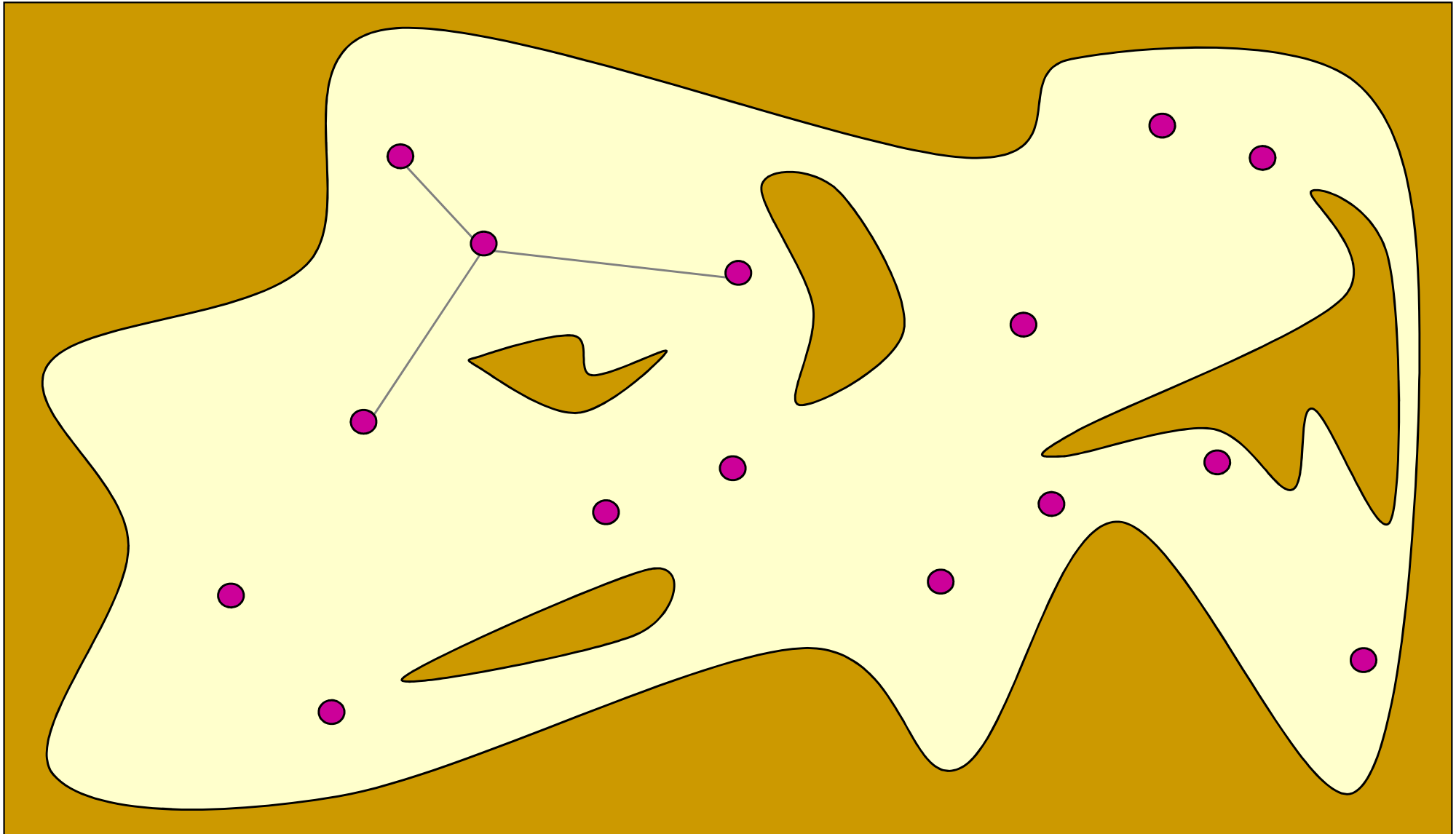
# Probabilistic Roadmap (PRM)

Each milestone is linked by straight paths to its nearest neighbors



# Probabilistic Roadmap (PRM)

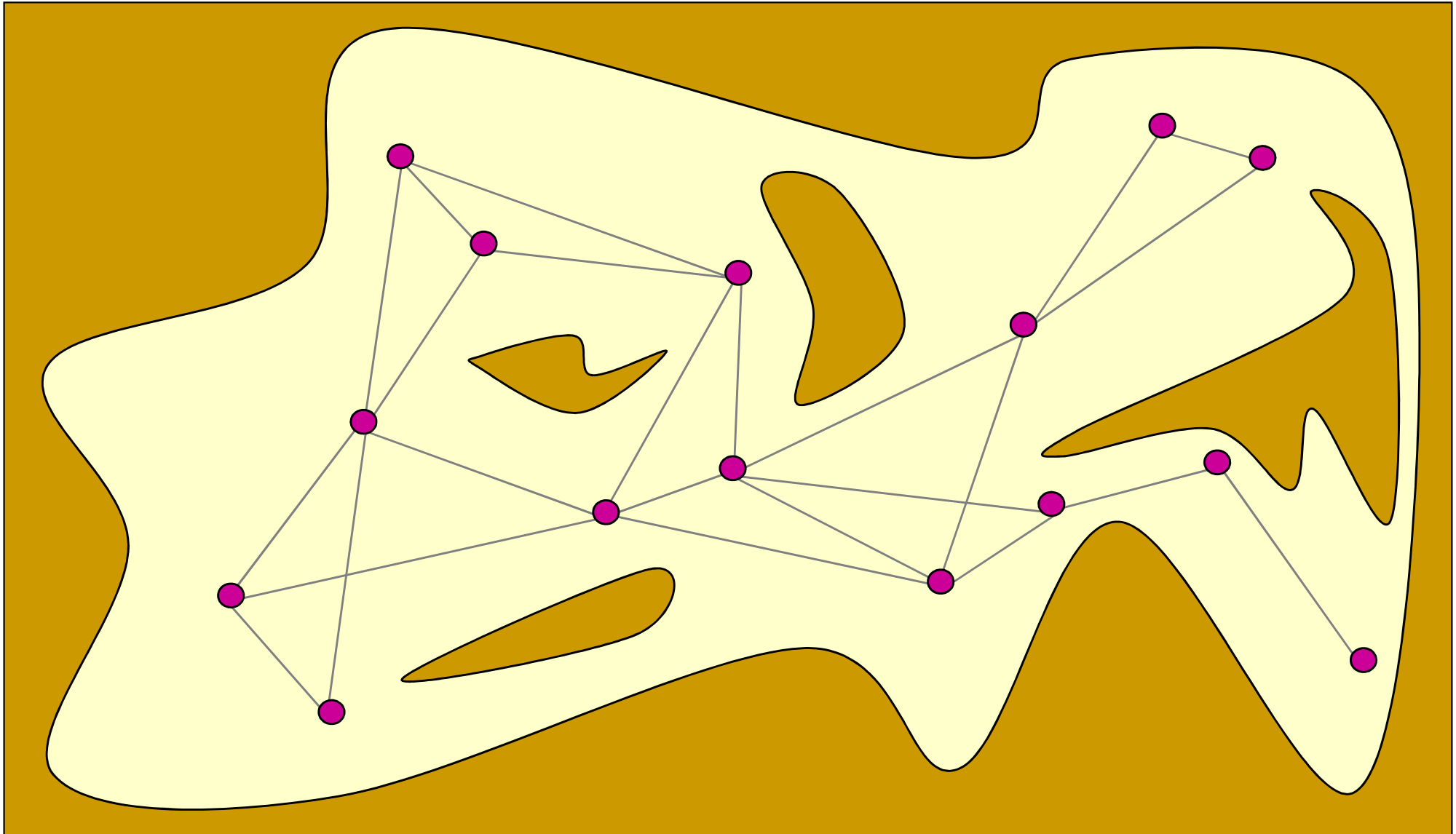
Remove paths with collisions





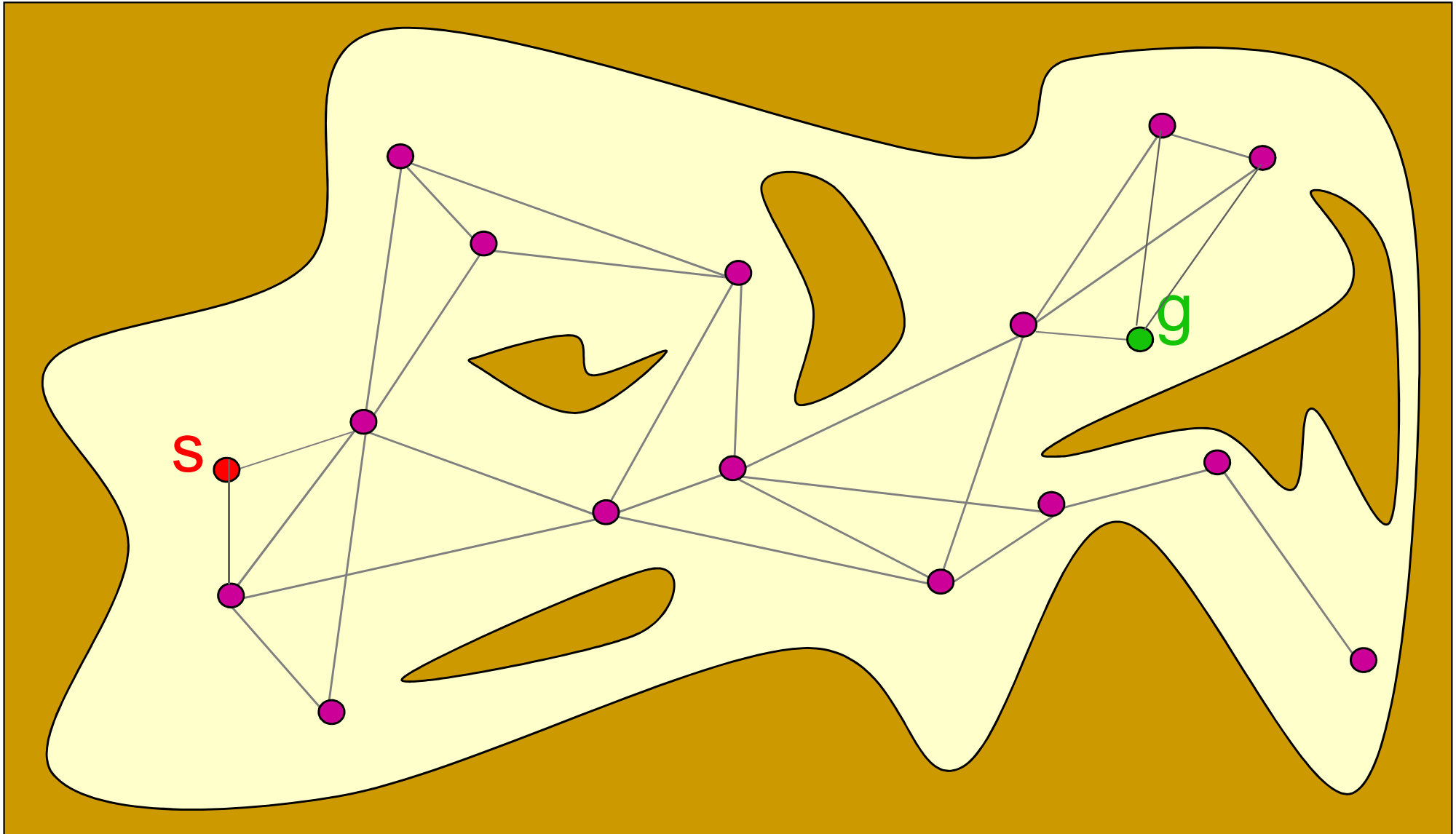
# Probabilistic Roadmap (PRM)

The collision-free links are retained as **local paths** to form the PRM



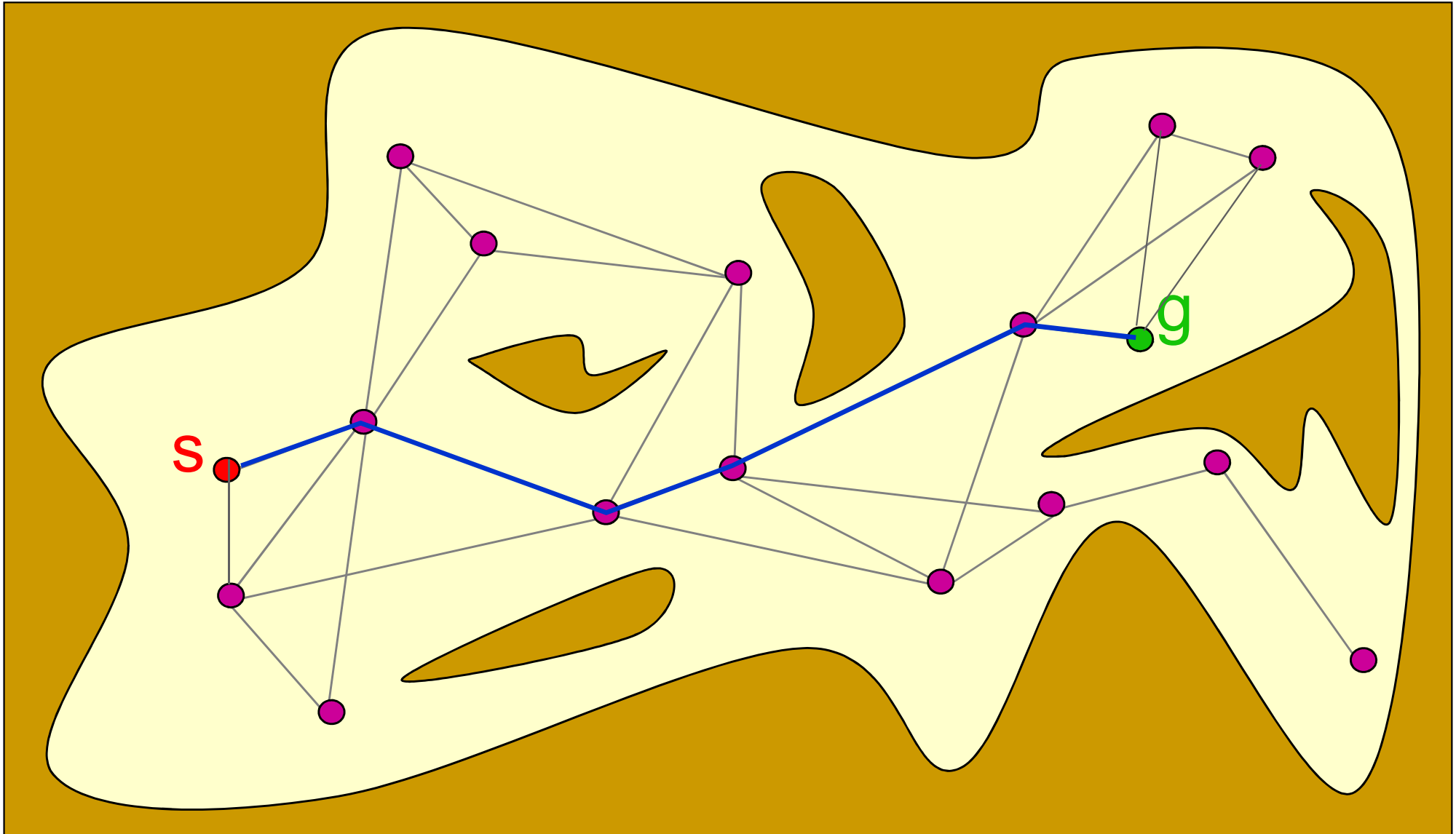
# Probabilistic Roadmap (PRM)

The start and goal configurations are included as milestones



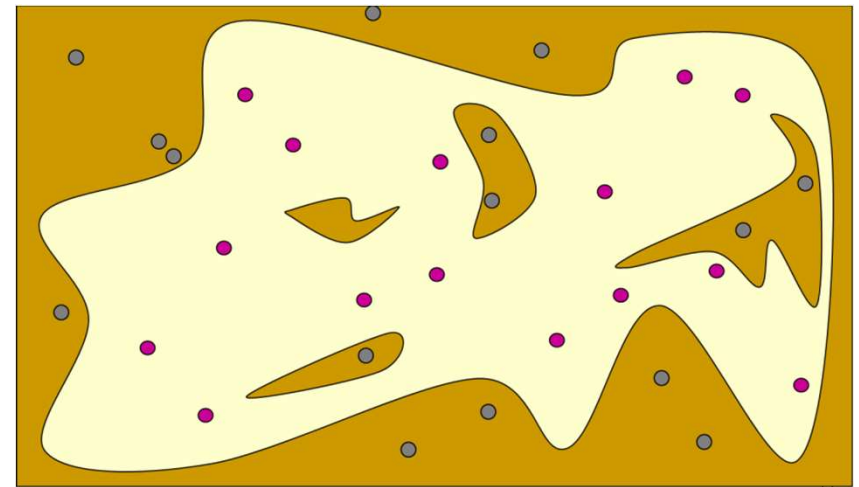
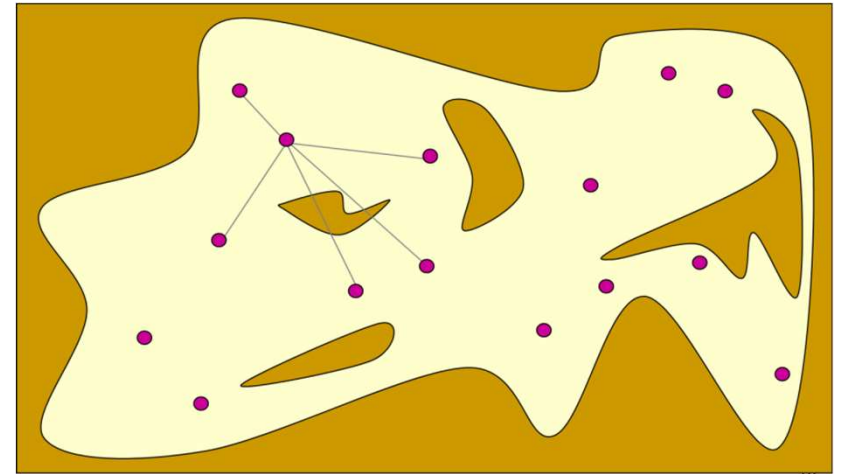
# Probabilistic Roadmap (PRM)

The PRM is searched for a path from  $s$  to  $g$



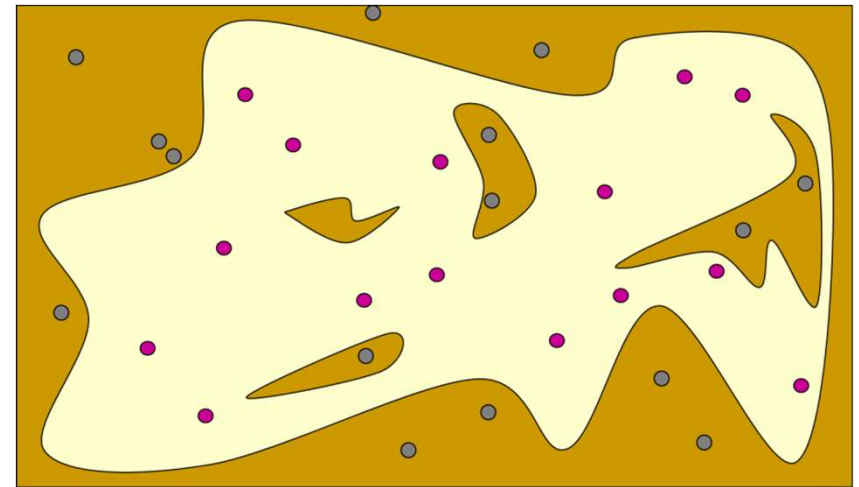
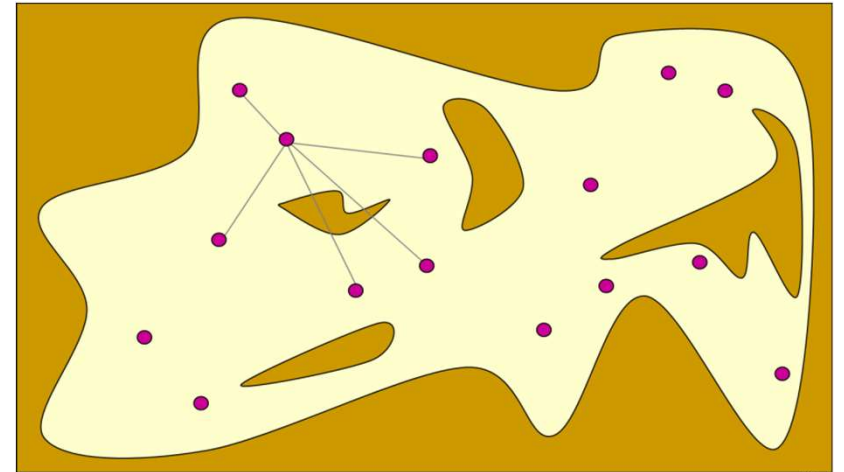
# PRM & Gridmaps

- “in free space?” check
  - trivial: corresponding cell marked *free* or not
  - note: most non-free cells of a volume marked as *unknown*
- straight line collisions
  - Bresenham line algorithm
- or use of local path-plan
  - e.g.,  $A^*$  in bounded volume



# PRM & Surface Representations

- straight line collisions
  - with surfaces (polygons or meshes) are “easy” to check
  - i.e., part of “standard” computational geometry
- “in free space?” check
  - slightly more tricky
  - requires in- and outside of the surfaces (via surface normal)



(but both aspects out of scope of this lecture)

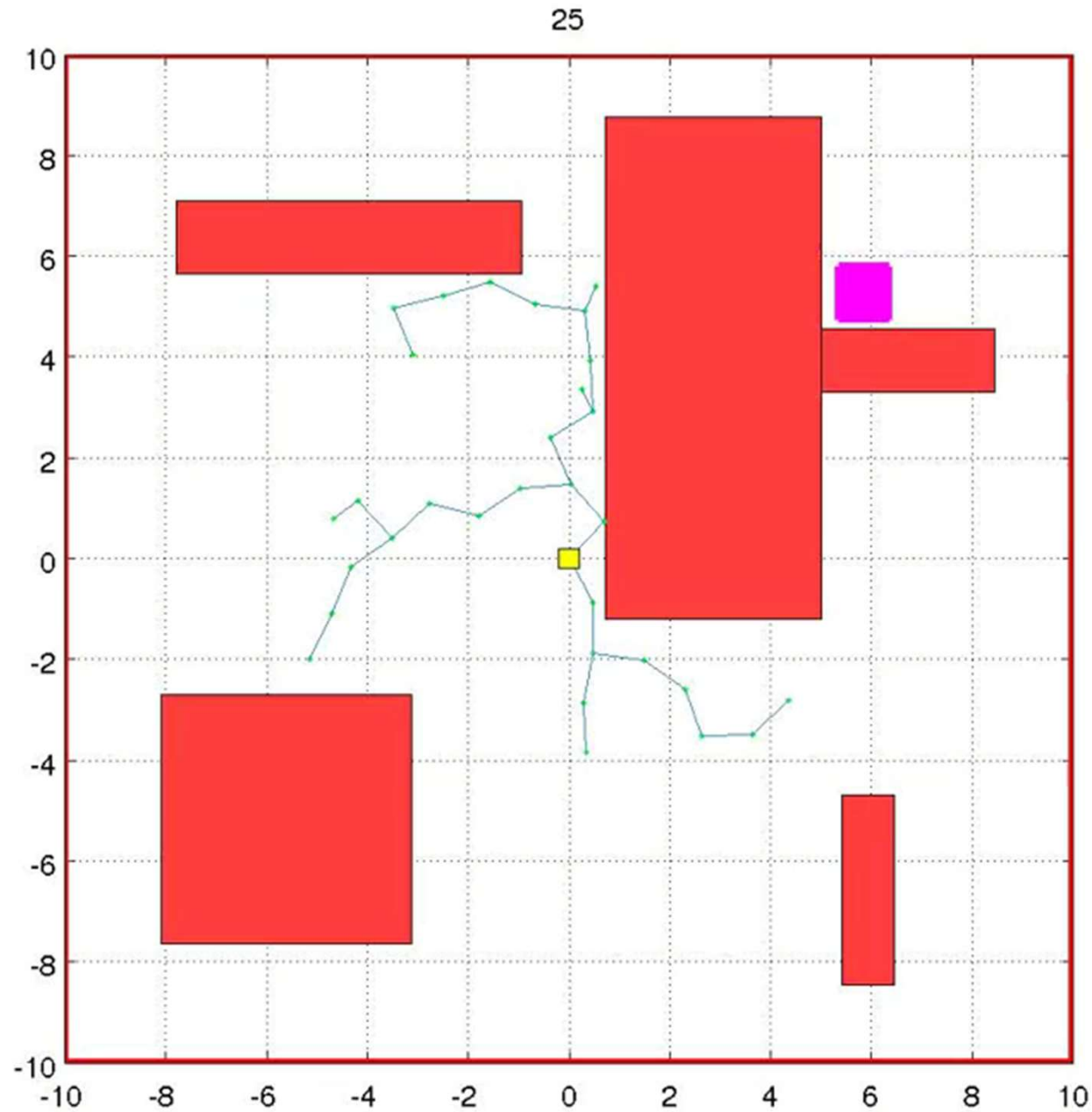
# Rapidly Exploring Random Tree (RRT)

basic algorithm:

1. start with the initial configuration as root of tree
2. pick a random state in the configuration space
3. find the closest node in the tree
4. extend that node toward the state if possible
5. goto 2

(note: many variations exist)

# Rapidly Exploring Random Tree (RRT)





# Obstacle Space Revisited

# Obstacle-Space

path-planning so far

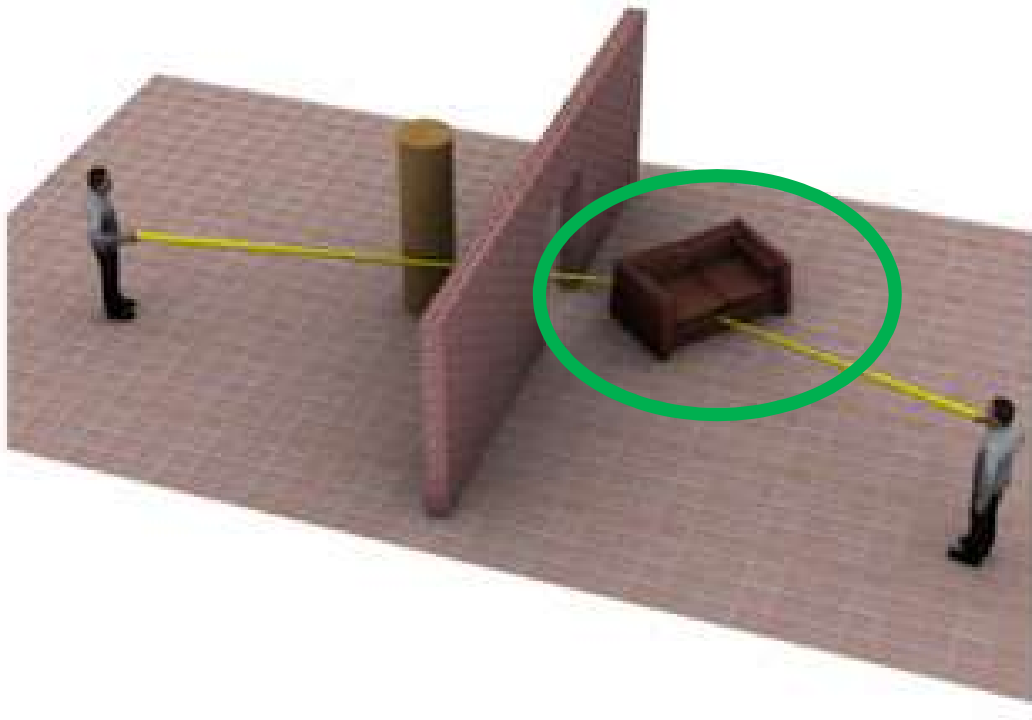
- mobile systems
- with simple geometries
- i.e., bounding sphere for obstacle growing
- moving in 2D or 3D

what about

complex geometries, respectively complex motions?

# Piano Mover's Problem

object shape matters in path-planning



simple obstacle growing  
will not work in this case

# Configuration Space (C-Space)

[re-cap]

partitioned into

- free configurations (aka free space): robot and obstacles do not overlap
- contact configurations (aka contact space): robot and obstacles touch
- blocked configurations (aka obstacle space): robot and obstacles overlap

# Obstacle Space

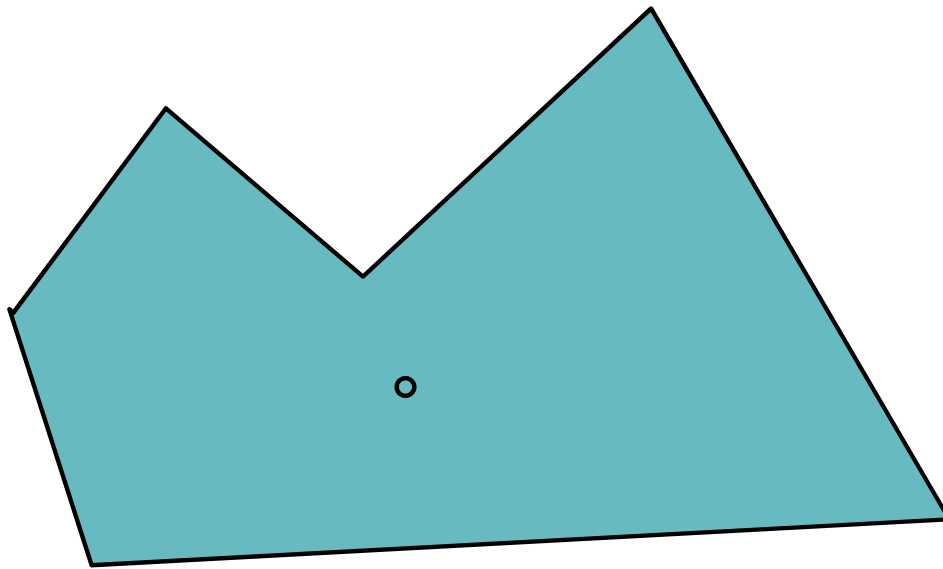
C-obstacles can get quite tricky

- option1: general (simple) approach
  - discretize DoF & enumerate them
  - check for collision for each configuration
- option2: Minkowski sum
  - works for rigid bodies in 2D and 3D
  - under translations

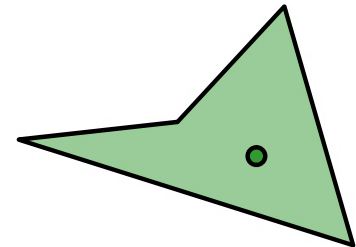
# Minkowski Sum

$$A \oplus B = \{a + b \mid a \in A, b \in B\}$$

*A, B sets*  
*a, b vectors*



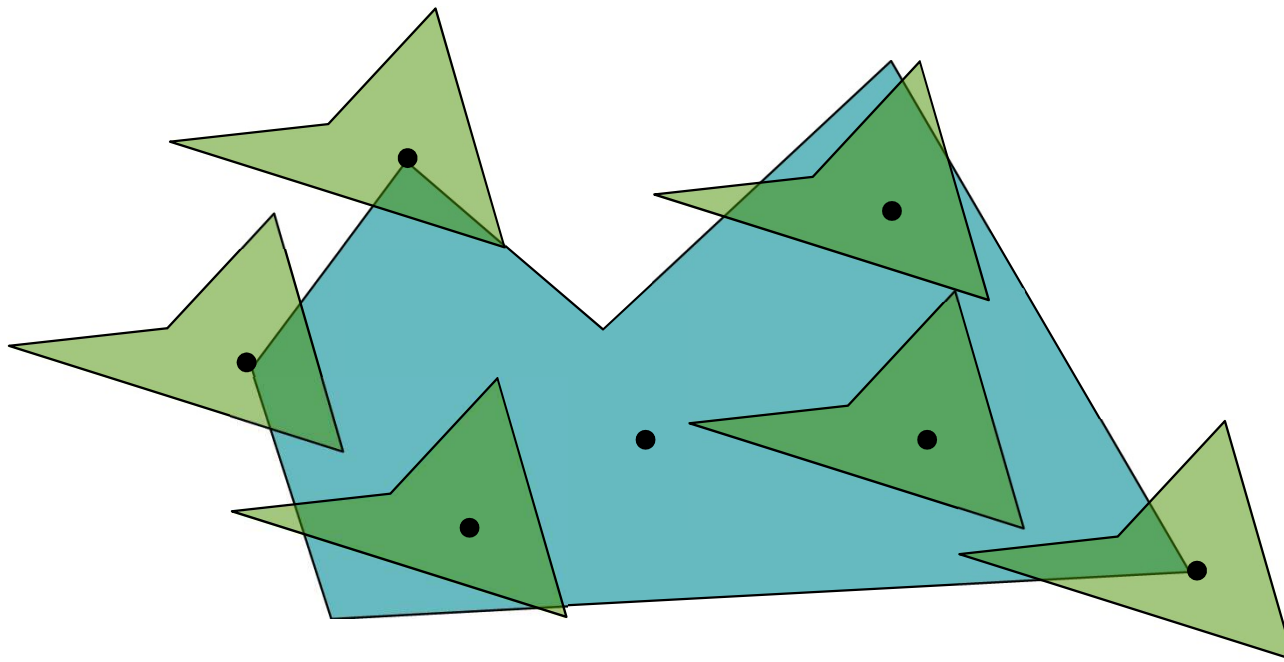
*A*



*B*

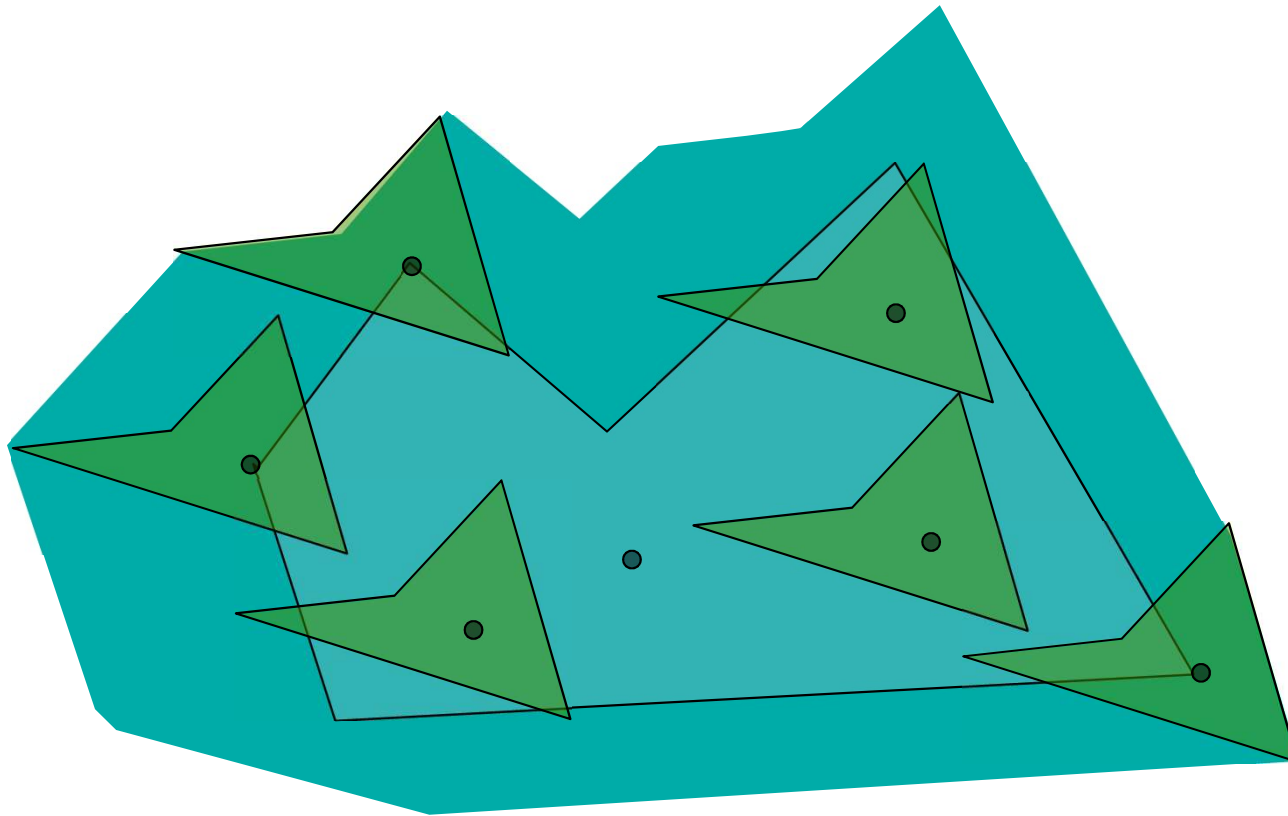
# Minkowski Sum

$$A \oplus B = \{a + b \mid a \in A, b \in B\}$$





# Minkowski Sum



# Minkowski Sum

$$A \oplus B = \{a + b \mid a \in A, b \in B\}$$

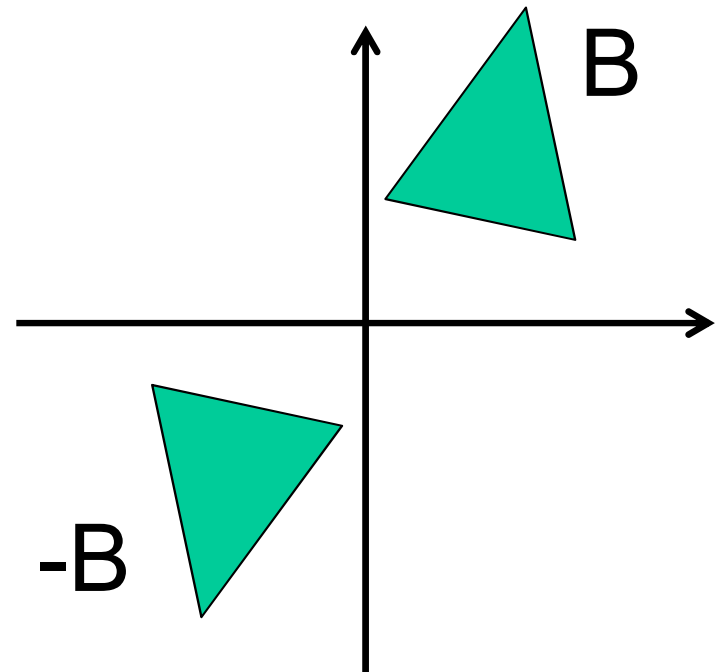


# Minkowski Sum

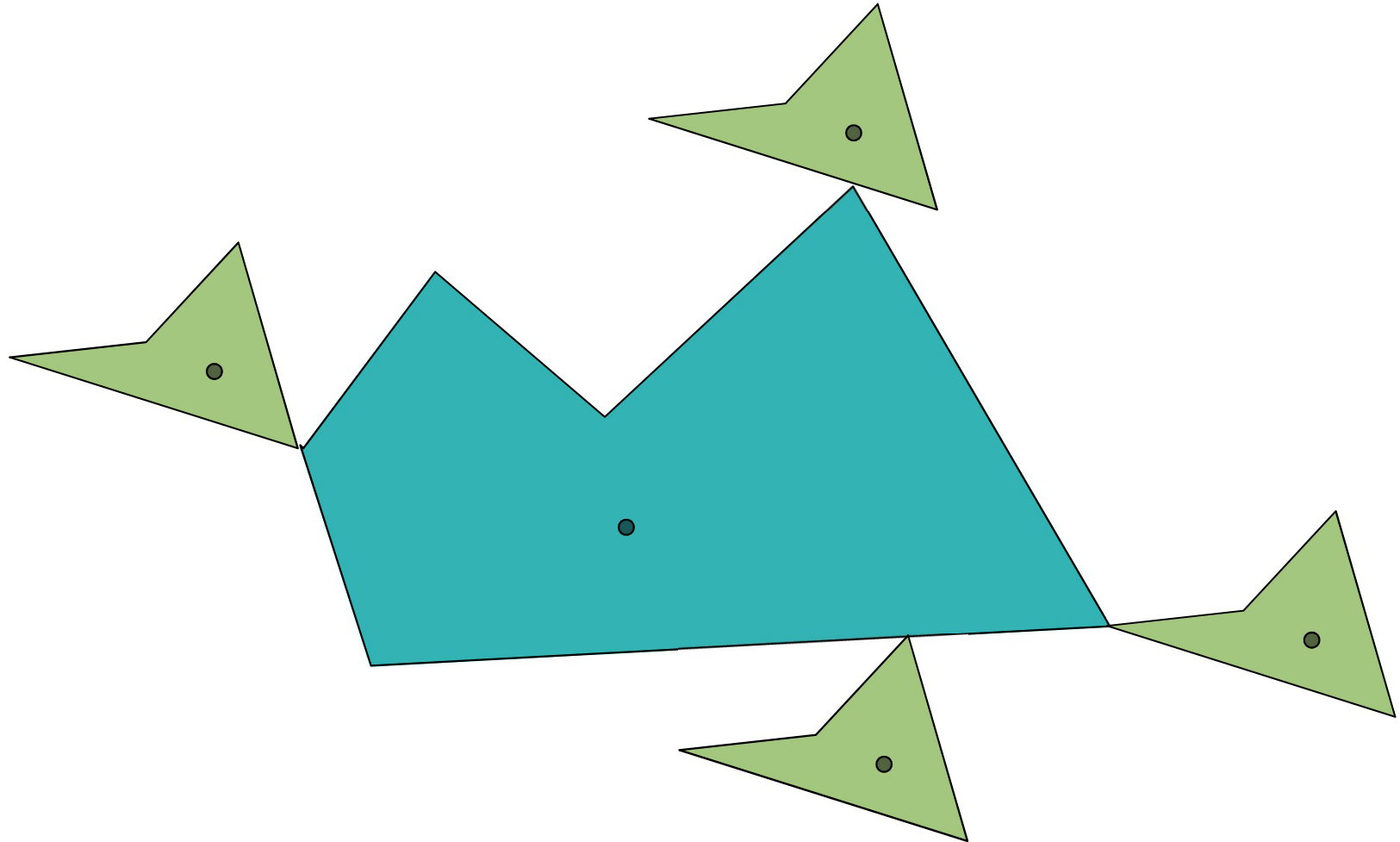
Minkowski difference

$$\begin{aligned} A \ominus B &= \{a - b \mid a \in A, b \in B\} \\ &= A \oplus (-B) \end{aligned}$$

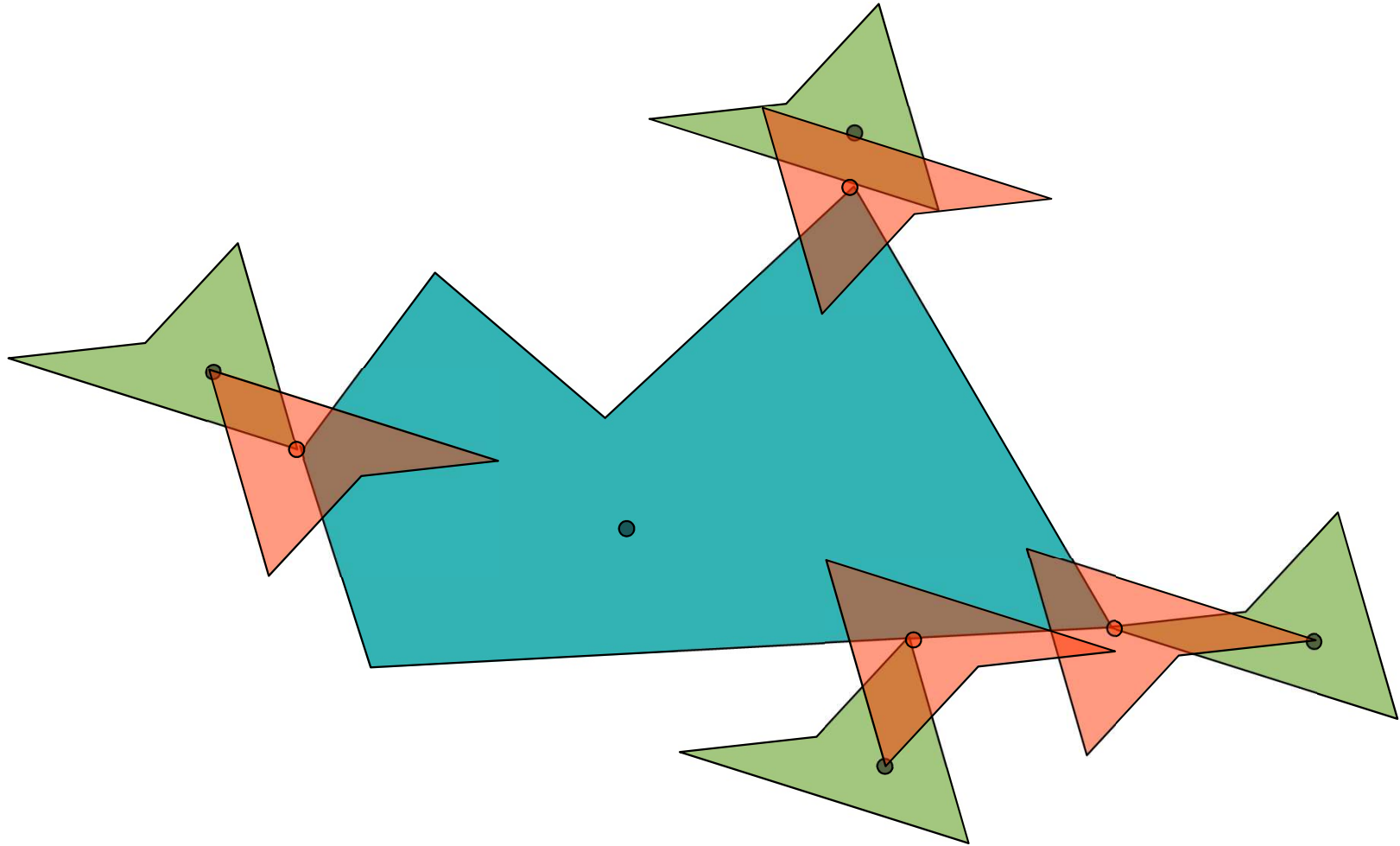
$$-B = \{-b \mid b \in B\}$$



# Tracing Out Collision Possibilities



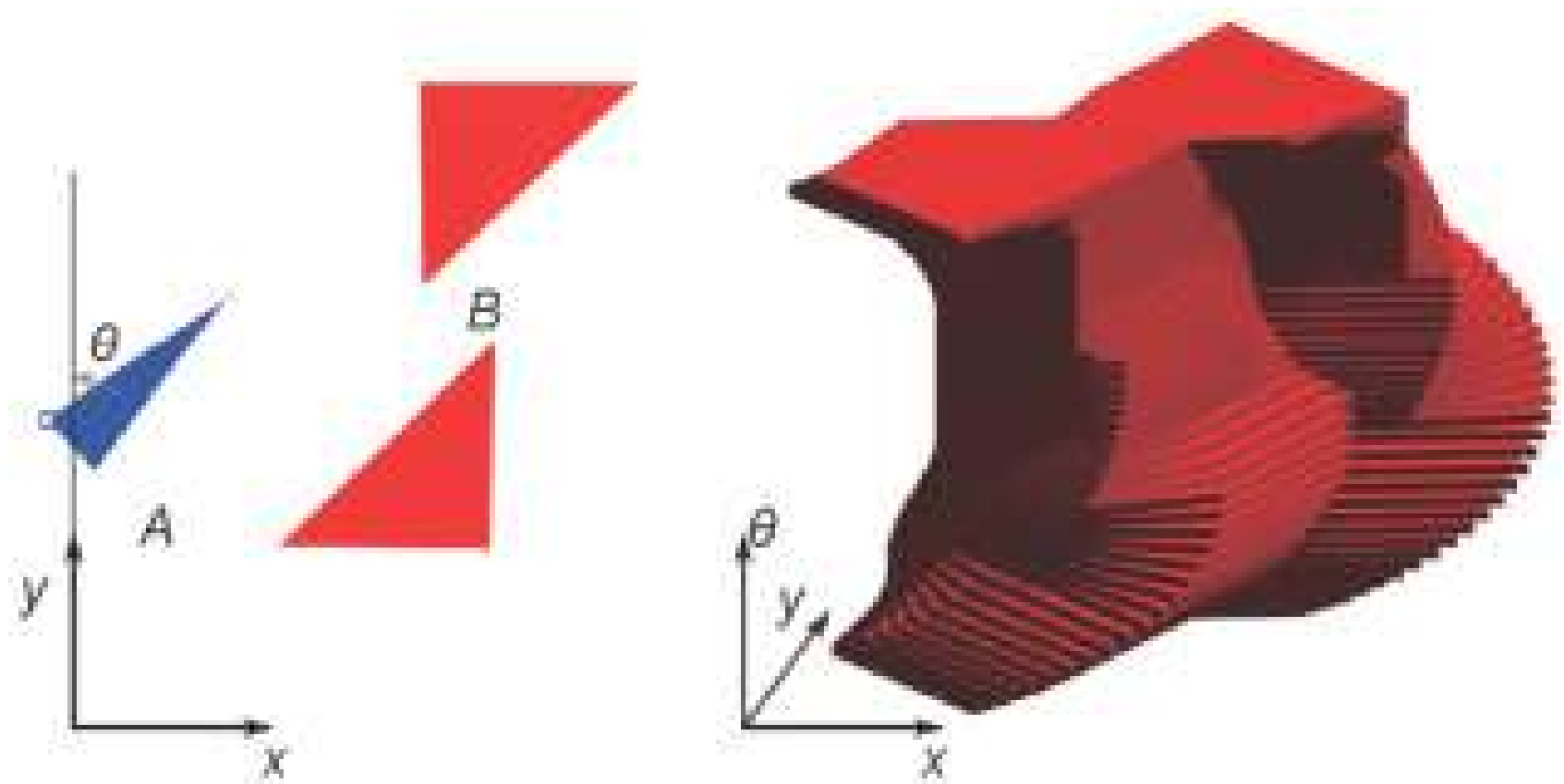
# Minkowski Difference



C-obstacle = obstacle minus rigid body  
(can be efficiently computed for polygons)

# What about rotations?

- discretize rotations
- compute Minkowski diff for each angle



# Generating C-Obstacle can be tough...

- methods exist including rotations and kinematic chains (multiple links & joints like robot arms)
- but computational complexity is an issue
- hence often Randomized Graph Search
  - e.g., PRM or RRT
  - with geometric collision tests of configurations in Cartesian space (e.g., via computational geometry)