



Book Ch 6.2 and 6.3.2-6.3.3



# ED5215

## Roadmaps

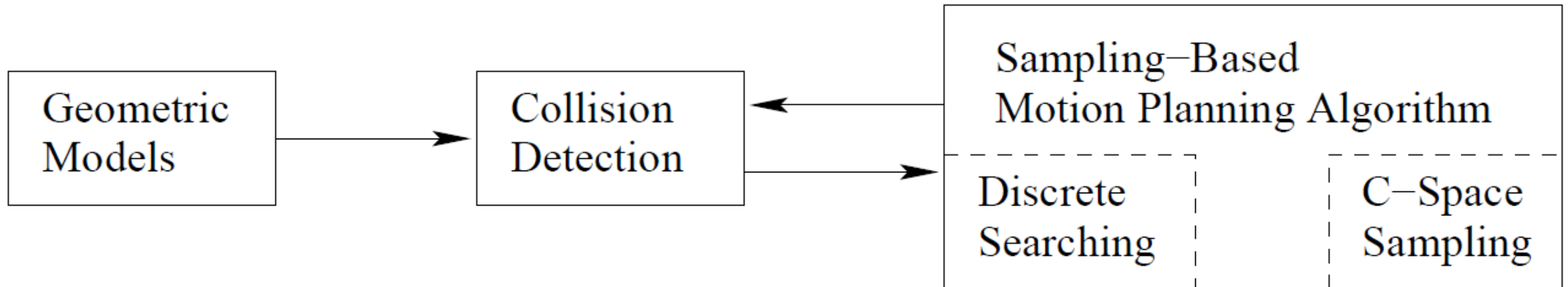
**Nirav Patel**

**Assistant Professor, Department of Engineering Design  
IIT Madras**

Moodle page available at: <https://courses.iitm.ac.in/>

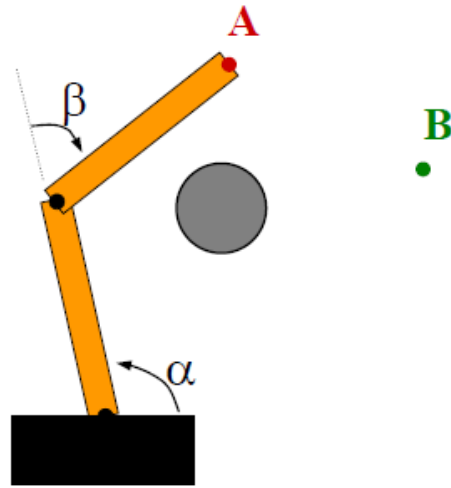
# Sampling-Based Motion planning

- **Environment**
  - Obstacles
  - Free space
- **Collision checking**



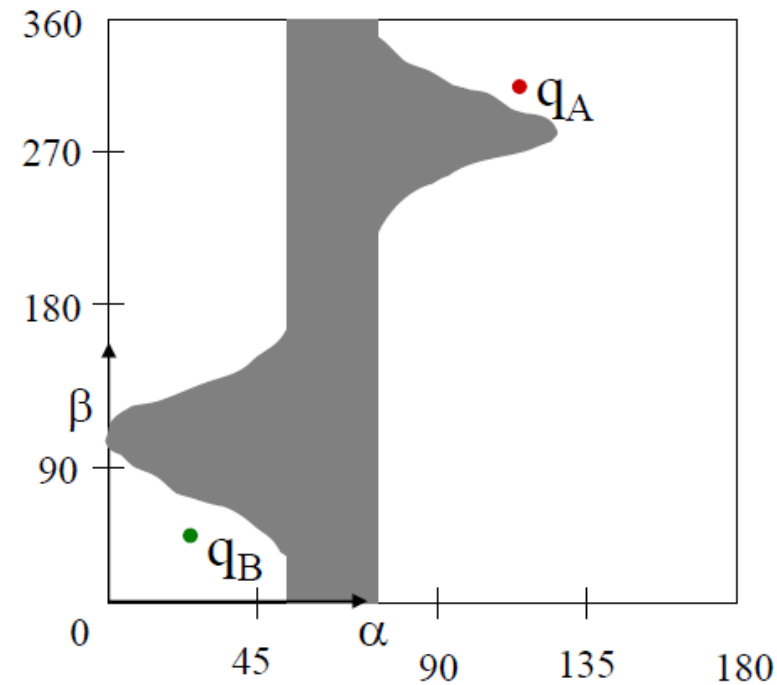
# C-Space with obstacle

Reference configuration



An obstacle in the robot's workspace

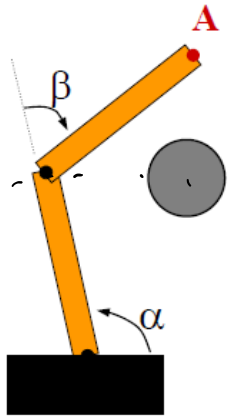
How do we get from A to B ?



The C-space representation  
of this obstacle...

# C-Space with obstacle

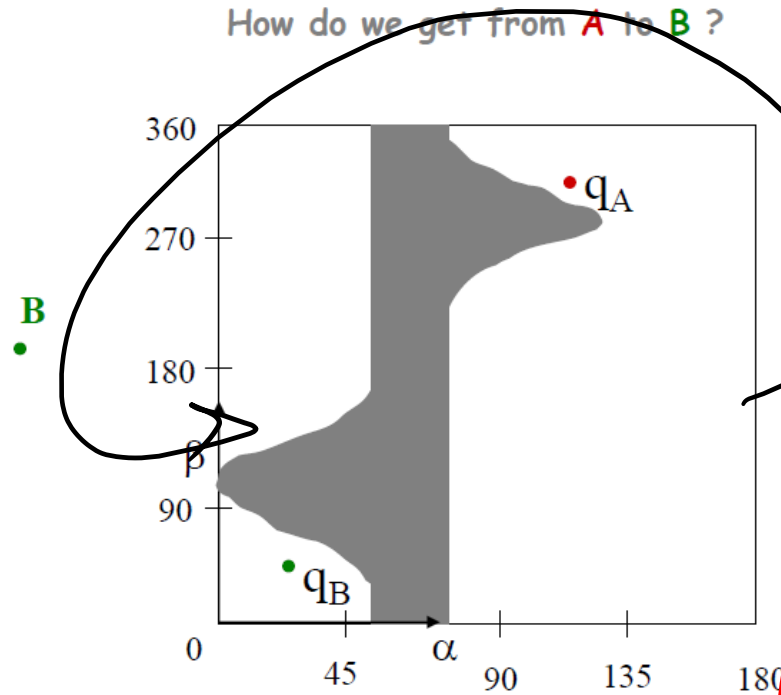
Reference configuration



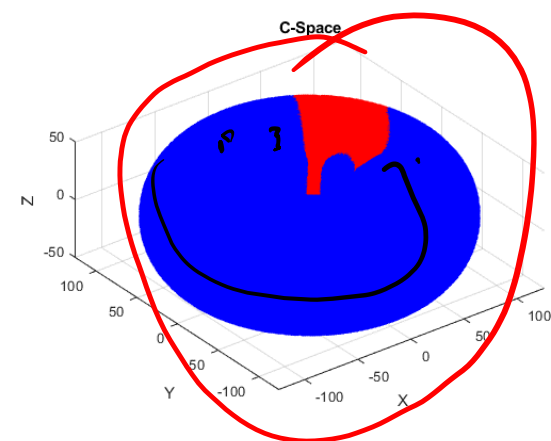
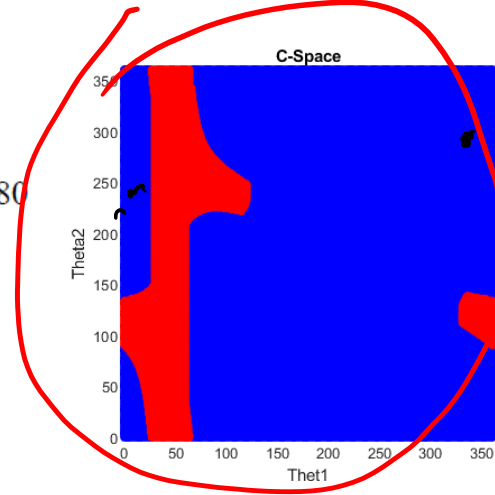
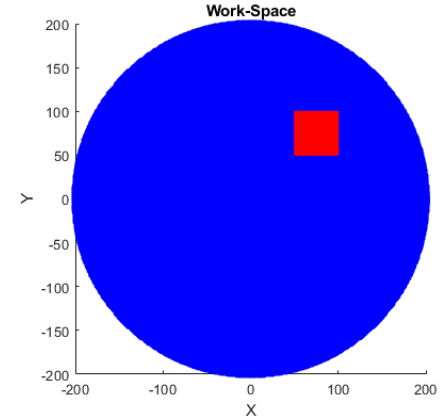
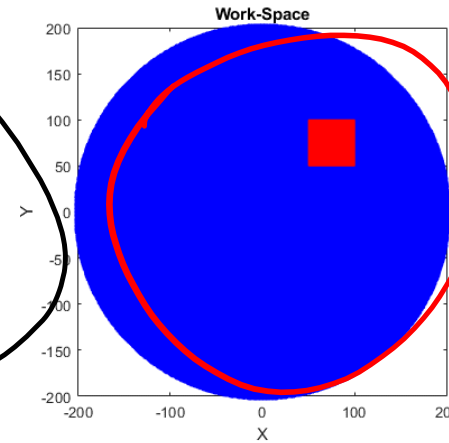
An obstacle in the robot's workspace

16-735, Howie Choset with slides from G.D. Hager, Z. Dodds, and Dinesh Mocha

How do we get from **A** to **B**?



The C-space representation  
of this obstacle...



# A special case: perhaps a simpler one

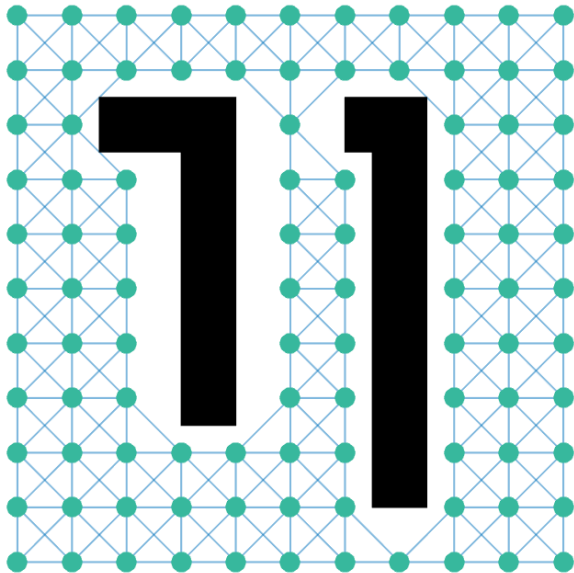
- Mobile robots
  - They are usually small
  - have simple geometric representation (polygon/point)
  - Explore/run in buildings that can be represented using geometric shapes (polygons)

# Graph based algorithms ( $A^*$ , $D^*$ , DFS etc)

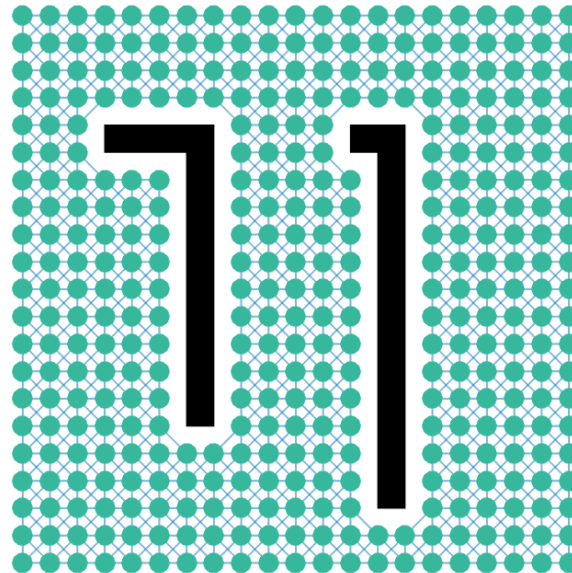
- How to compute the minimum cost path
  - Prerequisite: graph should already be available
- How do we get the graph?
  - Discretize the environment
  - Grid size??
  - Grid resolution??
  - Grid dimensions?
- What if environment has just a few obstacles or no obstacles?
  - We still need to search through the graph!!! (not the best idea!!)

# Examples

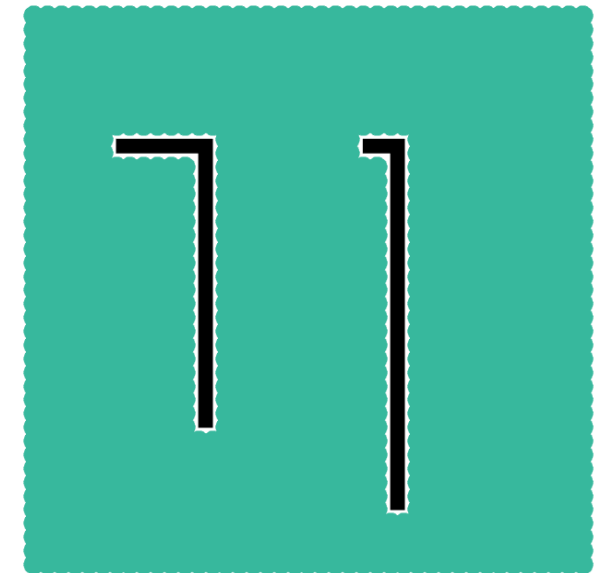
99 vertices with gridsize of 2



379 vertices with gridsize of 1



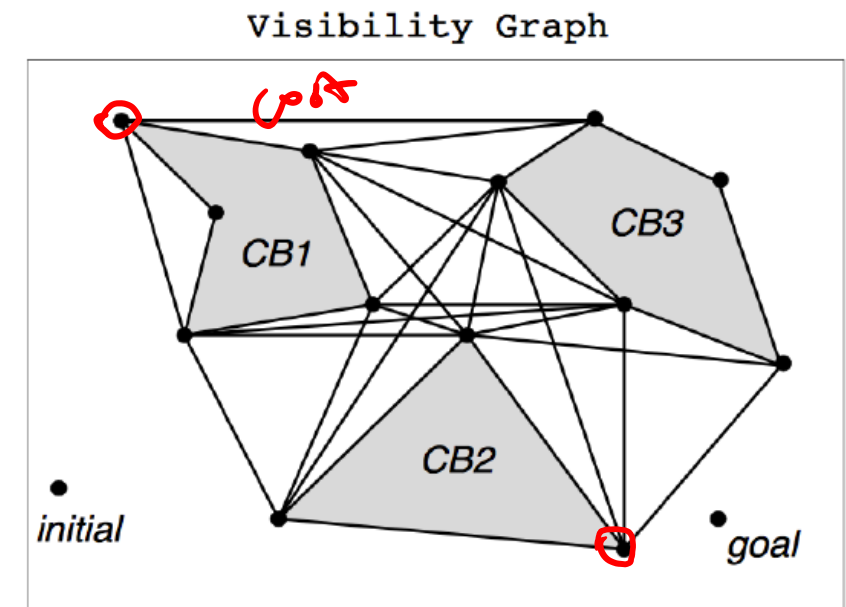
1565 vertices with gridsize of 0.5



- Same environment
  - **Different scale** of problem/solution
  - What if I want my robot to be able to localize my robot with an **accuracy of 0.1** or go as close as **0.1 to an obstacle**?? (no units, assume all in m)

# Is there a better way: **Visibility roadmaps**

- 2D environment
  - Assume **point robot**
  - **Polygonal** obstacles
- We build a graph using
  - Vertices
    - All the **vertices** of the obstacles (remember they are **polygonal**)
    - **Start** and **goal** as **vertices**
  - Edges
    - Edge if two vertices can **see each other**, or in different words, if there is a line connecting them and not passing through an obstacle
- What do we do once we have this graph?
  - Use any graph search algorithm!!!

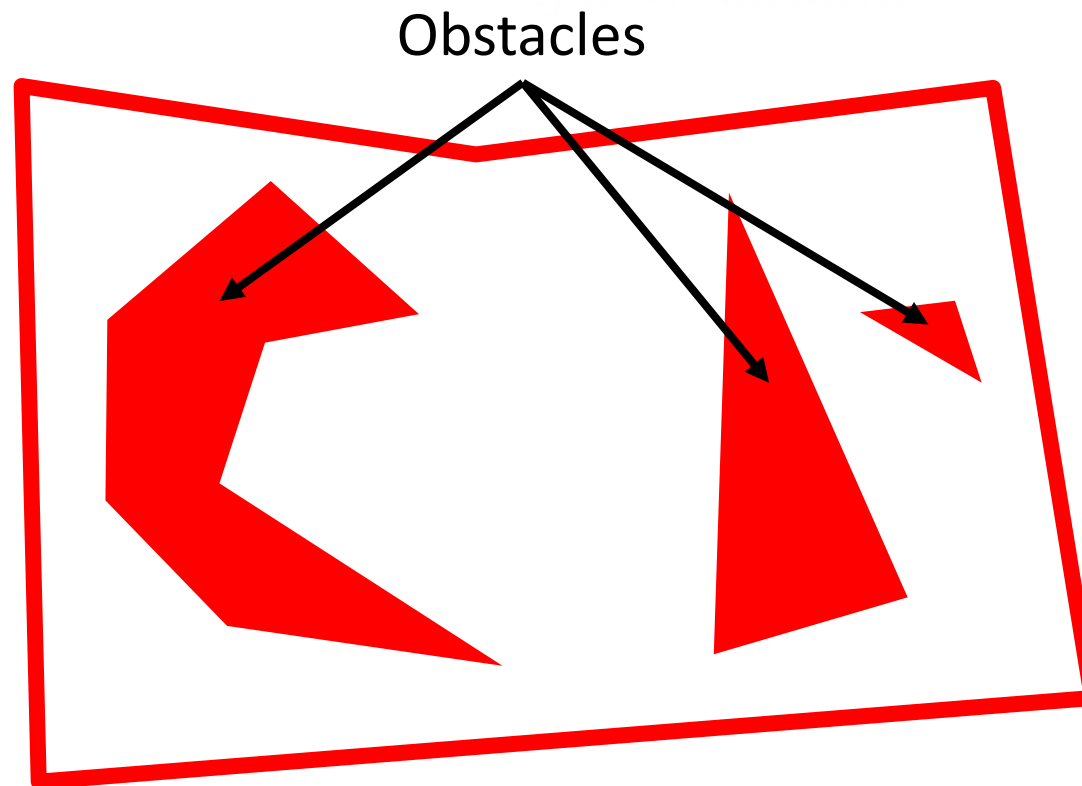


<https://parasol.tamu.edu/~amato>



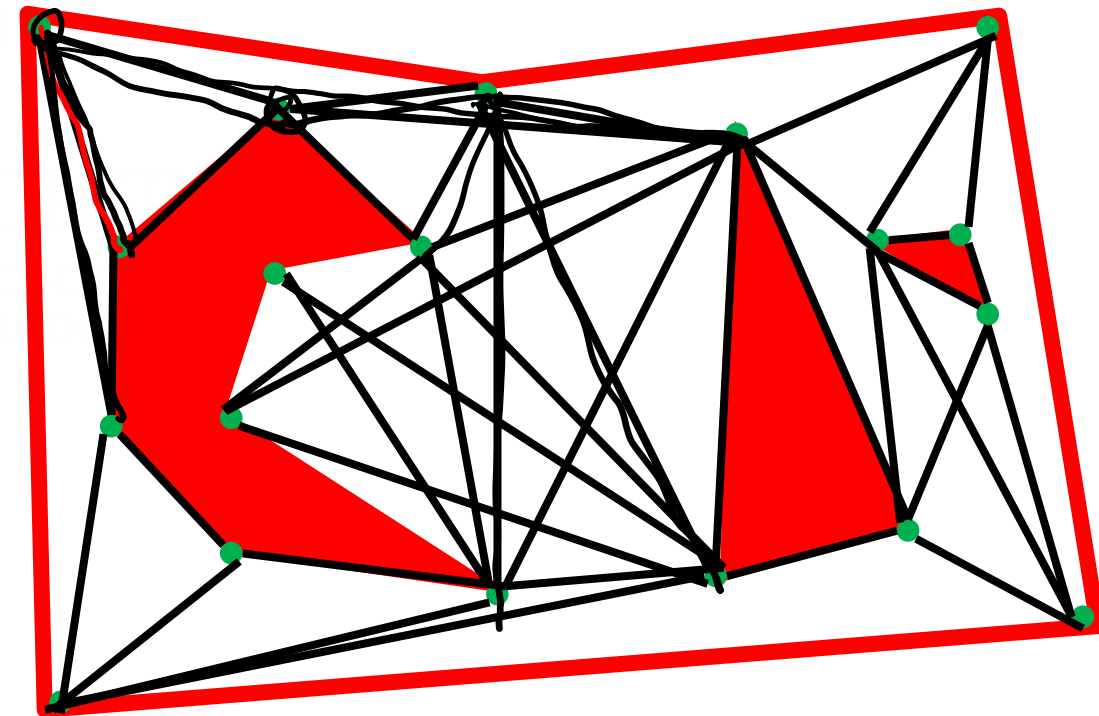
# Example: lets build a visibility map!

- Assume the following environment
- Polygonal obstacles
- Point robot (of course)



# Example : connect all the vertices (**Visibility roadmap**)

- Polygonal obstacles
- Vertices
  - All the **vertices** of the obstacles (remember they are **polygonal**)
  - **Start** and **goal** as **vertices**
- Edges
  - Edge if two vertices can **see each other**, or in different words, if there is a line connecting them and not passing through an obstacle



visibility map

# Example : connect all the vertices (**Visibility roadmap**)

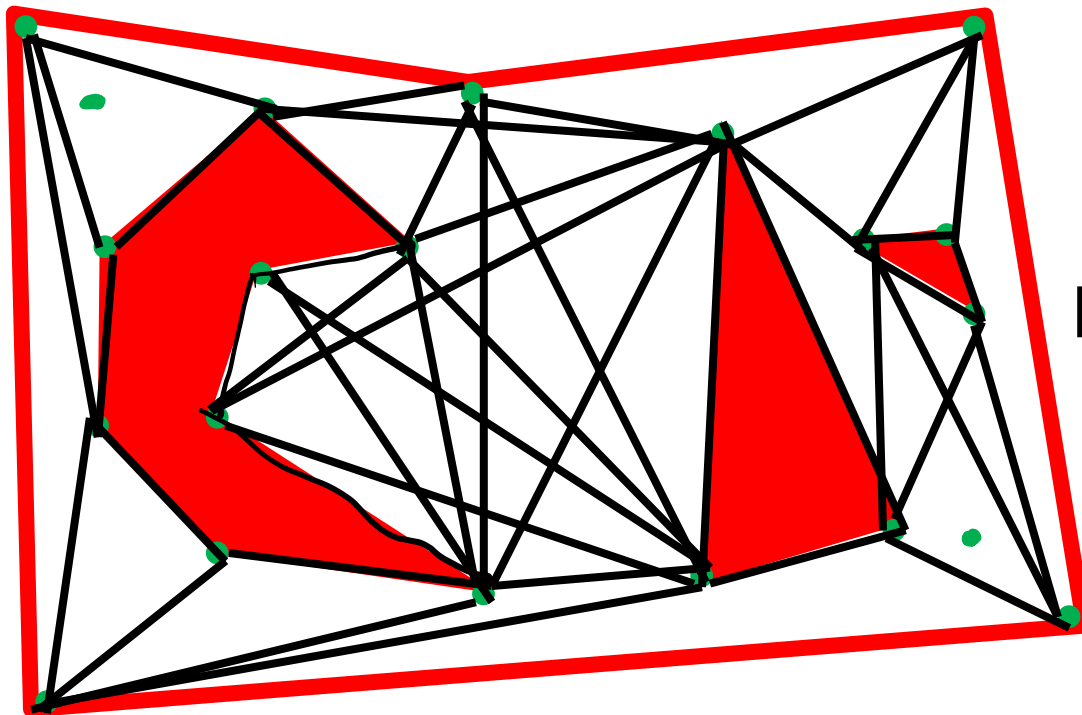
- Polygonal obstacles
- Vertices
  - All the **vertices** of the obstacles (remember they are **polygonal**)
  - **Start** and **goal** as **vertices**
- Edges
  - Edge if two vertices can **see each other**, or in different words, if there is a line connecting them and not passing through an obstacle



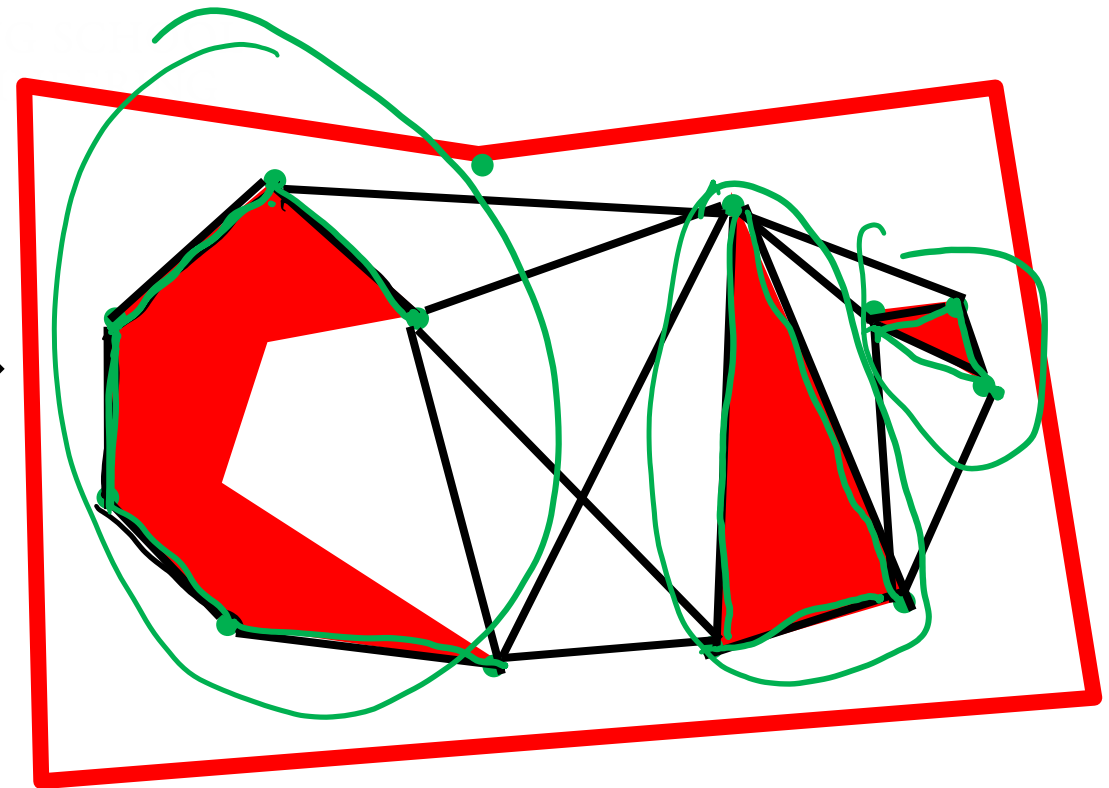
Do we need ALL the edges??

# Is there a better way: **Visibility roadmap**

- Do we need all the edges??
- Keep edges only between
  - Two reflex vertices on obstacles
  - All bitangents



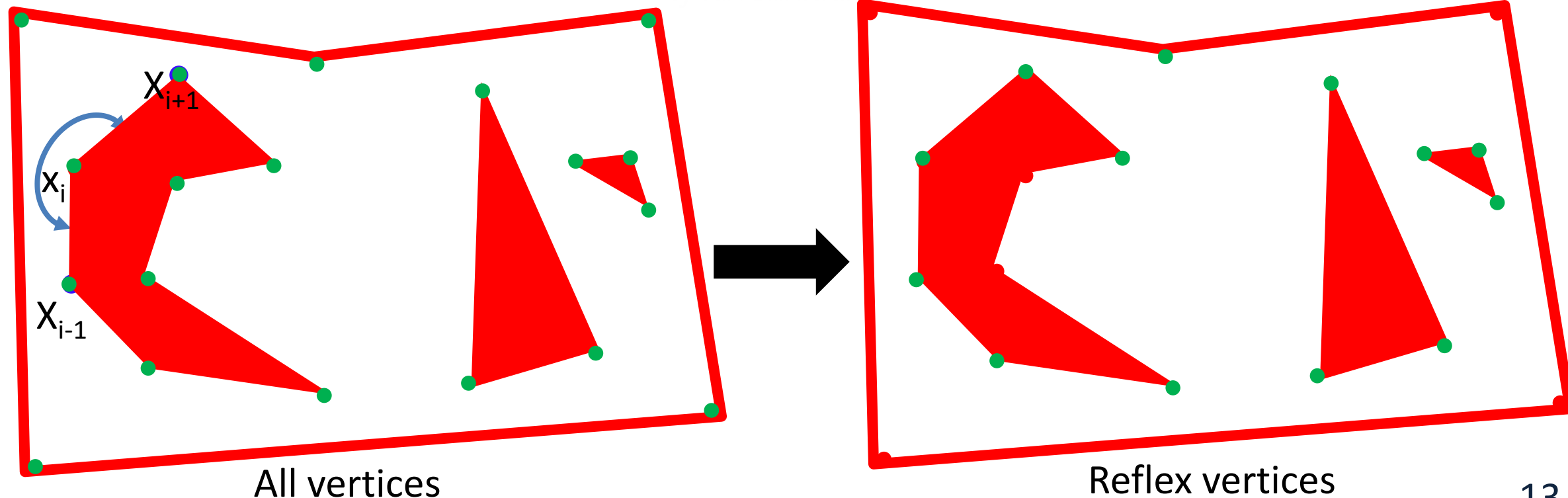
visibility map



Reduced visibility map

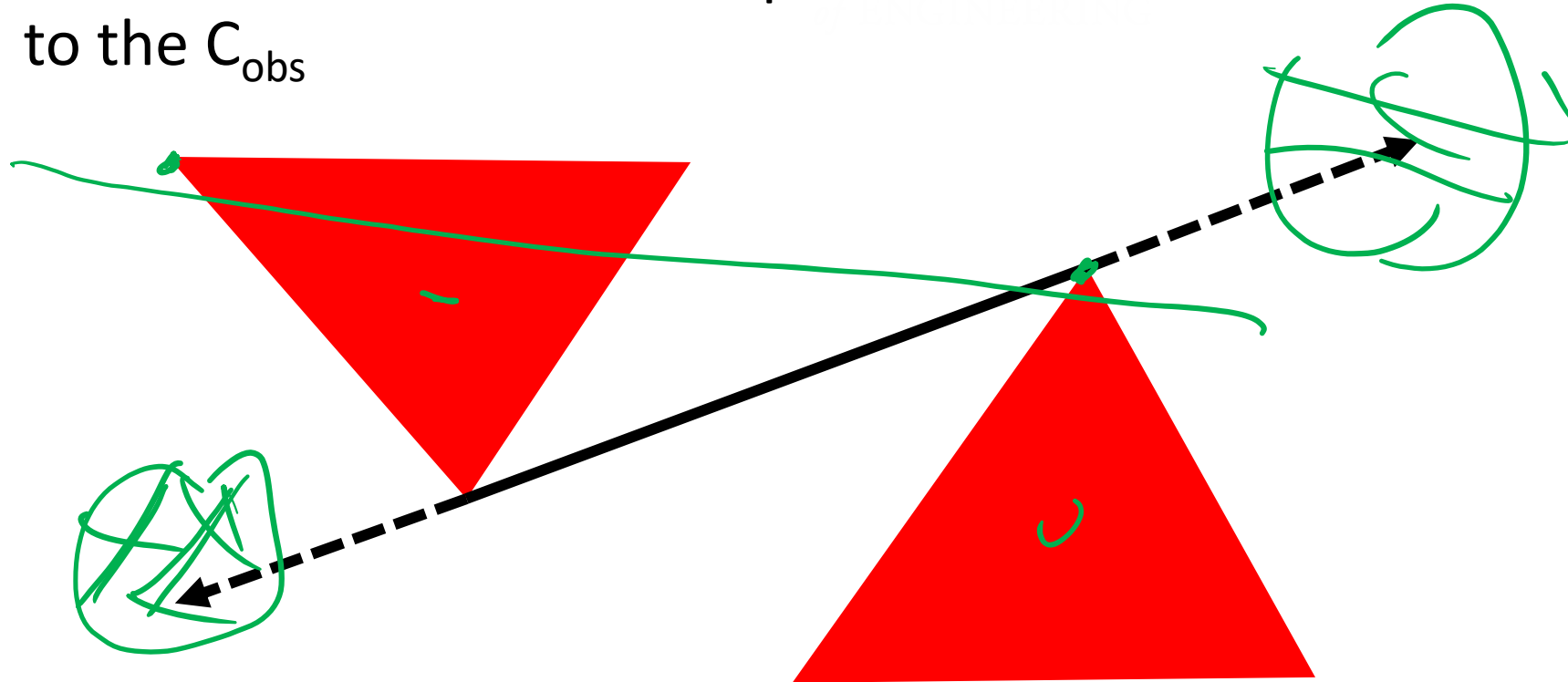
# Reflex vertices

- Reflex vertex
  - Angle between vertex  $\angle x_{i-1} x_i x_{i+1} > \pi$
  - Angle in the free space
- Repeat this for each vertex



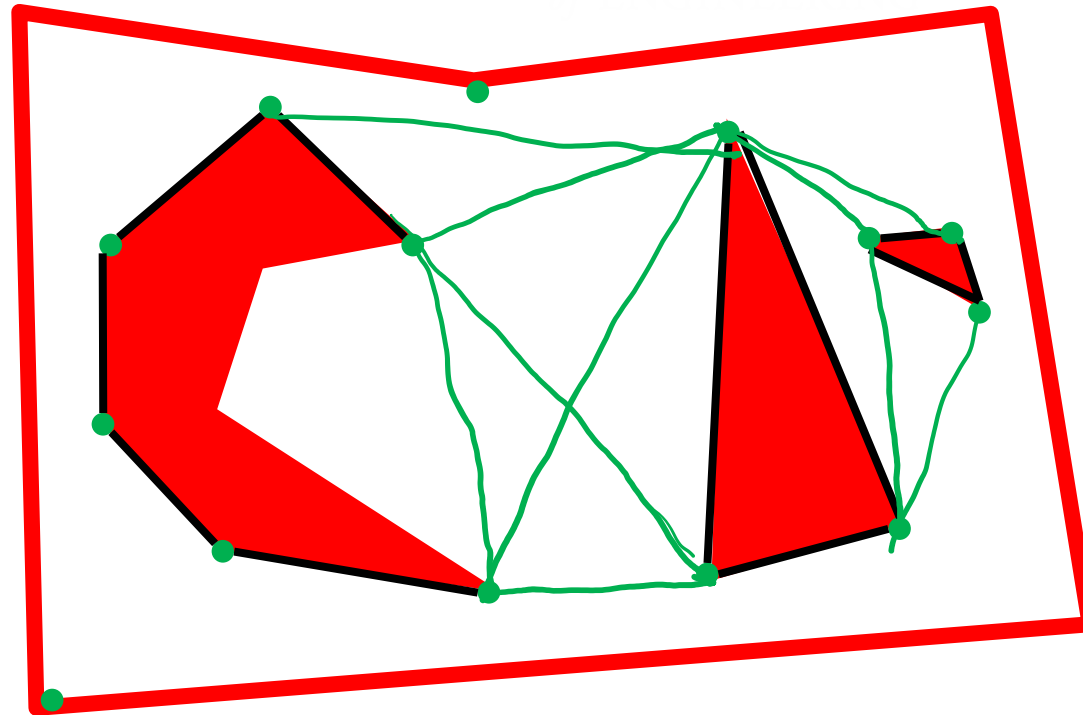
# Bitangent edge

- A bitangent edge
  - Must touch two reflex vertices that are mutually visible from each other
  - Line must extend outward past each of the vertices without poking in to the  $C_{obs}$



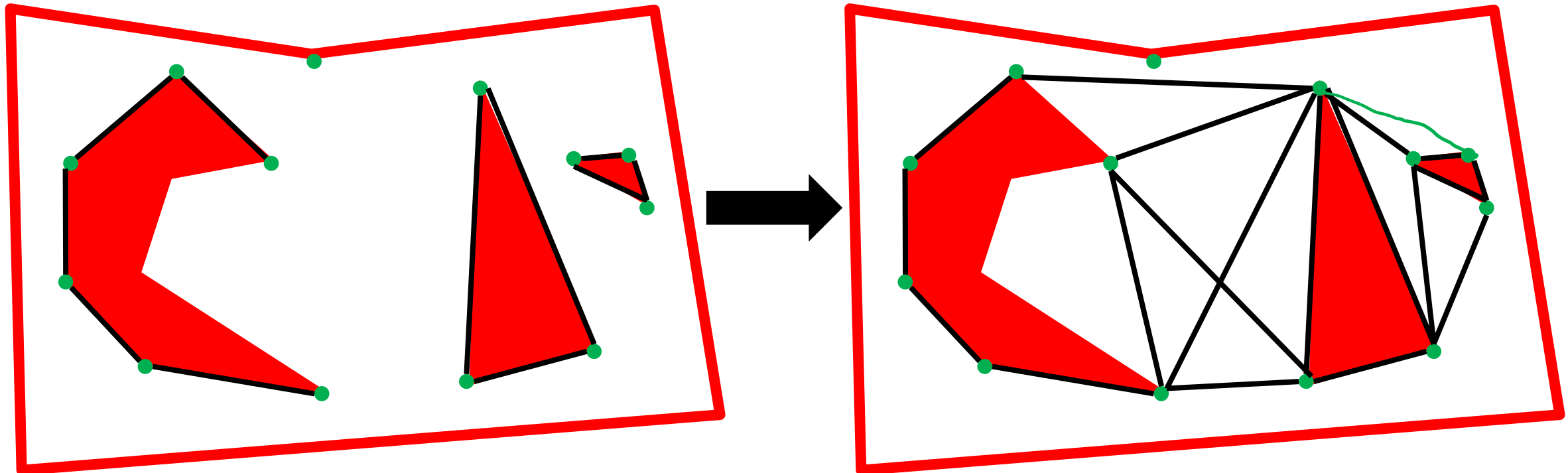
# Bitangent edge

- Keep edges only between
  - Two reflex vertices on obstacles
  - All bitangents



# Bitangent edge

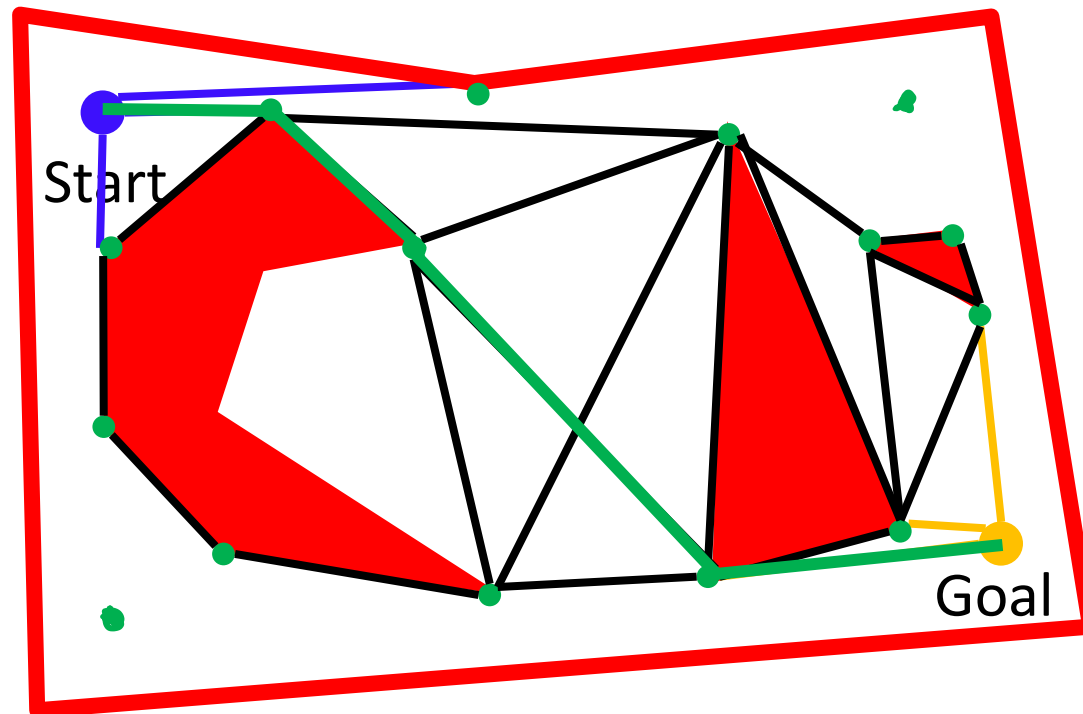
- Keep edges only between
  - Two reflex vertices on obstacles
  - All bitangents





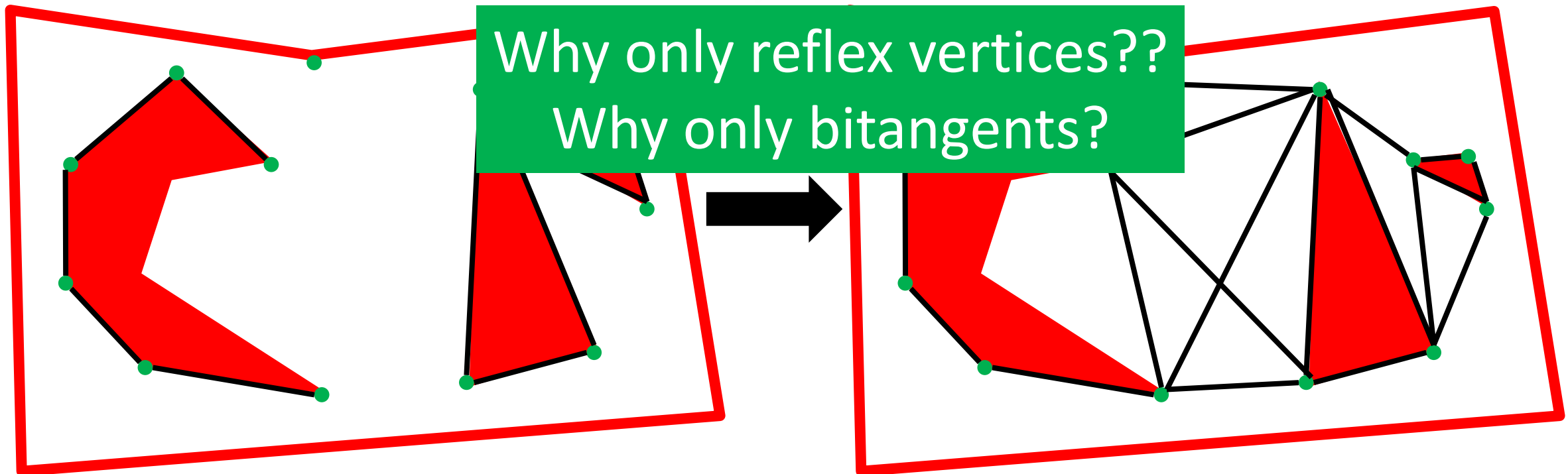
# Then what???

- The shortest-path roadmap includes edges between consecutive reflex vertices and  $C_{obs}$  and also bitangent edges
- Extend the roadmap to include Start and Goal: **connect them to all visible vertices**
- Any graph search algorithm for the shortest path



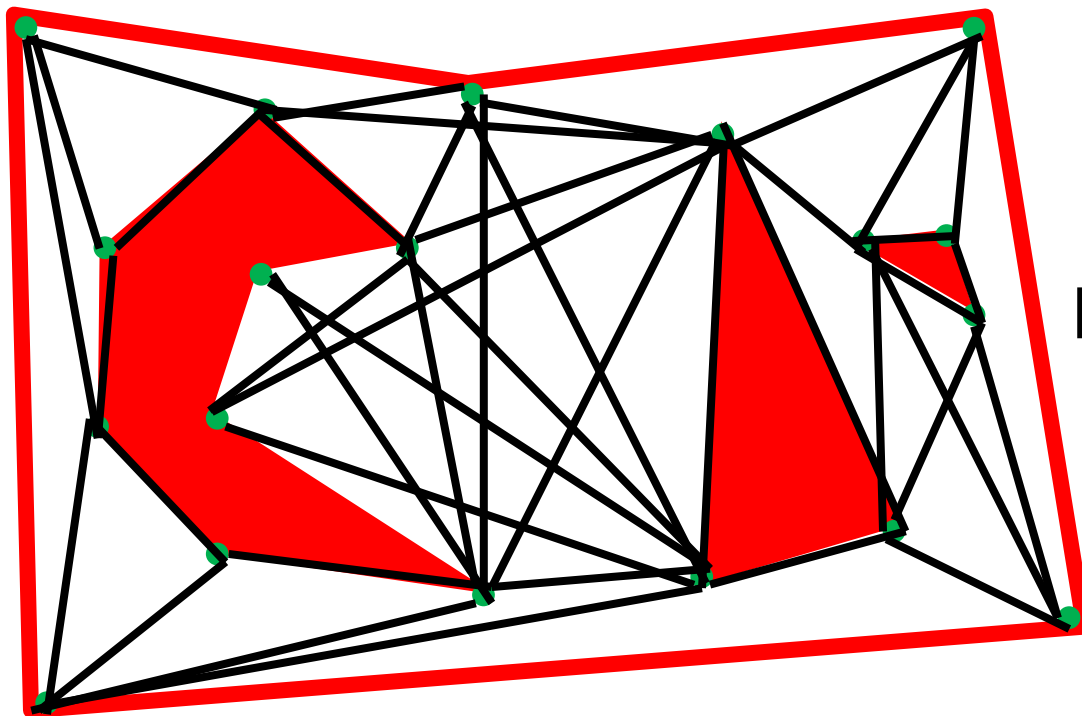
# Reduced visibility roadmap

- Two reflex vertices on obstacles
- All bitangents

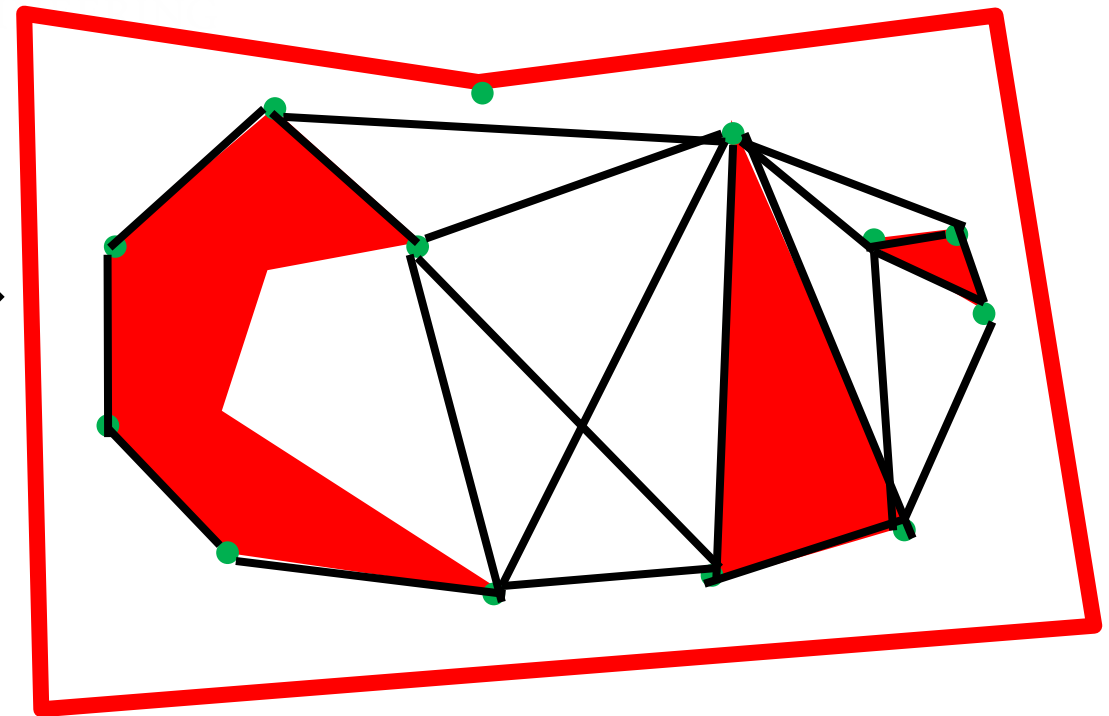


# Recap: Reduced Visibility roadmap

- Keep edges only between
  - Two reflex vertices on obstacles
  - All bitangents



visibility map



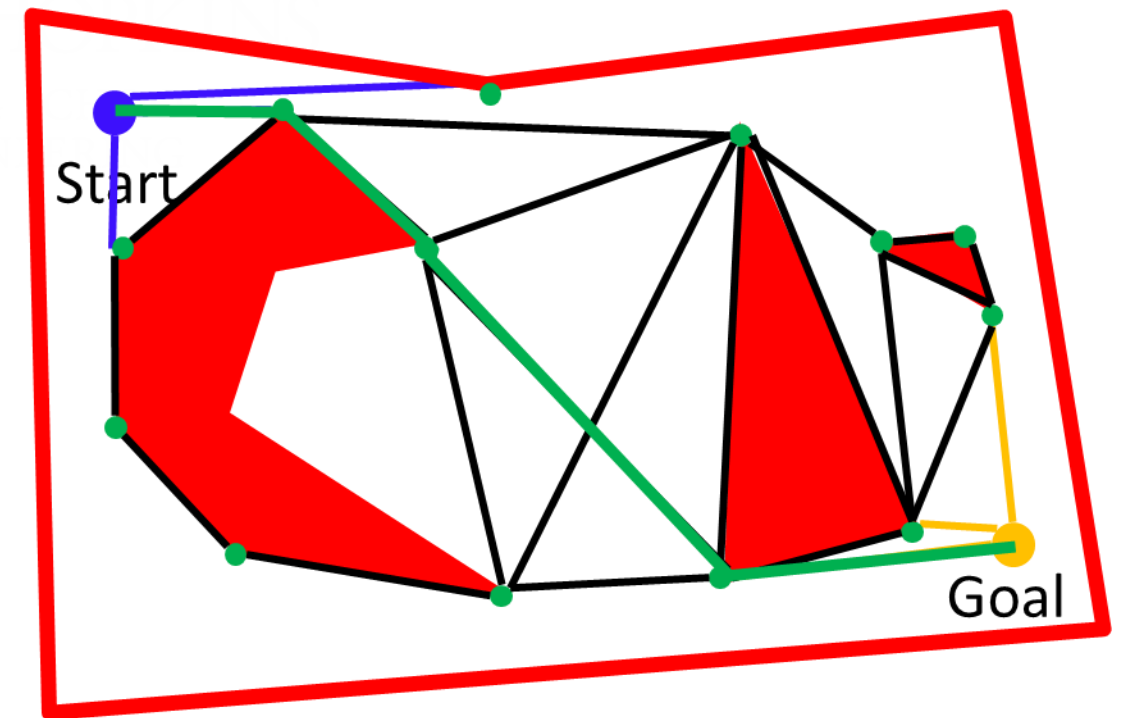
Reduced visibility map

# How do we implement?

- We need **three subroutines** to check
  - if a vertex is reflex
  - If two vertices are mutually visible
  - If there exists a bitangent
- We need to run this algorithm only once for a given environment
- A graph search algorithm
  - Dijkstra's shortest path
  - DFS
  - BFS

# When do we want to use visibility roadmaps?

- Static environment
  - **Pre-compute** the **reduced** visibility roadmap
- Allows us to find a path (not necessarily the shortest) between any given **start** and **goal**
  - Just add the start and goal to the graph
- Can query multiple times by changing the **start** and **goal**

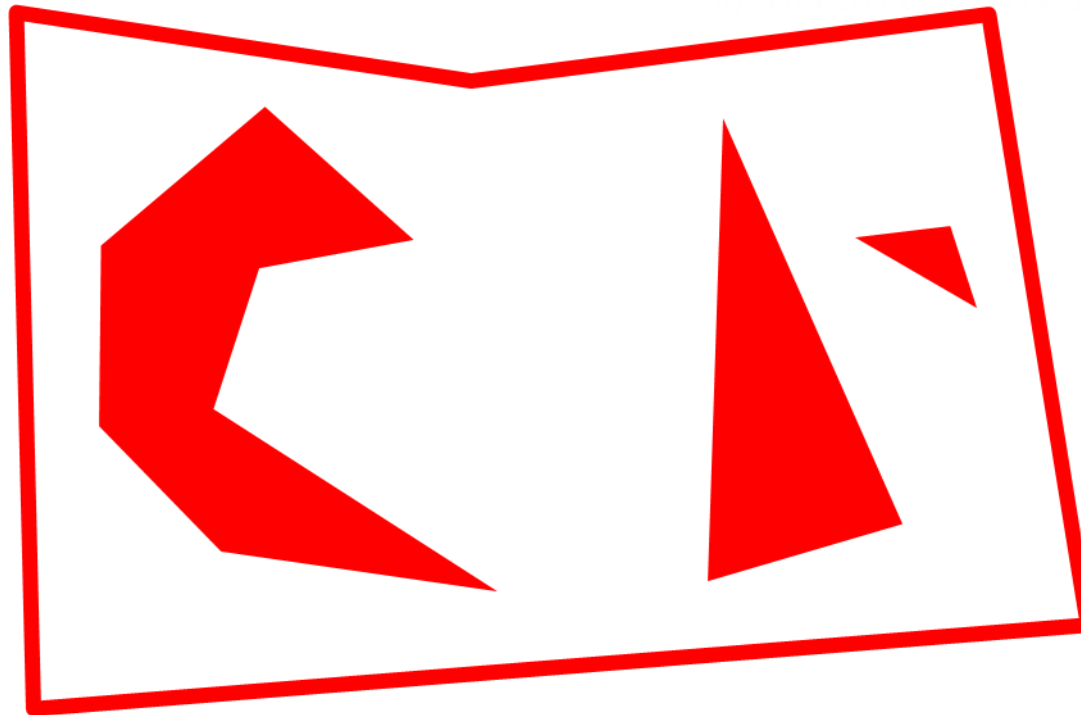


# Shortest-Path Roadmaps

- **Graze** the obstacle vertices in the reduced visibility roadmap
- This also means that robot is very close to the obstacle (but not colliding) all the time
  - This works only if we assume **a point robot**
  - Also robot must have really **good collision detection sensors and control** otherwise **collision can not be avoided**
- What to do if the robot is **not a point robot???**

# Minkowski Sum

- Inflate the obstacles: the inflated obstacle is called as C-space obstacles or  $C_{obs}$
- Then plan assuming a point robot



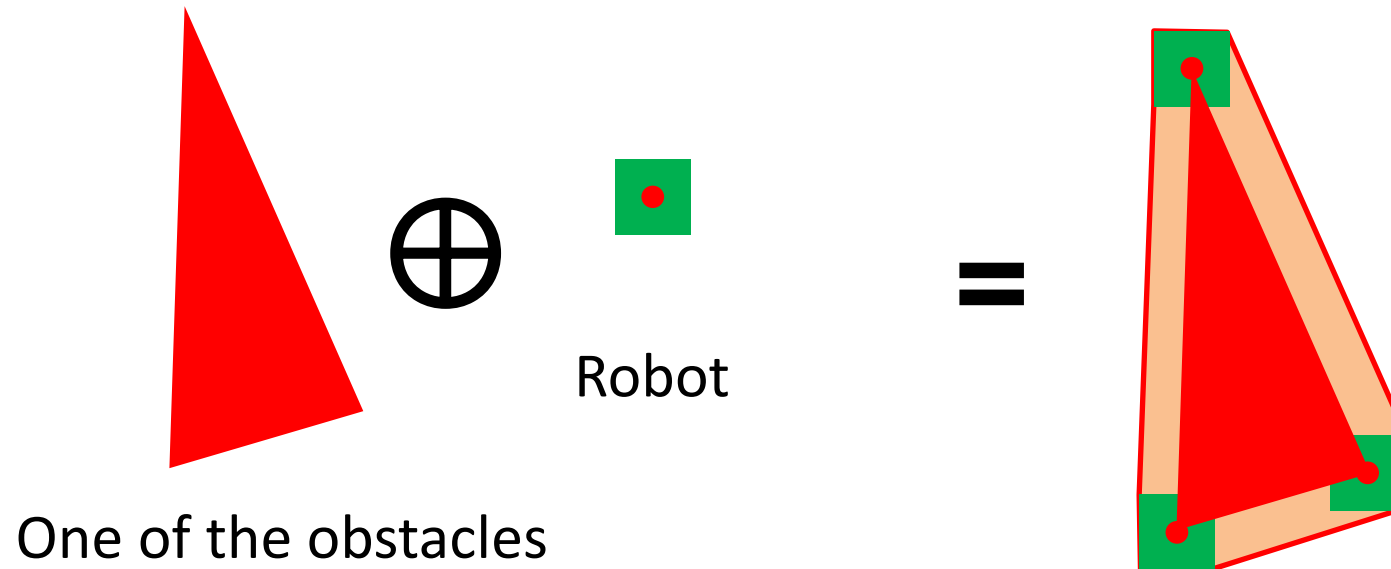
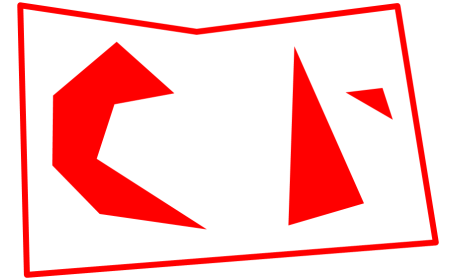
Environment



Robot

# Minkowski Sum

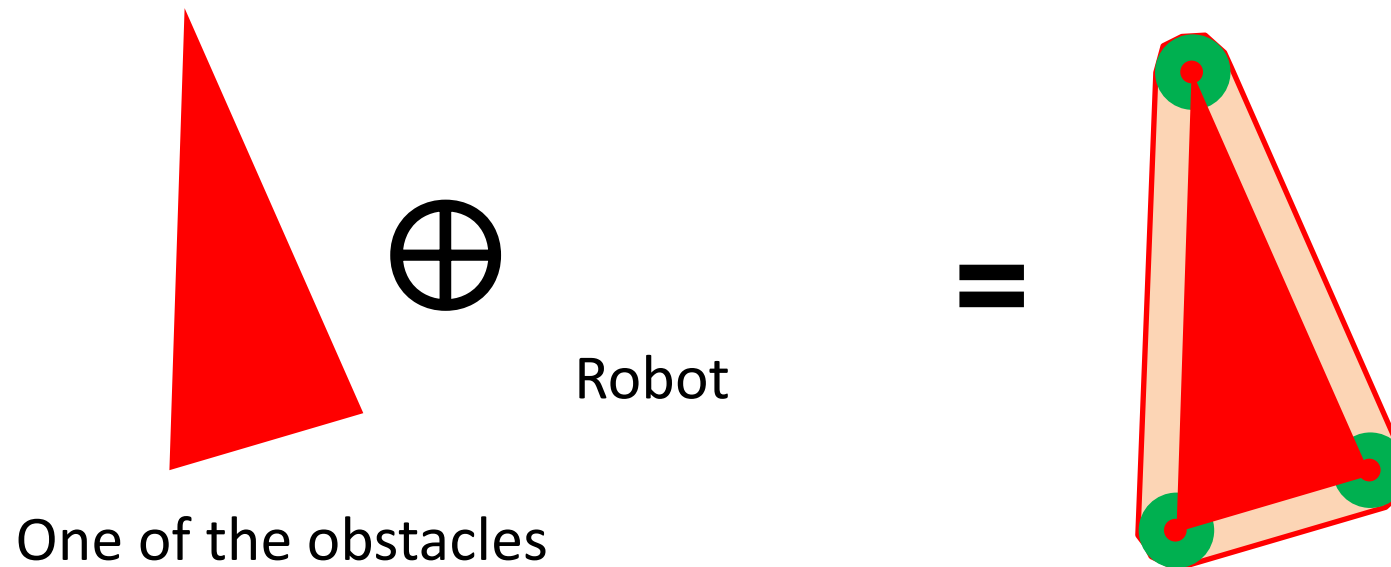
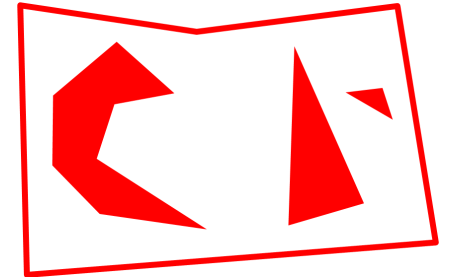
- A: obstacle and B: robot
- Minkowski Sum
  - $A \oplus B = \{ a + b \mid a \in A, b \in B \}$
- Slide origin of B on every point (boundary) of A
- Its kind of a higher dimensional convolution





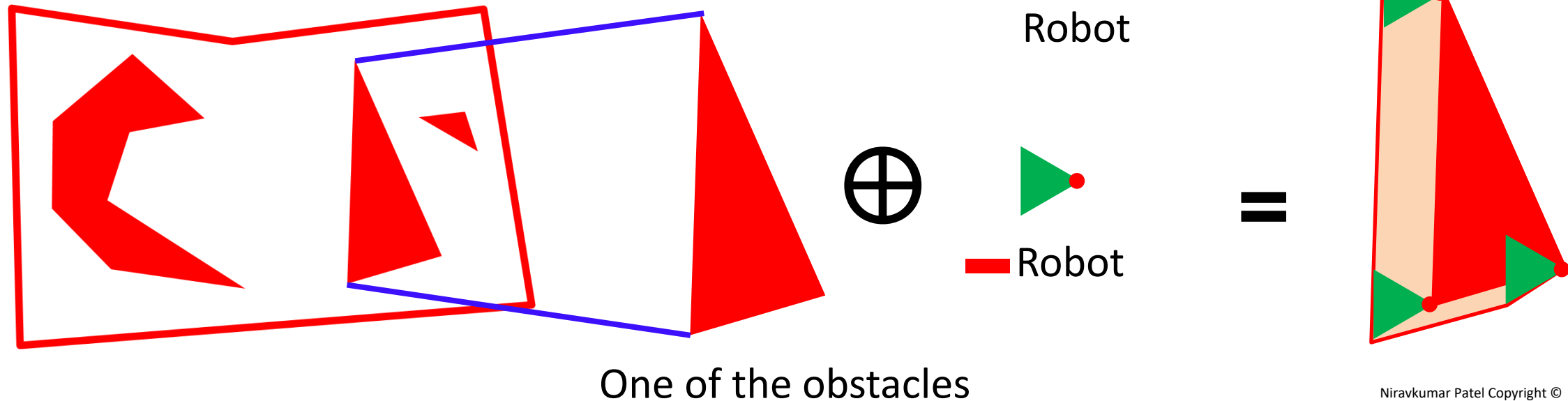
# Minkowski Sum

- A: obstacle and B: robot
- Minkowski Sum
  - $A \oplus B = \{ a + b \mid a \in A, b \in B \}$
- Slide origin of B on every point (boundary) of A
- Its kind of a higher dimensional convolution



# Minkowski Difference: **non-symmetric** robot

- A: obstacle and B: robot
- Minkowski **Difference**
  - $A + (-B) = \{ a - b \mid a \in A, b \in B \}$
- Flip the robot and then slide origin of B on every point (boundary) of A

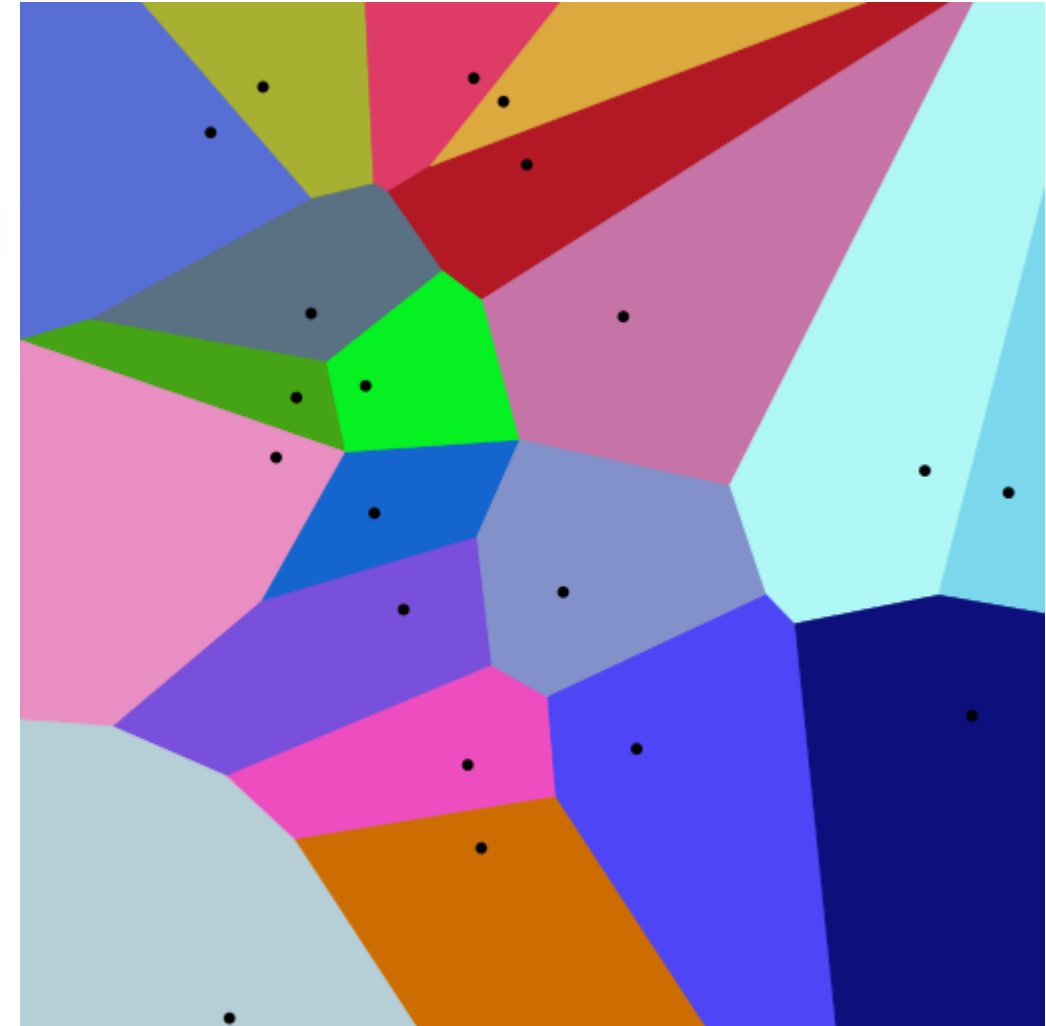


# What if shortest-path isn't what we want?

- Safest path/maximum clearance path?
  - maximum possible obstacle distance
- Take a simple case
  - Two **point** obstacles
  - Midway point between them is the maximum clearance path point
- What if we extend it to n **point** obstacles?
  - We get **Voronoi Diagram** !!

# Voronoi Diagram

- Partition the plane (2D) into regions (like city zones/pin codes)
- Each region/cell (zone) is **closer to a single point  $x_i$**  than any other point in the whole plane
  - We must define the distance metrics
- Do we use such an arrangement?
  - Post office location and their serving area?
  - Fire stations and their serving area?
  - It's an optimal solution to make every other point in the plane have best possible access to a given resource located at  $X_i$

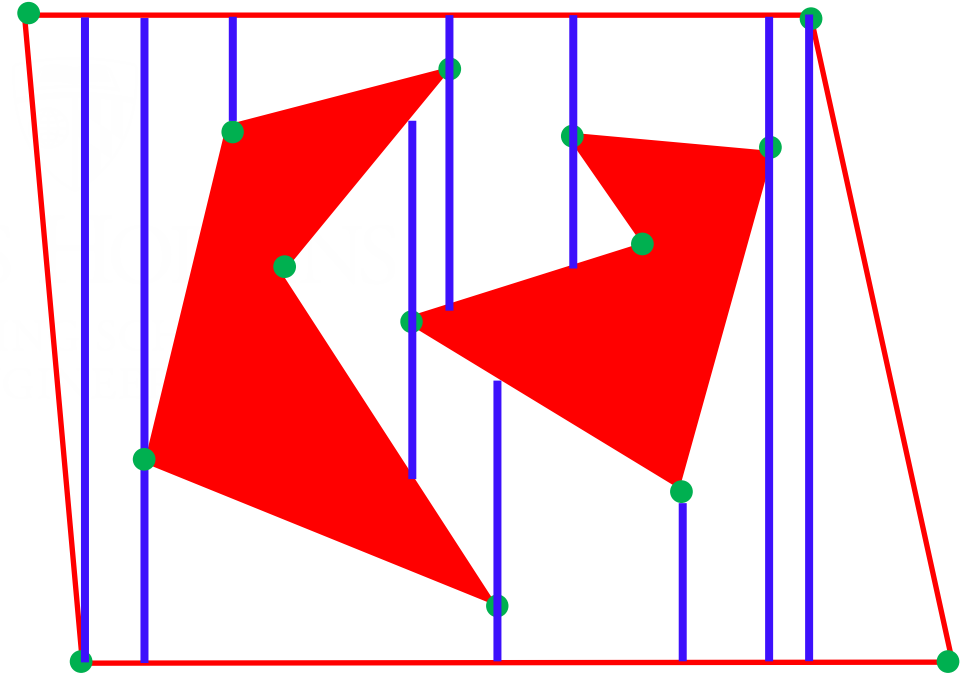
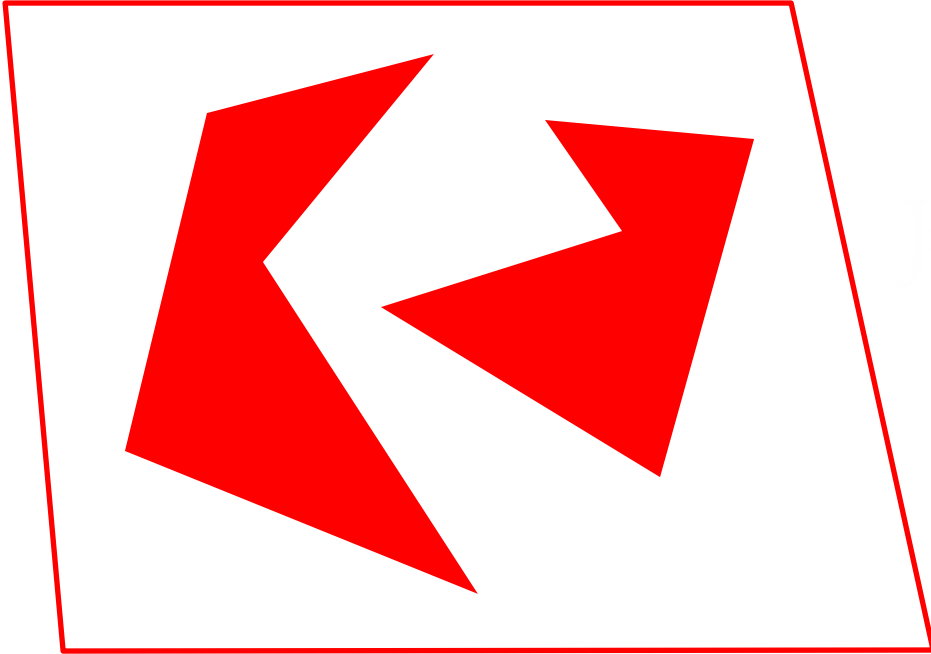


Source: Wikipedia

# Maximum Clearance Roadmaps

- How do we generate such a roadmap?
  - Generalized Voronoi diagrams
  - Skeletonization
- There are many other ways

# Vertical Cell Decomposition

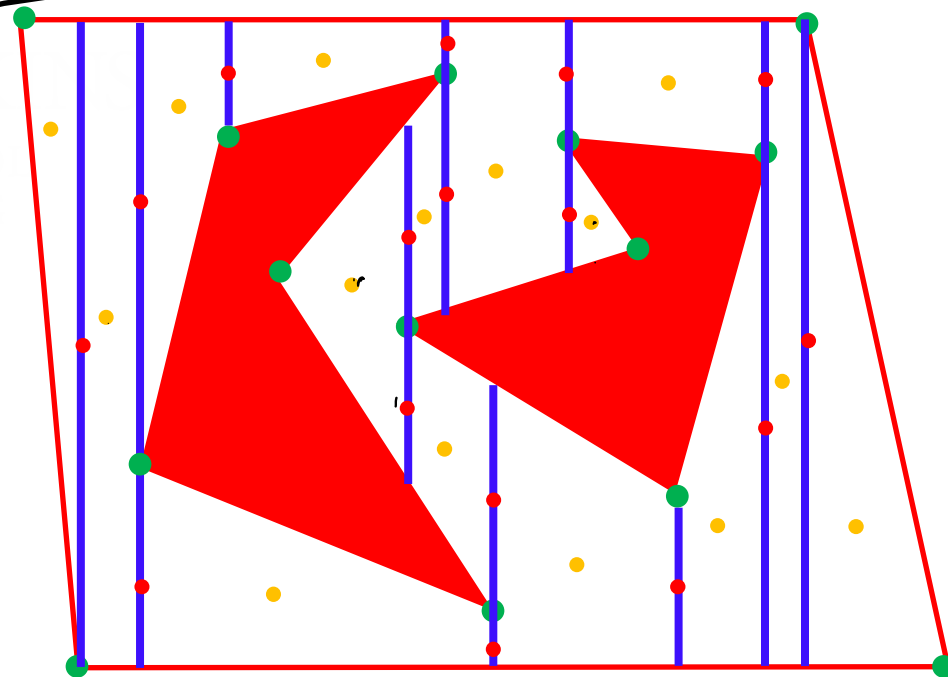


- Consider the above environment
- Mark each vertex
- Draw a vertical line from each vertex until the line hits an obstacle

# Vertical Cell Decomposition

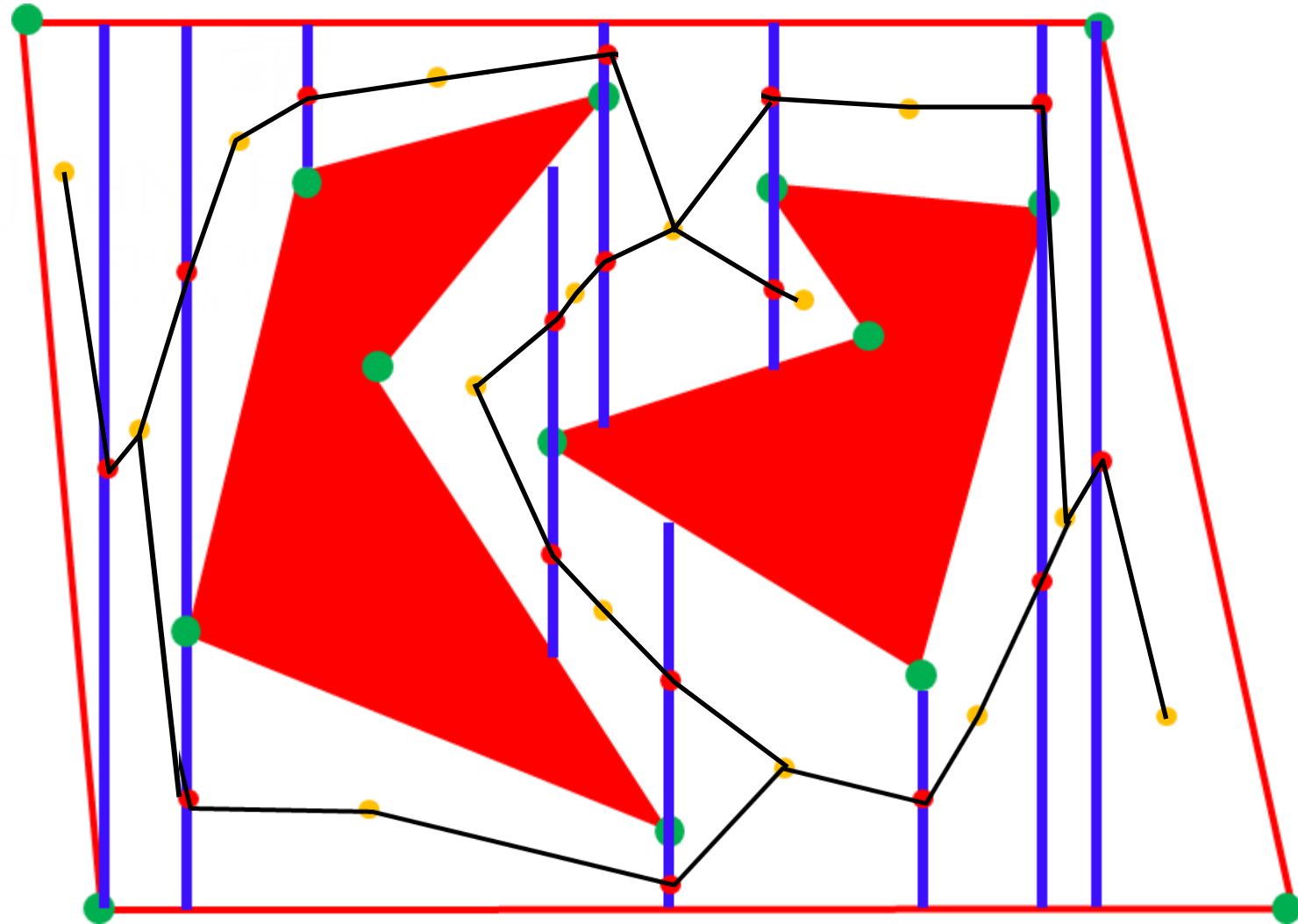
- Create vertices at
  - Centroid of the cell
  - At the mid point of the vertical lines
- Add edges only to left and right neighbours

*do we need them?*



# Vertical Cell Decomposition

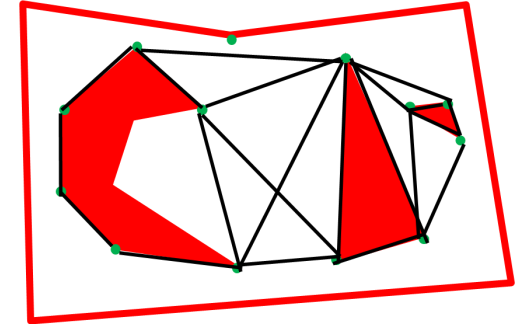
- Create vertices at
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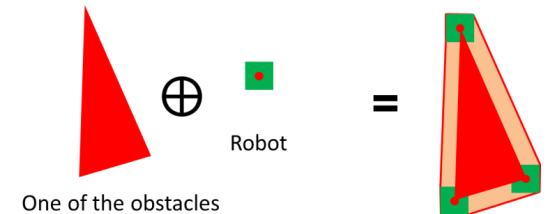


# Recap

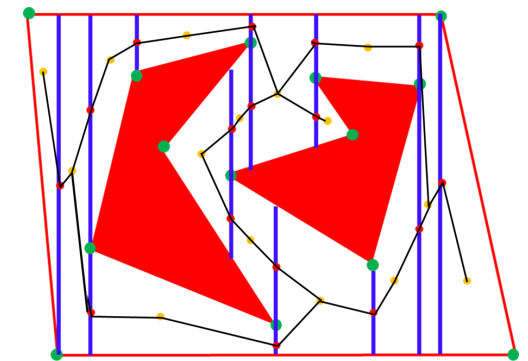
- Visibility roadmaps
  - Reduced visibility roadmap
    - Still a point robot
    - Minimum distance roadmap
    - Always grazing the obstacles
  - Minkowski sum
    - Inflate the obstacles to get  $C_{obs}$
    - Works well for polygonal obstacles and robot
  - Vertical cell decomposition
    - A simple approach to divide the environment into smaller cells



Reduced visibility map



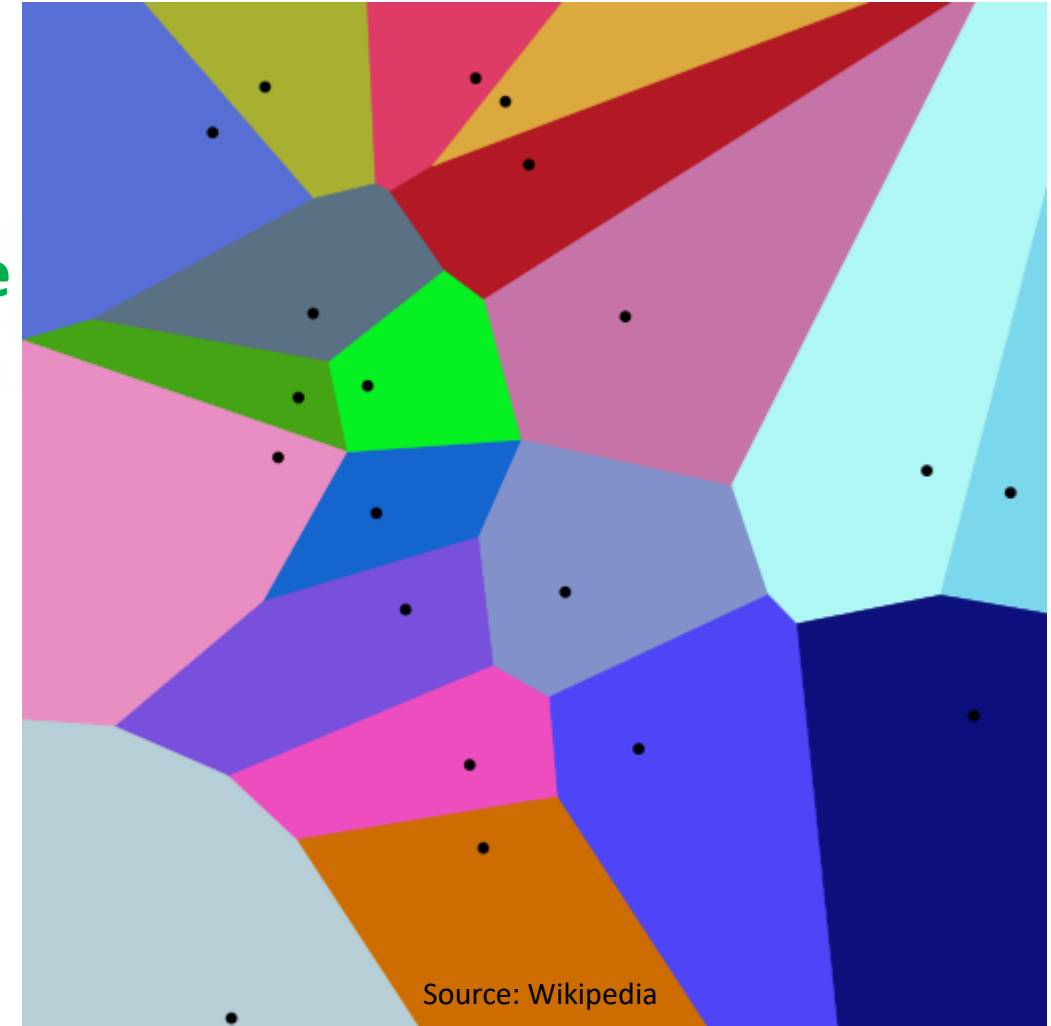
One of the obstacles



Vertical Cell Decomposition

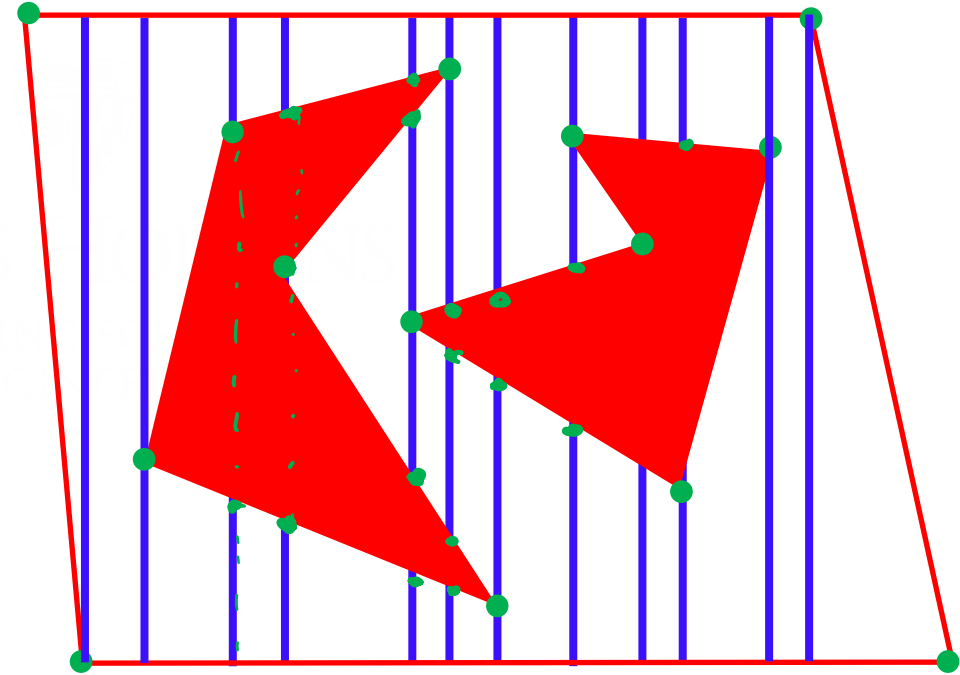
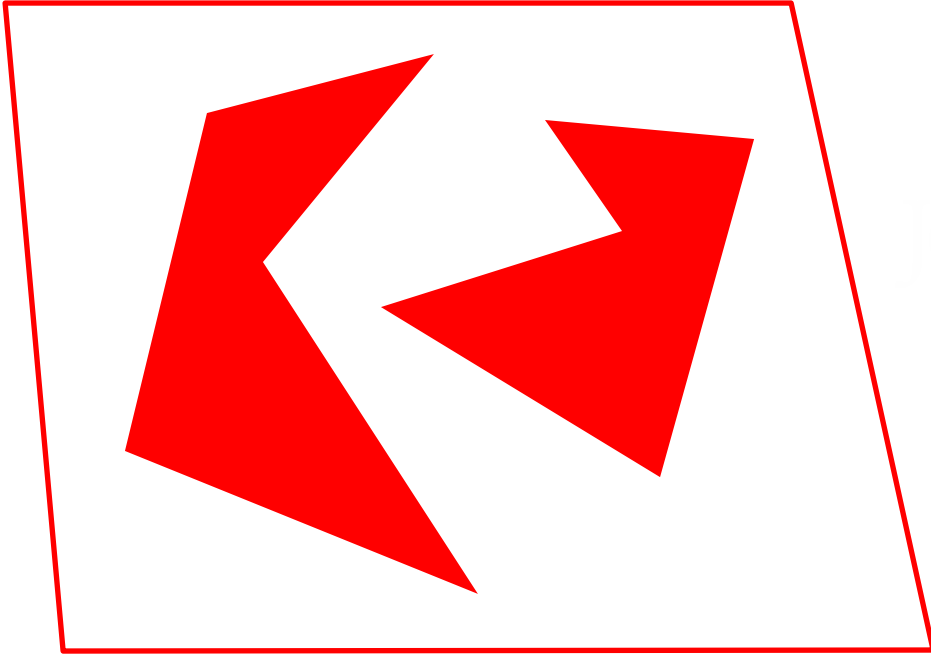
# Voronoi Diagram: **maximum clearance roadmap**

- Partition the plane (2D) into regions (like city zones/pin codes)
- Each region/cell (zone) is **closer to a single point  $x_i$**  than any other point in the whole plane
  - We must define the distance metrics
- Do we use such an arrangement?
  - Post office location and their serving area?
  - Fire stations and their serving area?
  - It's an optimal solution to make every other point in the plane have best possible access to a given resource located at  $X_i$



maximum clearance roadmap

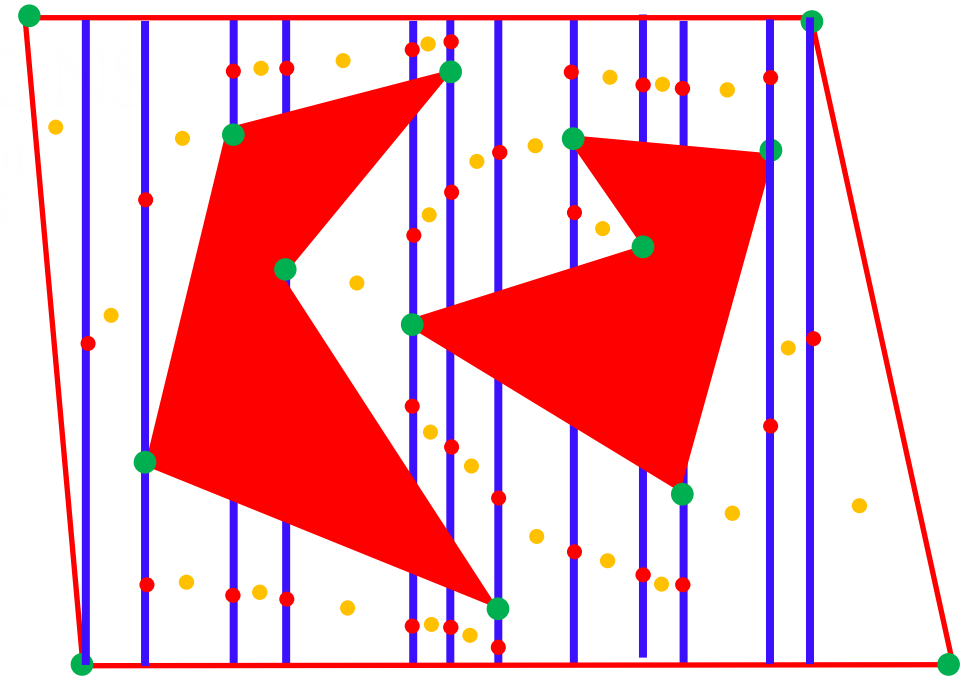
# Cylindrical Decomposition



- Consider the above environment
- Mark each vertex
- Draw a vertical line from each vertex ~~until the line hits an obstacle~~ and let them continue after the obstacles ( **$-\infty Y - +\infty Y$** )

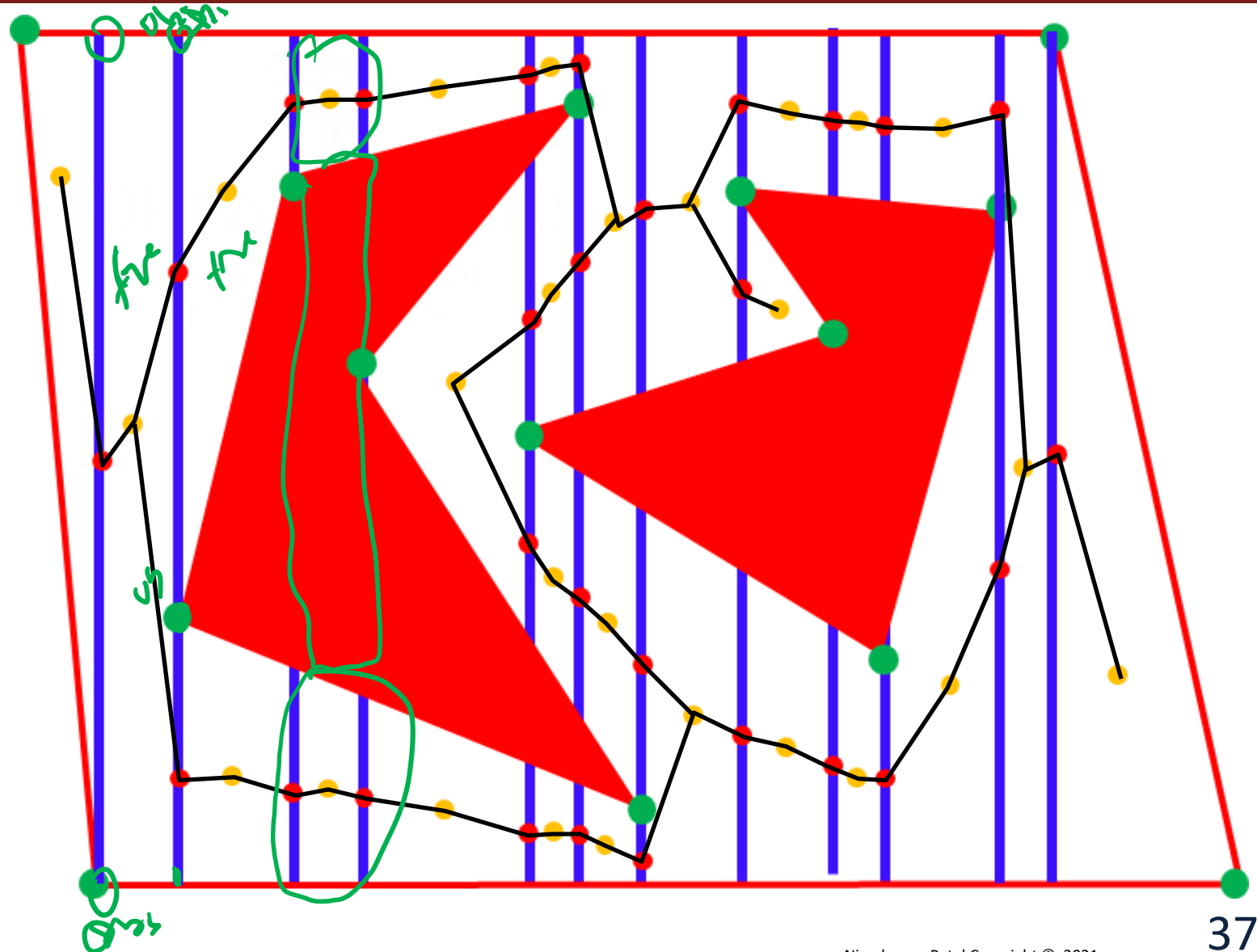
# Cylindrical Decomposition

- Create vertices at
  - Centroid of the cell
  - At the mid point of the vertical lines
- Add edges only to left and right neighbours



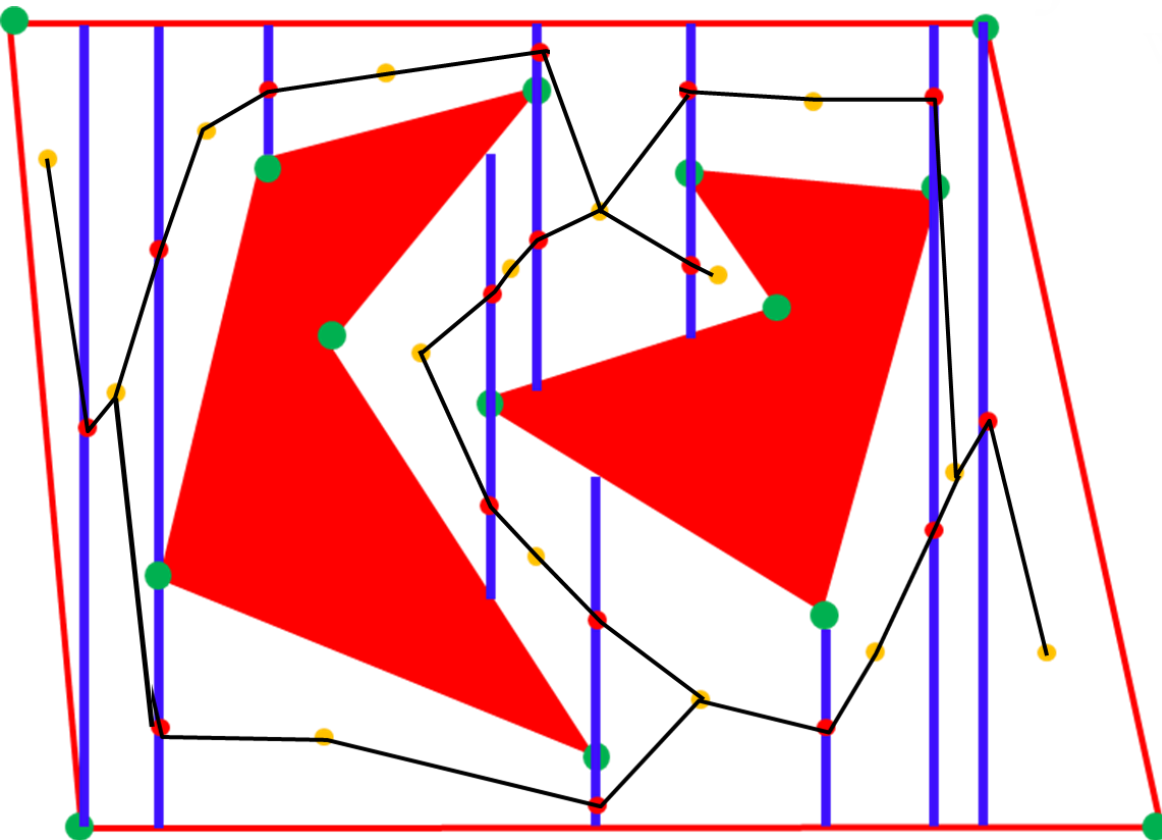
# Cylindrical Decomposition

- Create vertices at
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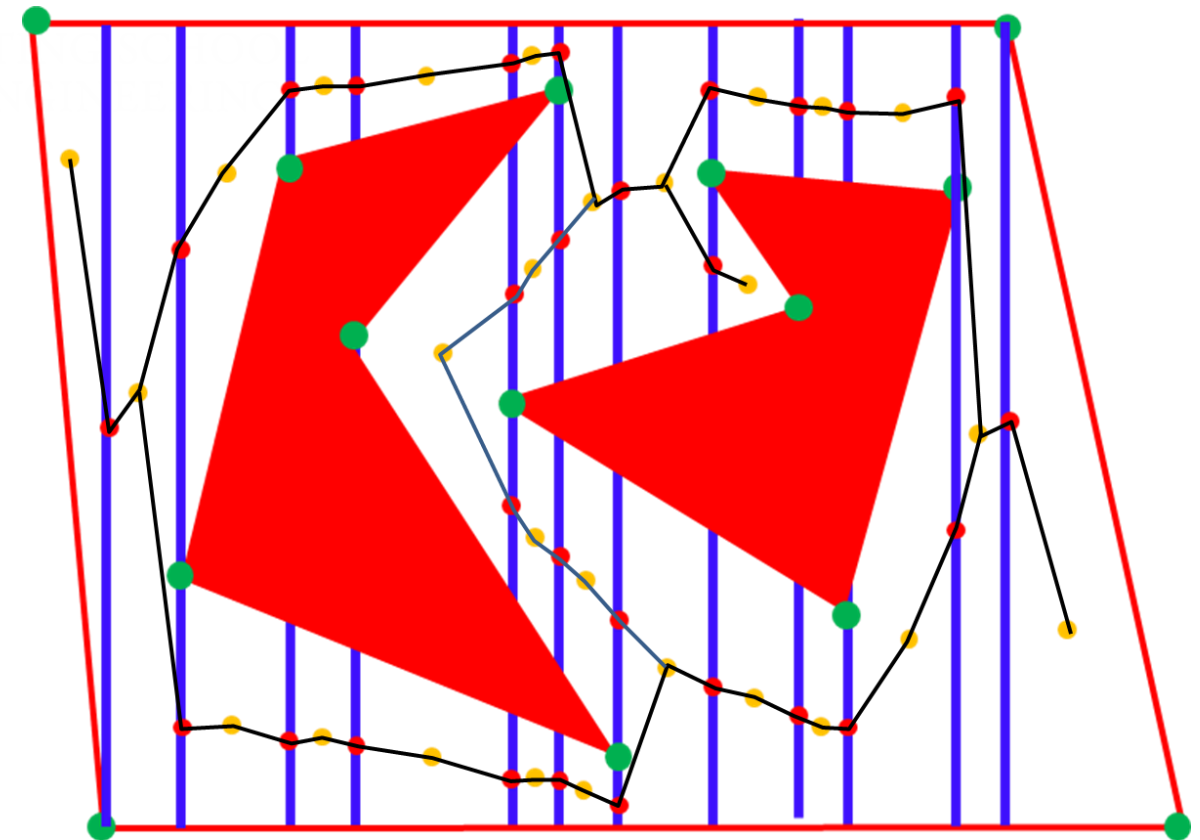


# Vertical Cell Vs. Cylindrical Decomposition

- Alternate events on the vertical lines are  $C_{\text{obs}}$  and  $C_{\text{free}}$
- Each strip (cylinder) is a stack of cells made of alternating  $C_{\text{obs}}$  and  $C_{\text{free}}$
- Generalizes better to higher dimensions and more complex configuration spaces



Vertical Cell Decomposition



Cylindrical Decomposition

# Triangulation

- Divide  $C_{\text{free}}$  into triangles
- Place vertices at
  - Centroid of each triangle
  - Mid-point of each of the sides of the triangle that is in  $C_{\text{free}}$
- Have to avoid thin triangles: more of a computational geometry problem and solutions exist for this

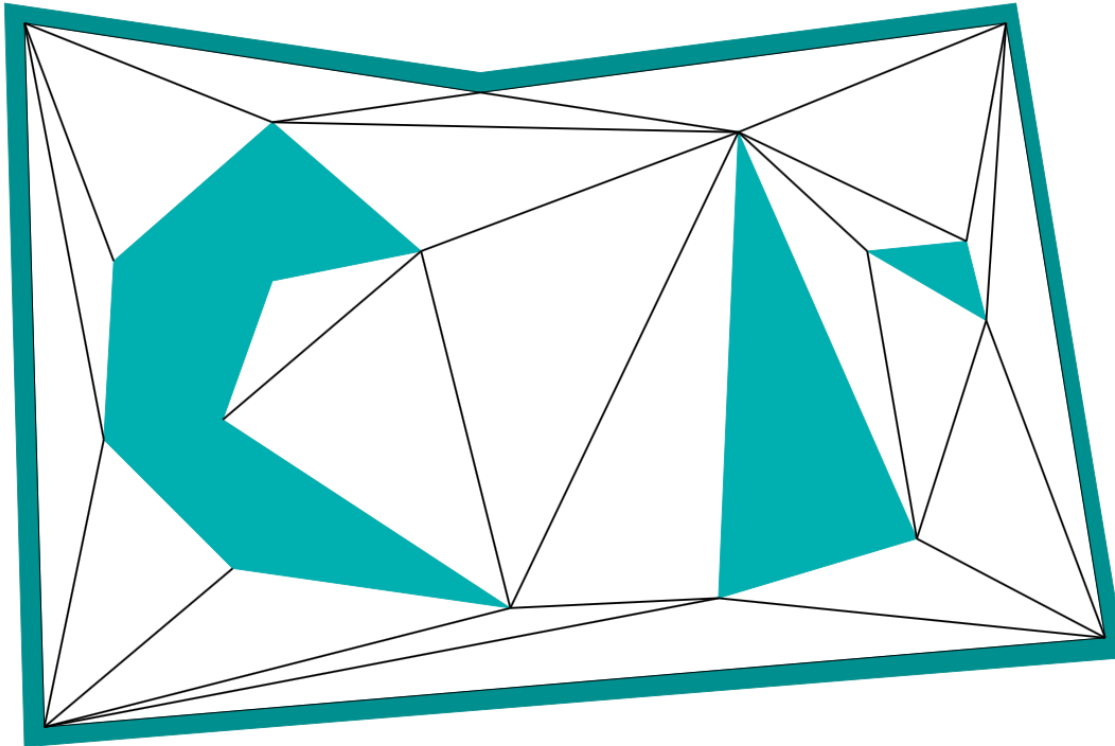


Figure 6.16: A triangulation of  $C_{\text{free}}$ .

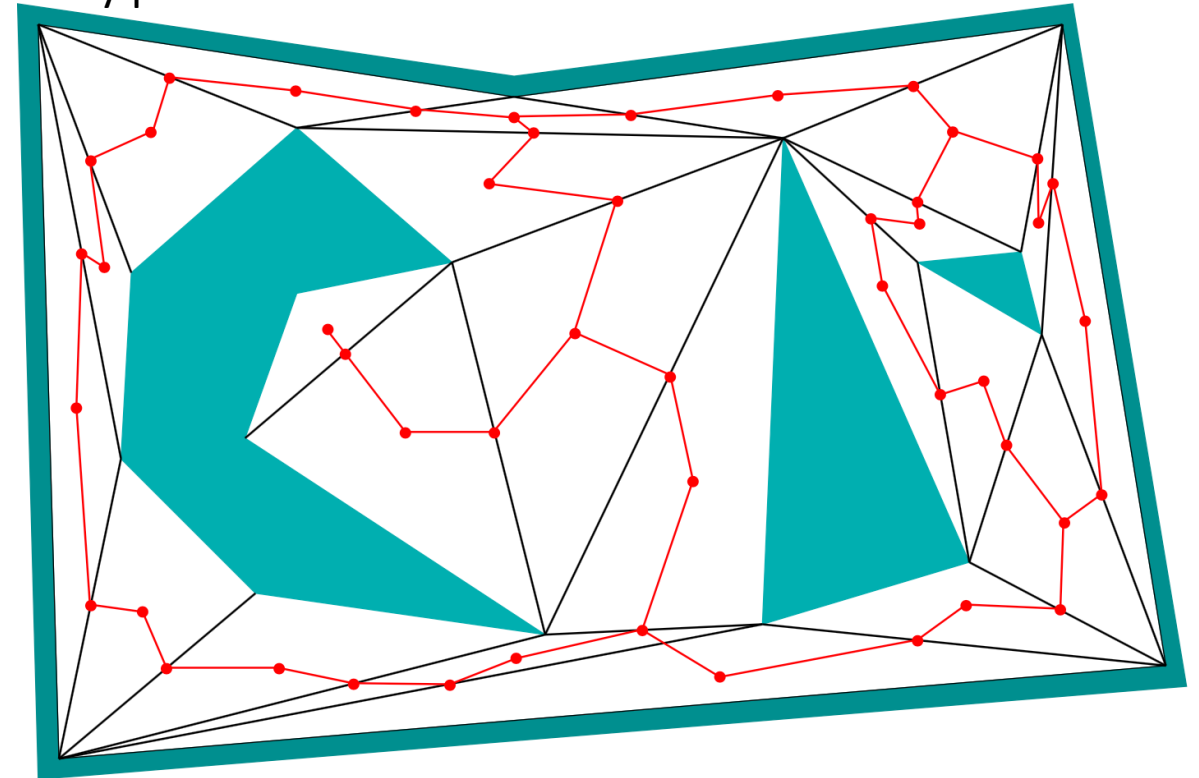
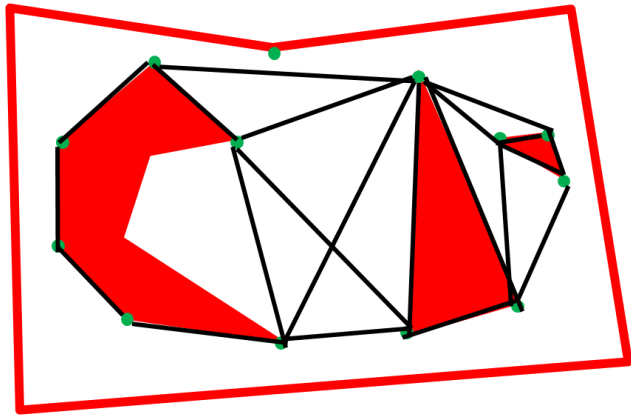
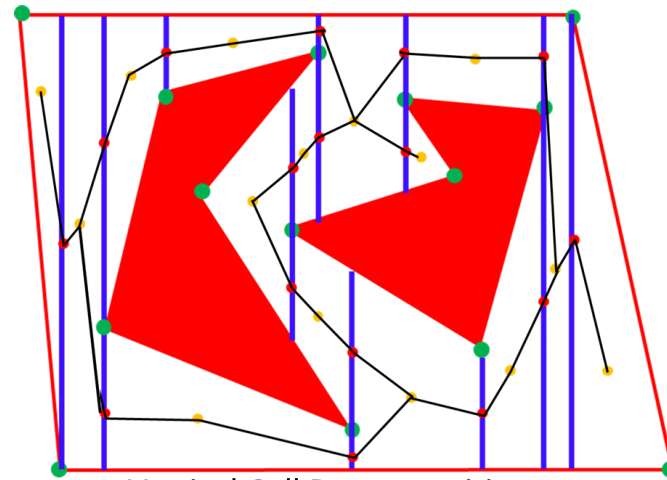


Figure 6.17: A roadmap obtained from the triangulation.

# Summery: visibility roadmaps



Reduced visibility map



Vertical Cell Decomposition

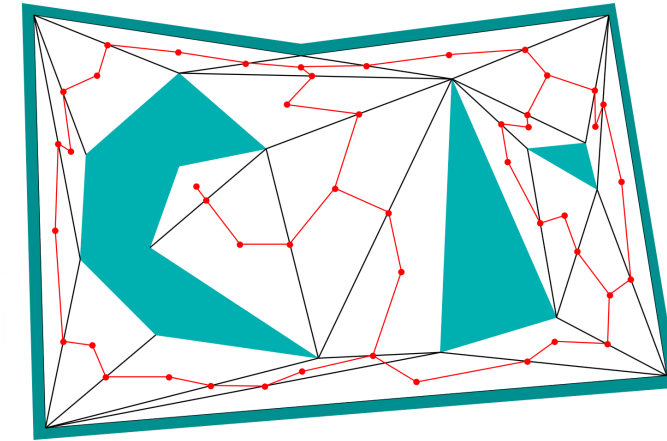
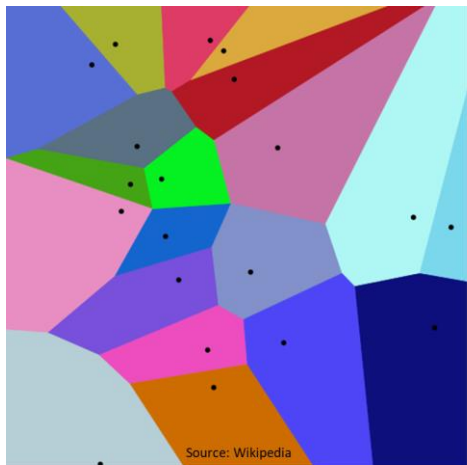
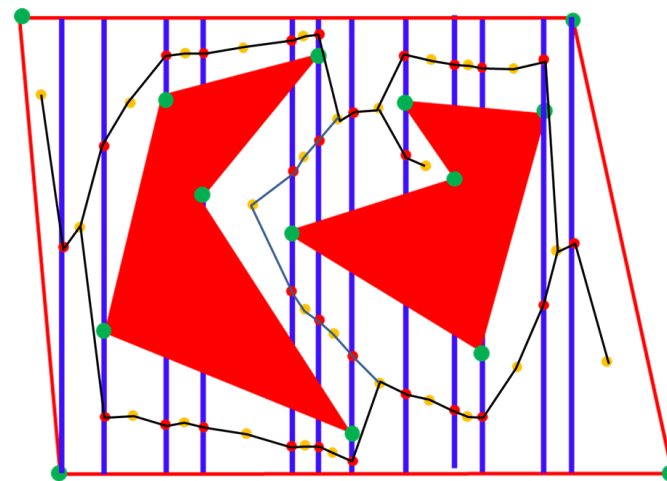


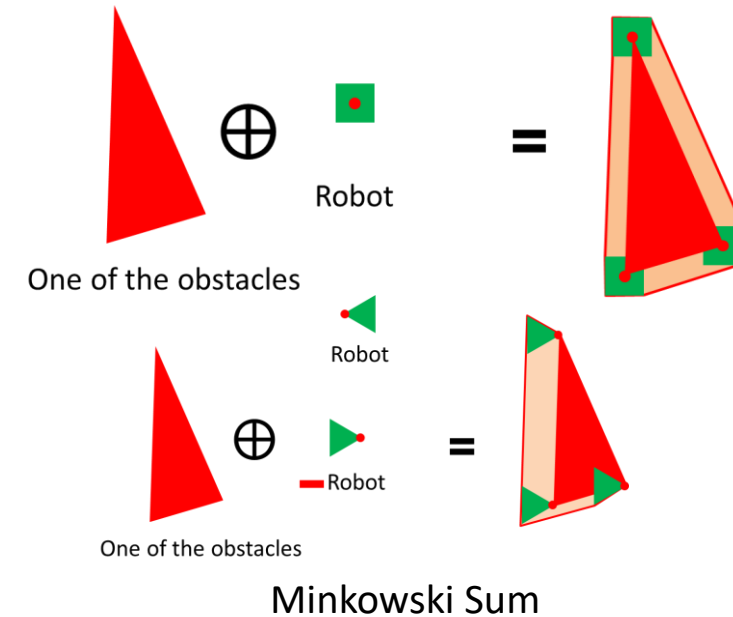
Figure 6.17: A roadmap obtained from the triangulation.



Source: Wikipedia  
maximum clearance roadmap



Cylindrical Decomposition



Minkowski Sum



# World isn't that simple/nice !

- Relax most assumptions
  - Complex robot model and environments
  - Robot may not be polygonal
  - C-space obstacles may not be polygonal
  - Robot can rotate and translate
  - Robot with chain of rigid bodies
- Grid-based and visibility graph based methods don't generalize
- Finding a feasible path might become challenging
- Solution
  - Sampling based algorithms to deal with complex C-spaces

# How do we implement?

- We need **three subroutines** to check
  - if a vertex is reflex
  - If two vertices are mutually visible
  - If there exists a bitangent
- A graph search algorithm
  - Dijkstra's shortest path

# Credits

- Many of the figures are adapted from the textbook: Planning Algorithms by Steven M. LaValle
- Some of the slides are adapted from lecture notes by Pratap Tokekar, ECE 4984/5984: (Advanced) Robot Motion Planning, Virginia tech