

# **CMSC828T**

# **Vision, Planning And Control In**

# **Aerial Robotics**

MOTION PLANNING



# Topics Covered

- Topic Introductions
  - Necessity of planning
  - Challenges in planning
- Motion Planning Concepts
  - Geometric Modelling
  - Half space representations
  - Configuration Spaces
  - C-obstacle, C-free
- Planning in Discrete Spaces
  - Graph Search
  - DFS, BFS
  - Dijkstra's Algorithm
  - A\* Algorithm
- Planning in Continuous Spaces
  - PRM
  - RRT



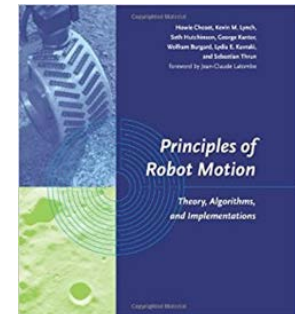
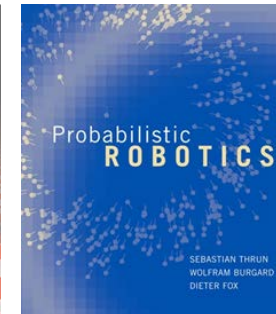
# Course Bibliography

- Main Text

- **LaValle, Steven M.** *Planning Algorithms*. Cambridge University Press, 2006.  
<http://planning.cs.uiuc.edu/>

- Reference Texts

- **Thrun, Sebastian, et al.** *Probabilistic Robotics*. Vol. 1. Cambridge, MIT press, 2005.
- **Choset, Howie, et al.** *Principles of Robot Motion: Theory, Algorithms, and Implementations*, MIT press, 2005.



# Planning for Robotics

- How did we get here?
  - Was in **Location A** a while ago.
  - Decided to go to class (good job!)
  - Found out the classroom, a.k.a. **Location B**
  - ***Planned*** the trip from **A** to **B**
  - There were **obstacles** along the way, avoided them (successfully, I hope)
  - Probably used a **map** (new students, welcome)



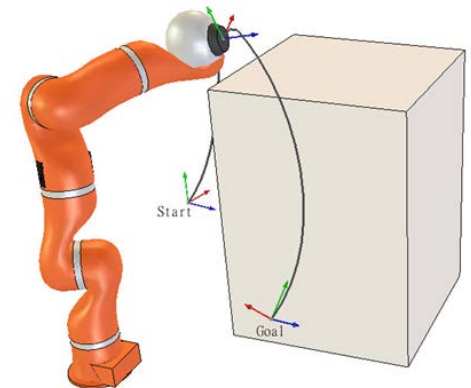
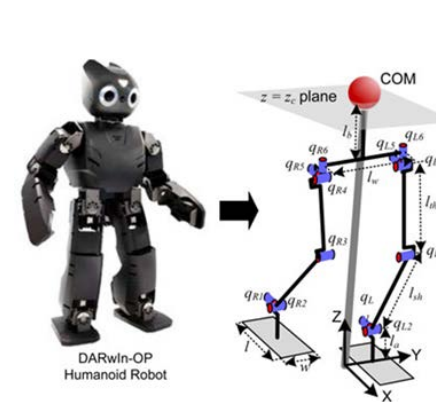
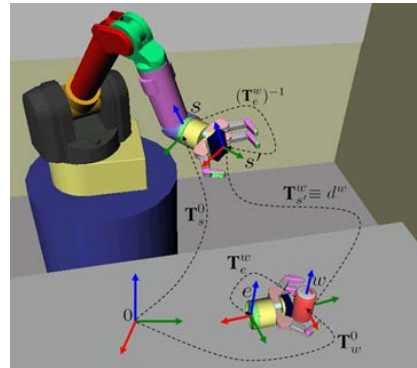
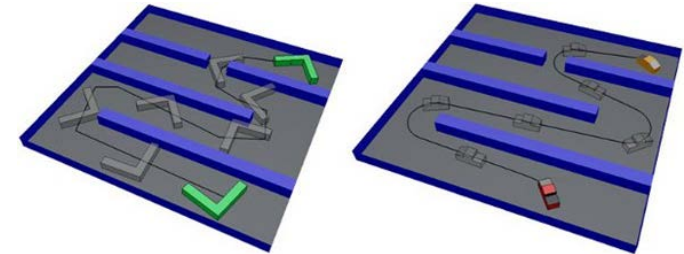
# Planning for Robotics

- Planning, then, is selecting a certain sequence of actions to meet a certain goal. The previous example talks about *Path Planning* but planning is obviously not limited only to that.
- The sequence of actions must:
  - Be hierarchical
  - Take contingency into account
  - Ensure cost-reward tradeoff is done optimally



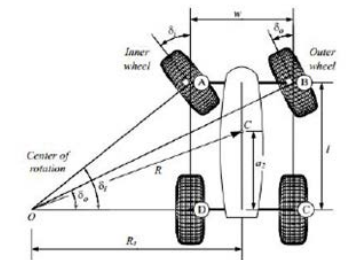
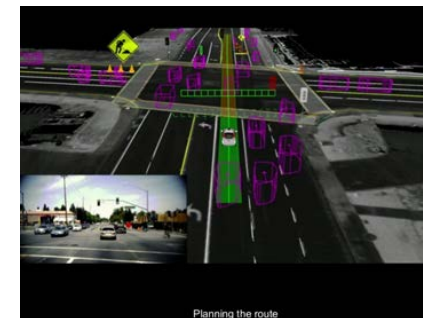
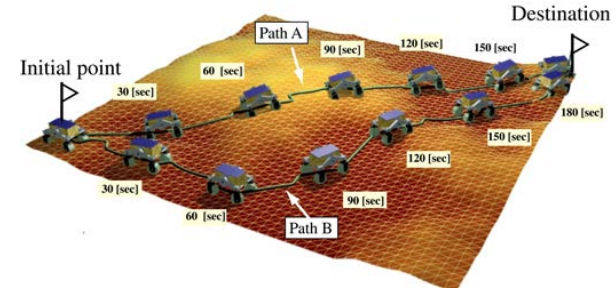
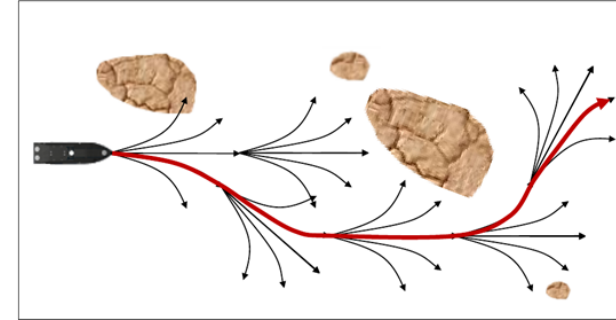
# Planning for Robotics

- As mentioned previously, planning can (and must) be done for several applications, including but not limited to:
  - Task planning
  - Path planning
  - Trajectory planning
  - Foot placement planning
  - Grasp planning
  - and many, many more...



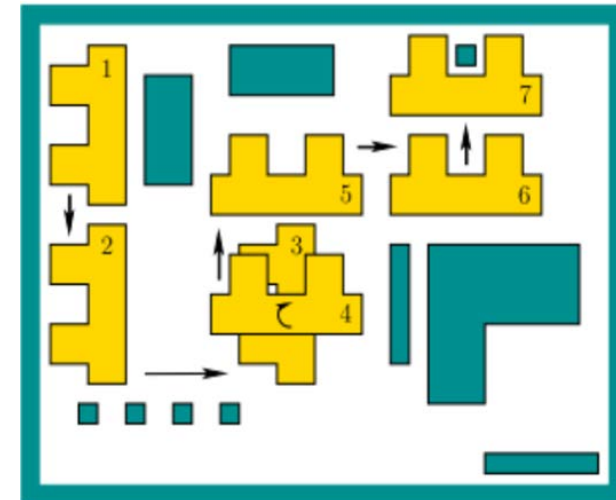
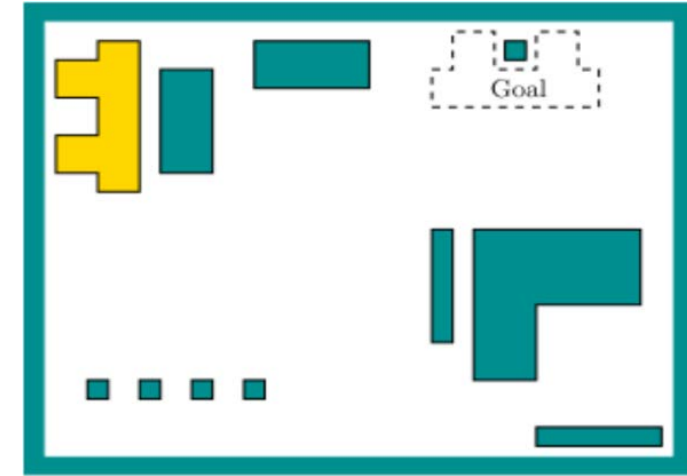
# Challenges in Planning for Robotics

- Not an easy task, to create and execute a robot plan.
- Execution time + length optimization of collision-free path or trajectory
- Search space complexity
- Terrain interaction complexity
- Dynamic obstacles, unpredictable environment
- Robot dynamics, high-speed robots



# Geometric Modelling


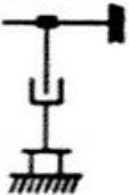
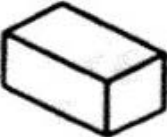
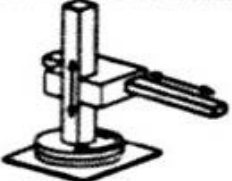
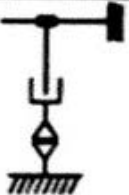





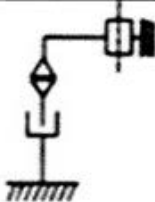




- Why geometric modelling?
  - Need to produce motion plan of robot's collision-free motions to the goal
  - Identify locations/points where robot can go without collision, capture motion of robot within environment
- Accurate model of robot and obstacles required to create plan





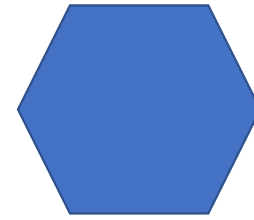
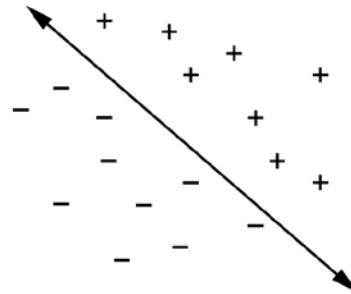
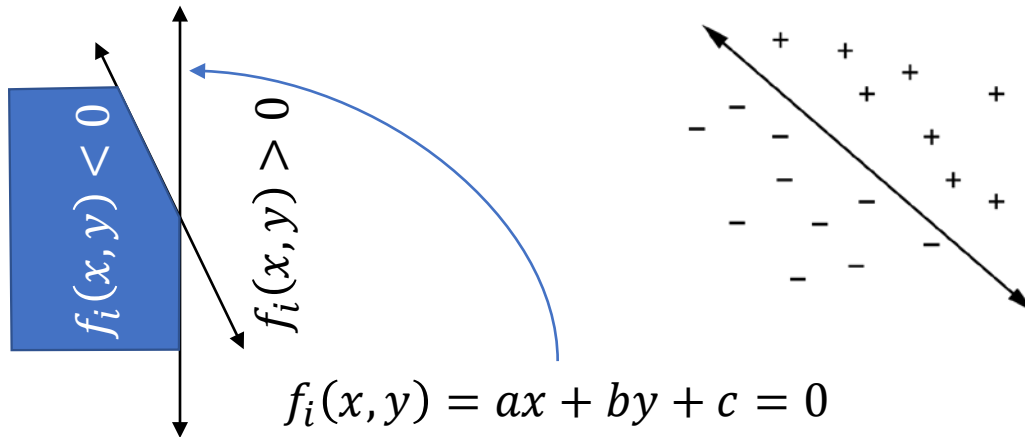
# Geometric Modelling

- Robot  $A(q) \subseteq W$  and obstacles  $O \subset W$  usually positioned in a workspace  $W = \mathbb{R}^2$  or  $W = \mathbb{R}^3$
- Here,  $q$  is the configuration of the robot and, along with obstacles, are closed subsets of  $W$
- These geometric representations must be computationally efficient without loss in detail.

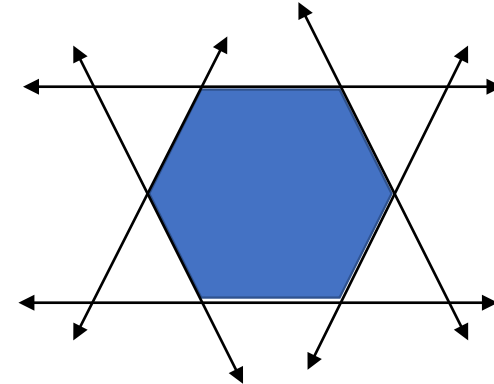
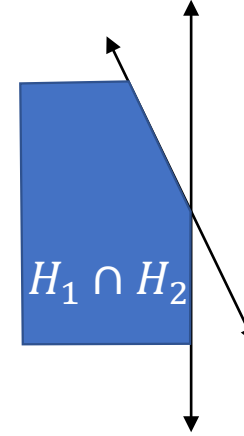
Principle	Kinematic Structure	Workspace
 Cartesian Robot		
 Cylindrical Robot		
 Spherical Robot		
 SCARA Robot		
 Articulated Robot		

# Polygonal Models: Half-space Representation

- Solid representation of convex polygon  $O$  as Boolean combination of half-plane primitives
- $H_i = \{(x, y) \in W \mid f_i(x, y) \leq 0\}$



$$O = H_1 \cap H_2 \cap \cdots \cap H_n$$

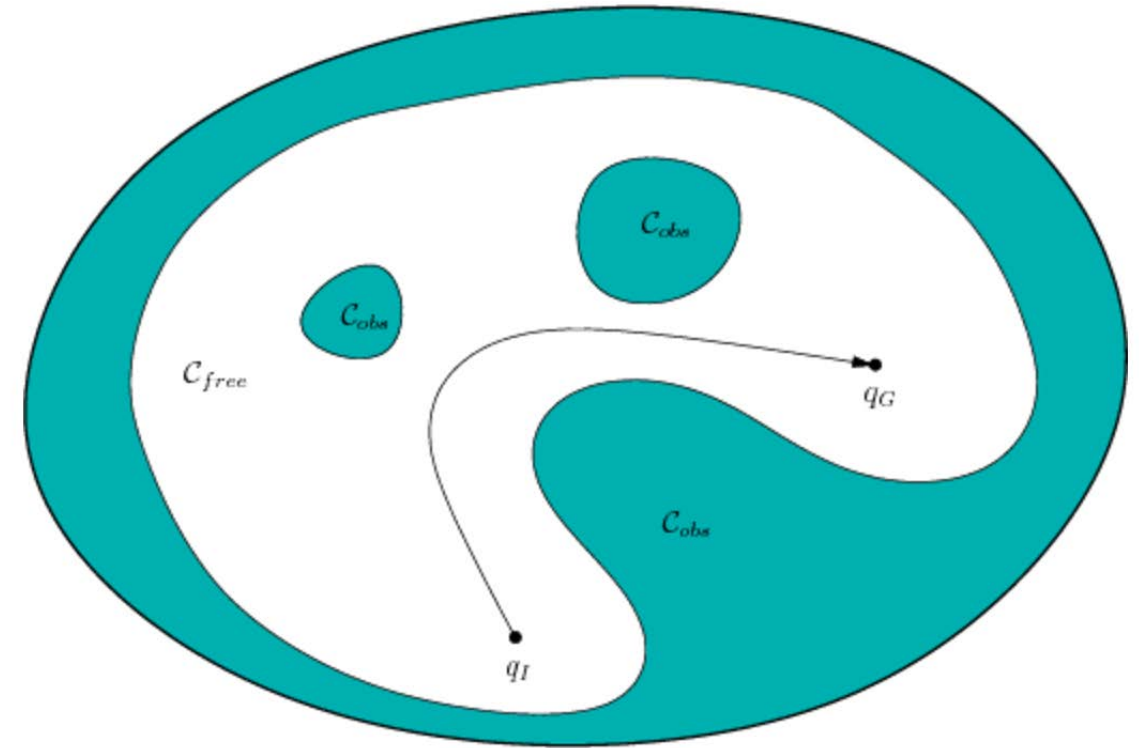


$$H_1 \cap H_2 \cap \cdots \cap H_n$$

# Configuration Space

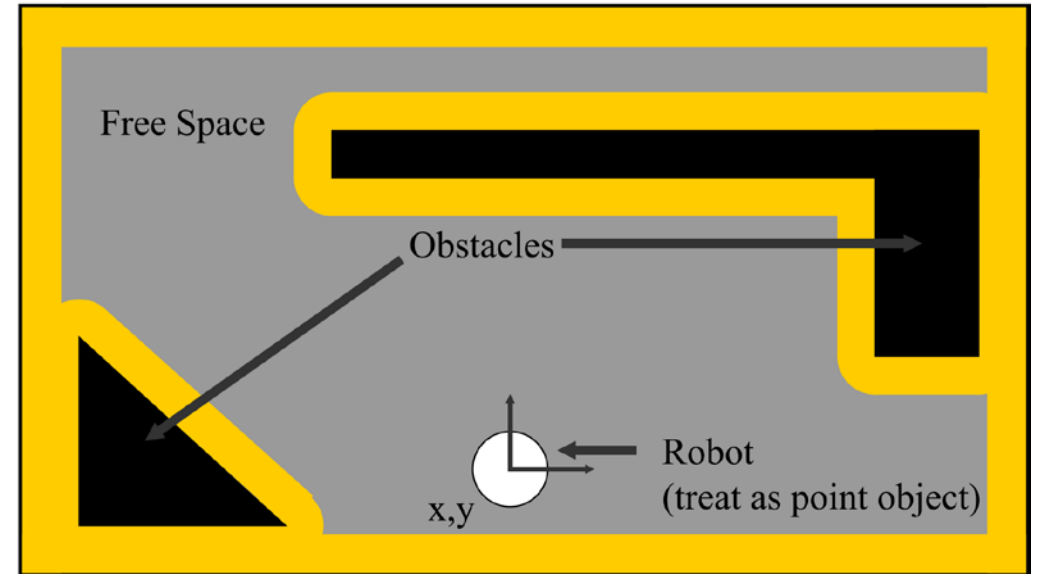
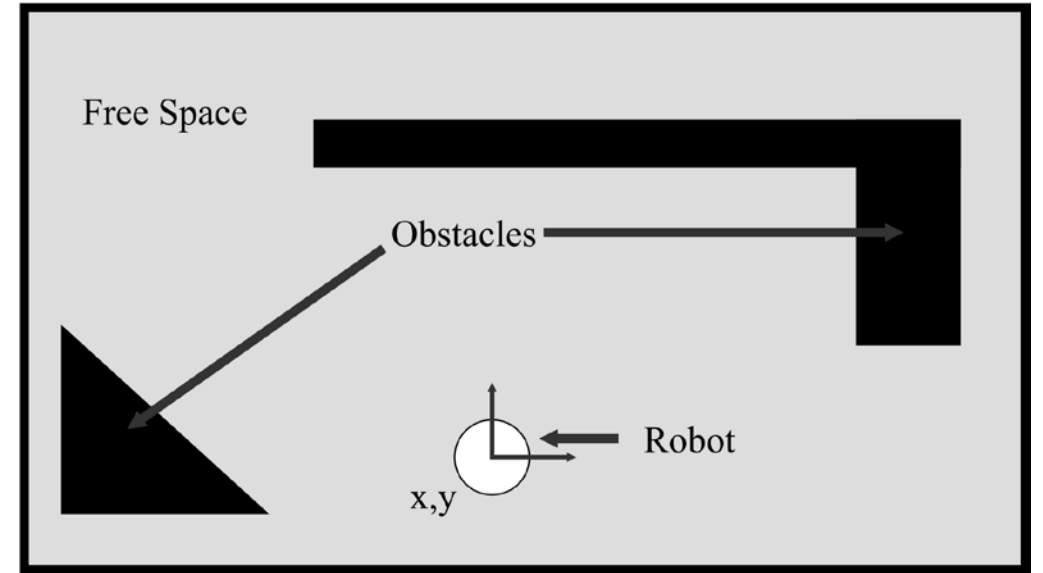
- A complete specification of the position of every point in the system - *configuration*
- The space of all such configurations is the **C-Space** or **Configuration Space**
- The basic task of motion planning is to find a path from  $q_I$  to  $q_G$  in  $C_{free}$ . The entire blob is

$$C = C_{free} \cup C_{obs}$$

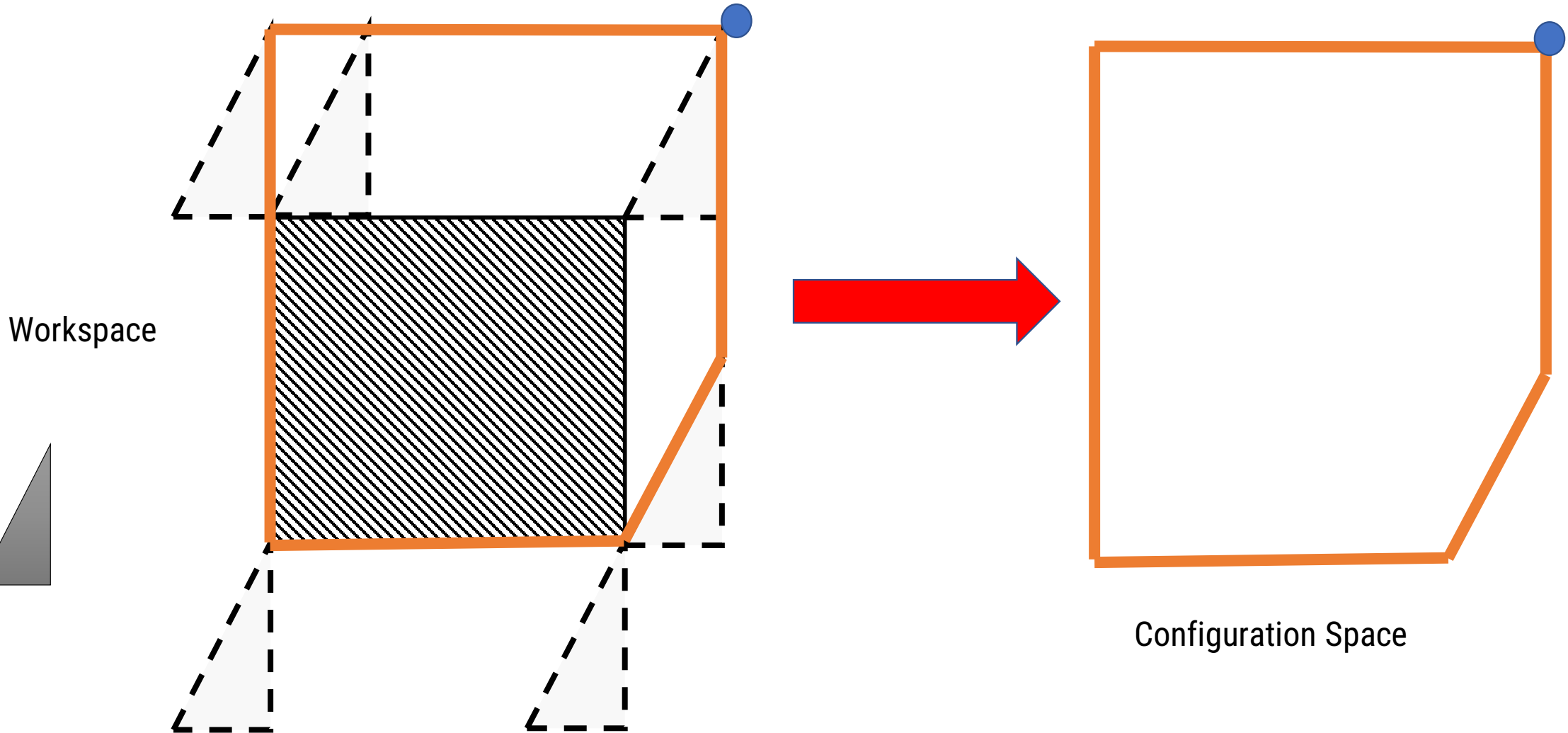


# Configuration Space

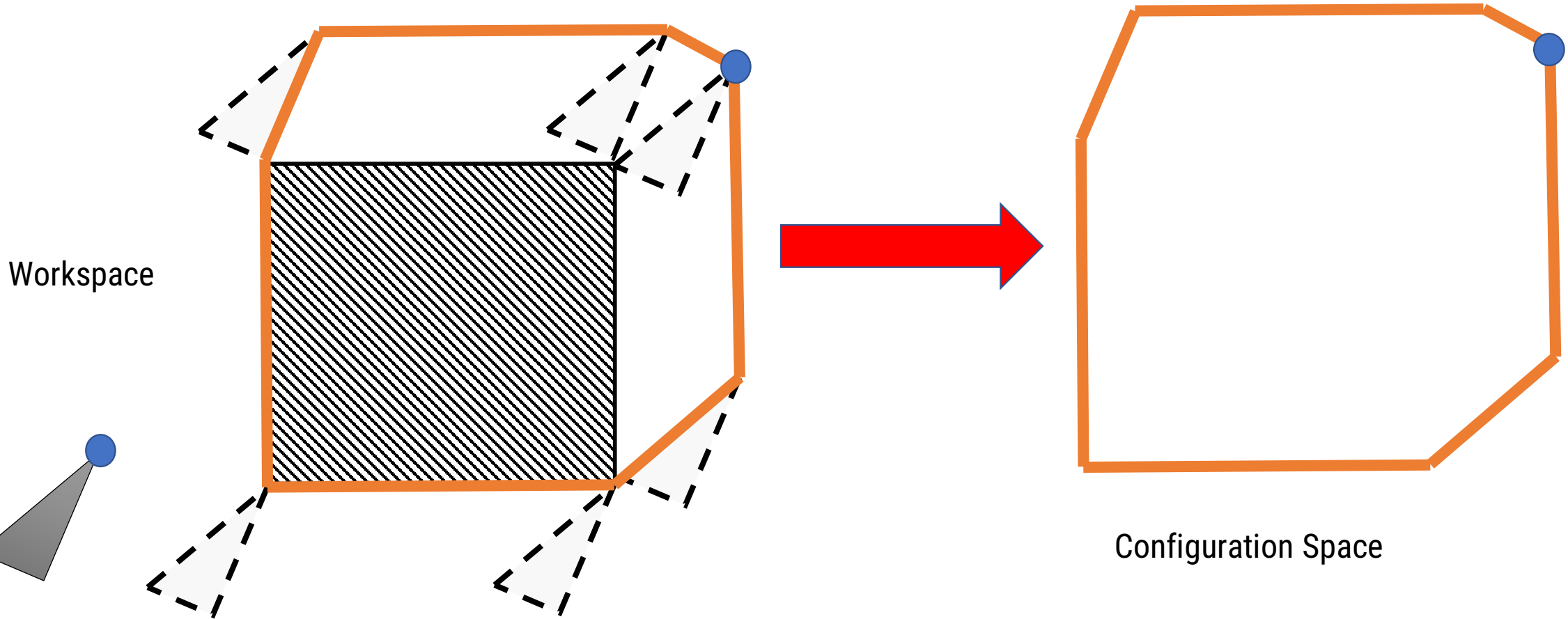
- For a robot with  $k$  degrees of freedom, the **C-space** is a coordinate system with *one dimension per degree of freedom*.
- In **C-space**, a robot pose is simplified into a **POINT** and an obstacle is a **COMPLEX SHAPE**
- Thus, we transform the problem from Cartesian to Configuration space, solve it and bring it back.



# Rigid robot translating in 2-D Workspace



# Robot translating + rotating in 2-D workspace



# Minkowski Sum and Difference

- The **Minkowski Sum** of two sets  $A$  and  $B$  is denoted by

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

- The **Minkowski Difference** of two sets  $A$  and  $B$  is denoted by

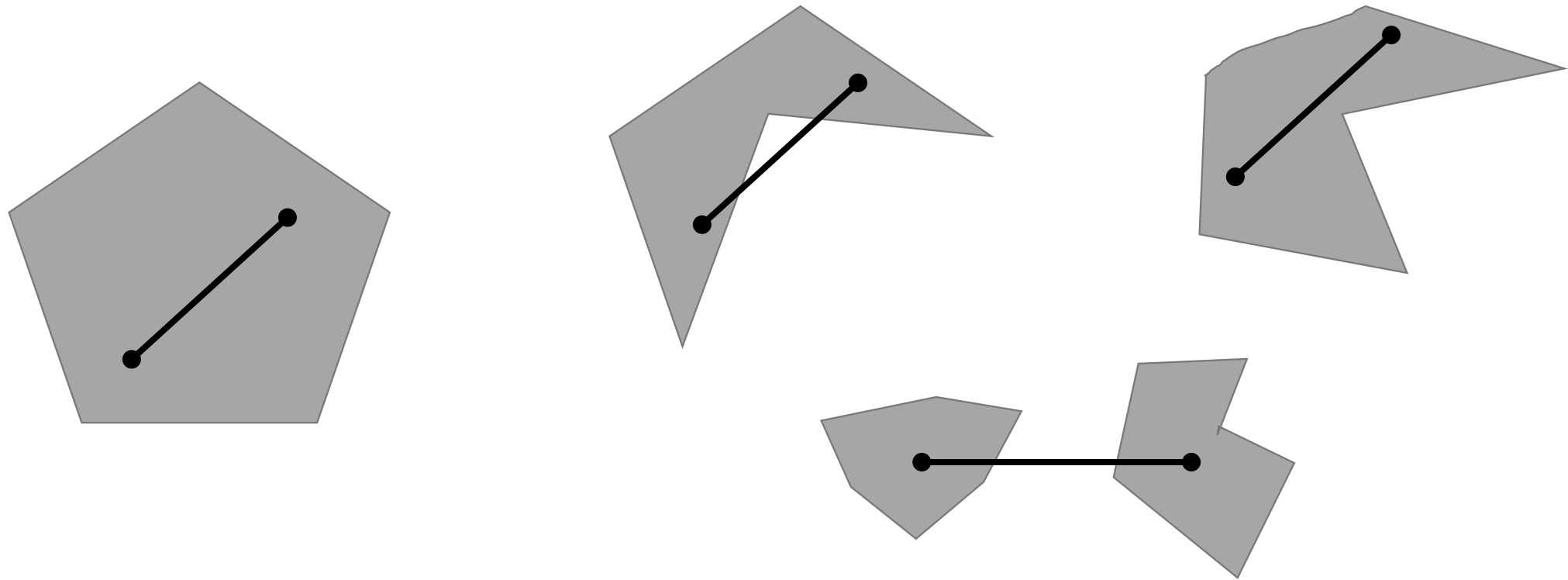
$$A \ominus B = \{a - b \mid a \in A, b \in B\}$$

- The **Minkowski Sum of Convex Polygons** of two convex polygons,  $P$  and  $Q$  having  $m$  and  $n$  vertices, respectively, is a convex polygon  $P \oplus Q$  having  $m + n$  vertices.



# Convexity of Sets

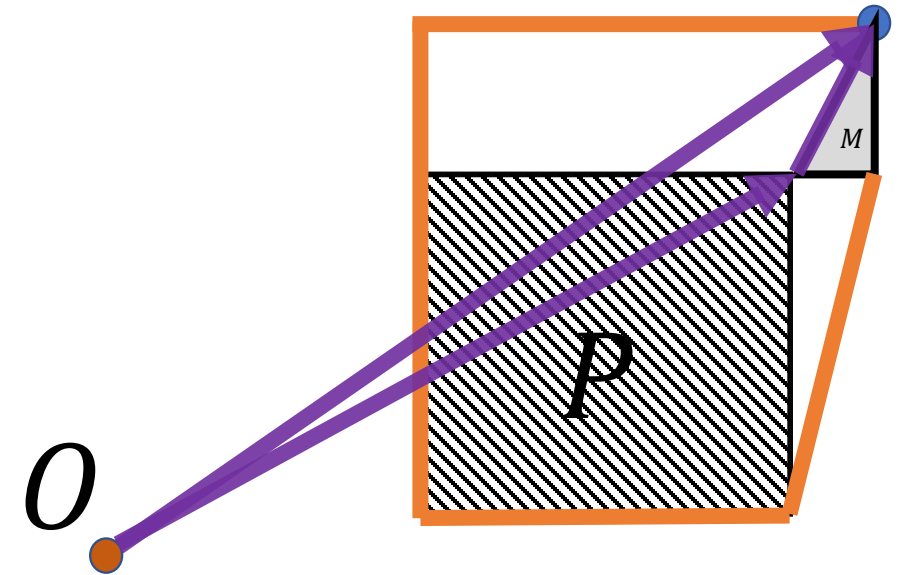
A set  $S$  is convex *if and only if* every line segment connecting two points in  $S$  is contained within  $S$





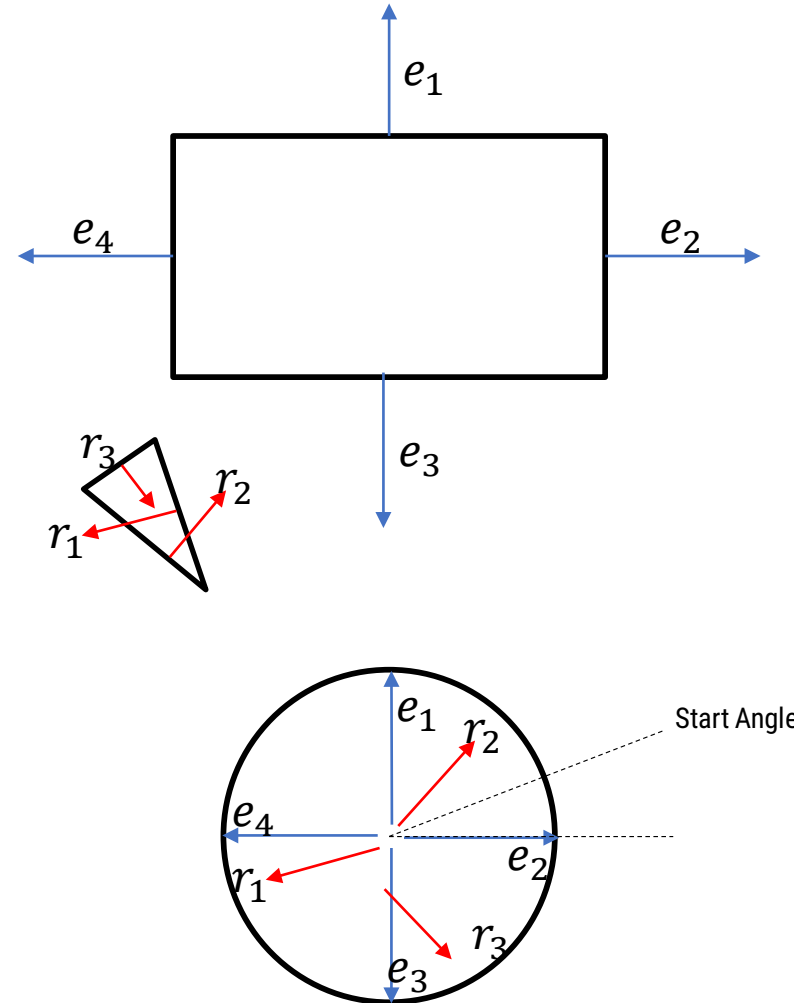
# Obstacle in Workspace to C-Space

- If  $P$  is an obstacle in the workspace, and  $M$  is a moving object (the robot, say) then the C-Space obstacle corresponding to  $P$  is given by  $P \ominus M$
- $QO_i = \{q \in Q | R(q) \cap WO_i \neq \emptyset\}$ 
  - $Q$  is 2D configuration space
  - $W$  is Workspace
  - $R$  is robot



# Star Algorithm

- Determines sliding contact of robot around obstacle, and order of sliding operations.
- Choose one direction, CW or CCW, and remain consistent.
- Fix robot normals to point inwards, obstacle normals pointing outwards.
- Pick start angle and proceed according to direction.



# C-Free

- Successfully constructed obstacle representation in C-space, but none for free space.
- Remember, C-space dimensions increases very fast; 3-space corresponds to 6D for rigid body, further articulation adds even more dimensions.
- Obviously, cannot have explicit representation of free space for high degree of freedom robots (manipulators, for example)
- What is the solution?
- APPROXIMATE or RANDOMIZE

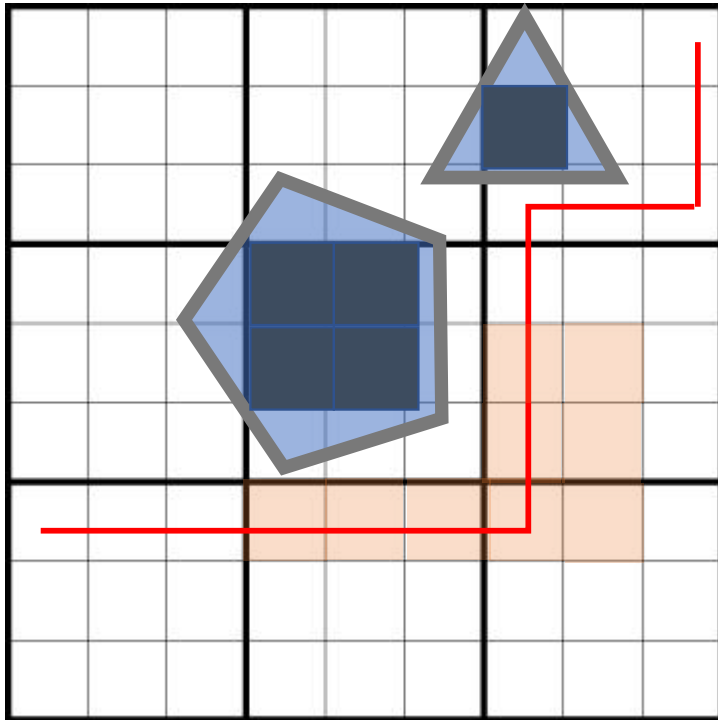


# C-Free: APPROXIMATE or RANDOMIZE

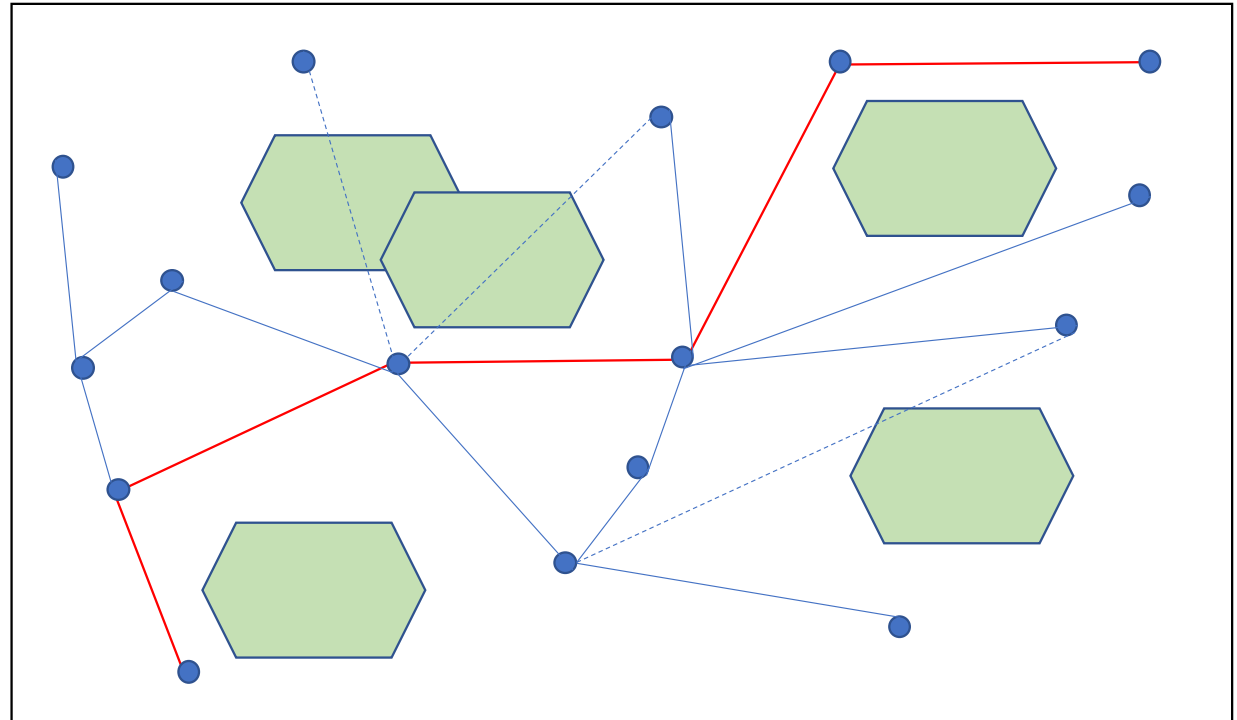
- **Approximate** the free space using regular subdivision.
  - Convert to grid, maybe.
  - Pick only “complete” cells in grid.
- **Randomize** the robot in free space by sampling and checking pose in C-space
- **Tradeoff** between **performance** and **completeness**



# C-Free: APPROXIMATE or RANDOMIZE



Cell Decomposition



Probabilistic Roadmaps

# Completeness of Planning Algorithms

- **Complete**
  - If solution exists, finds it; else reports failure.
  - Geometry based planners
- **Semi-complete**
  - If solution exists, finds it; else may run forever.
- **Resolution Complete**
  - If solution exists, finds it; else reports solution not found for specified resolution
  - Grid- or Interval- based planners
- **Probabilistic Complete**
  - If solutions exists, probability that it will be found tends to 1, as the number of search iteration tends to infinity.
  - Sampling-based planners



# References

- Steven M. Lavalle
  - <http://planning.cs.uiuc.edu>
  - <http://msl.cs.uiuc.edu/~lavalle/icra12/>
- Howie Choset with slides from G.D. Hager, Z. Dodds, and Dinesh Mocha
  - <http://www.cs.cmu.edu/~motionplanning/lecture/lecture.html>
- <http://courses.csail.mit.edu/6.141/spring2010/pub/lectures/>
- <http://www.eng.utah.edu/~cs6370/Lectures/>
- <http://robotics.caltech.edu/~jwb/courses/ME132/handouts/>
- Prof. Krishnanand Kaipa's lecture notes
  - ENPM808C – Planning for Autonomous Robots



# References

- <https://www2.cs.arizona.edu/classes/cs437/fall11/>
- <http://www.cs.wustl.edu/~pless/546/lectures/lecMinkSum.html>

