

# COMP 790-058:

Fall 2007

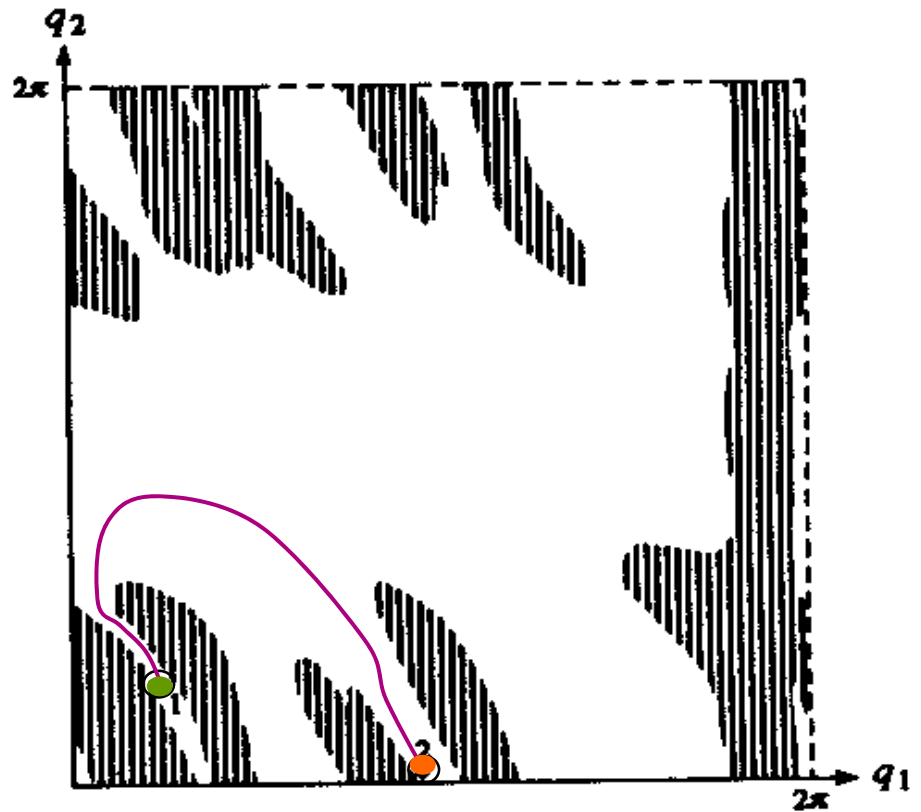
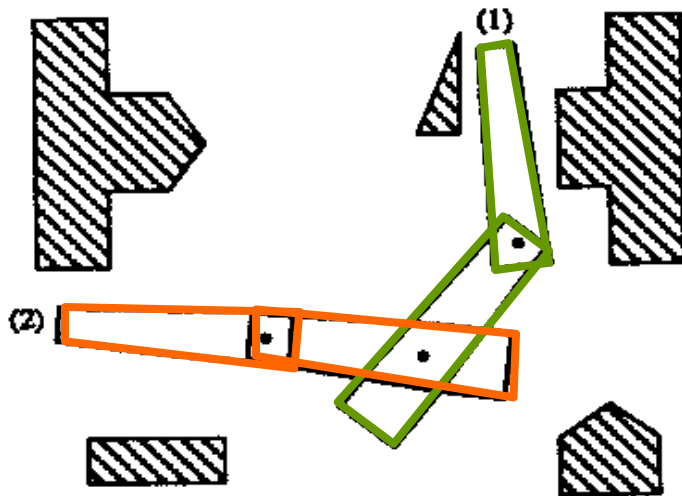
(Based on slides from J. Latombe @ Stanford & David Hsu  
@ Singapore)

## Path Planning for a Point Robot

# Main Concepts

- Reduction to point robot
- Search problem
- Graph search
- Configuration spaces

# Configuration Space: Tool to Map a Robot to a Point



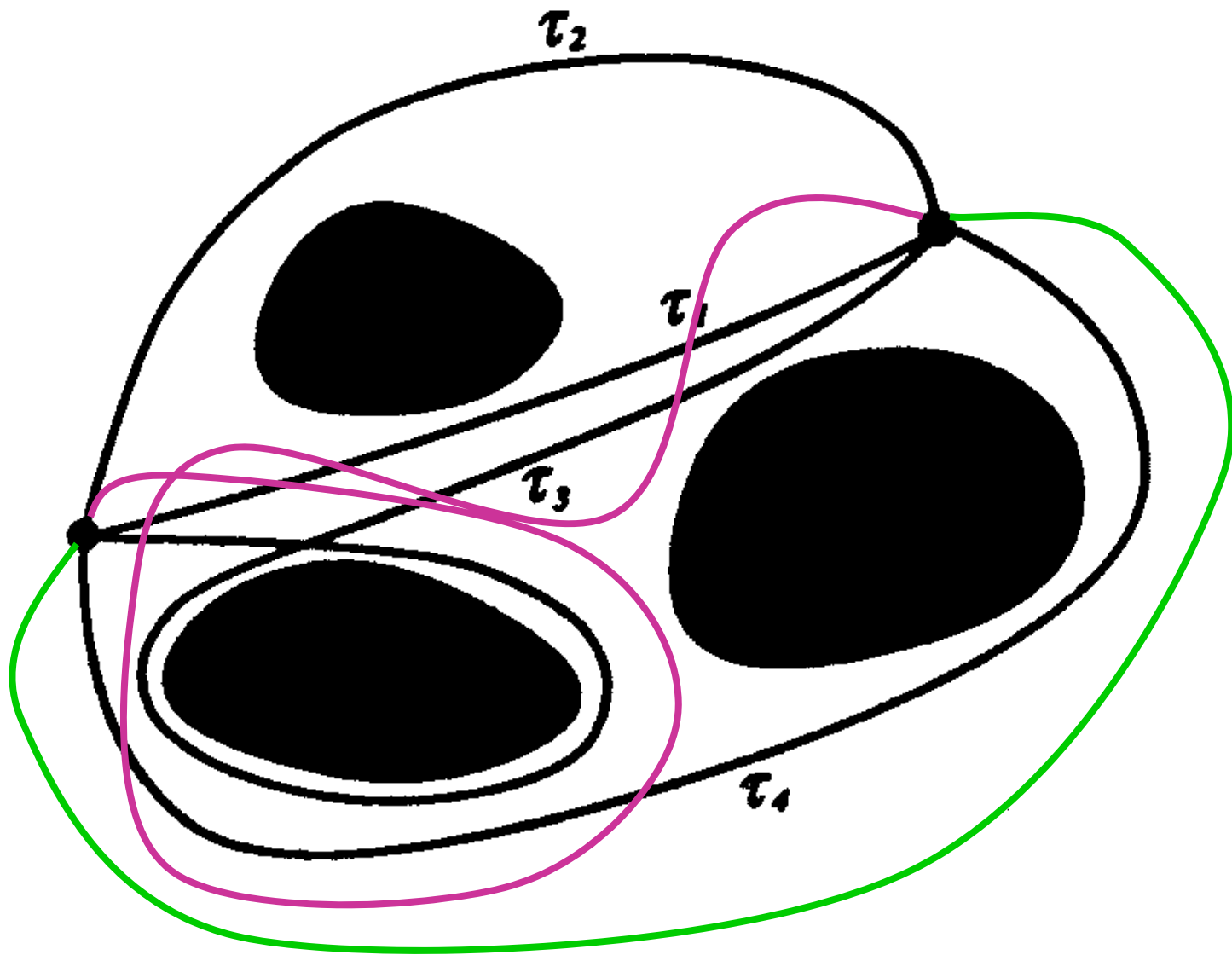




# Types of Path Constraints

- ■ **Local** constraints:  
lie in free space
- **Differential** constraints:  
have bounded curvature
- **Global** constraints:  
have minimal length

# Homotopy of Free Paths



# Motion-Planning Framework

Continuous representation



Graph searching  
(blind, best-first,  $A^*$ )



# Path-Planning Approaches

## 1. Roadmap

Represent the connectivity of the free space by a network of 1-D curves

## 2. Cell decomposition

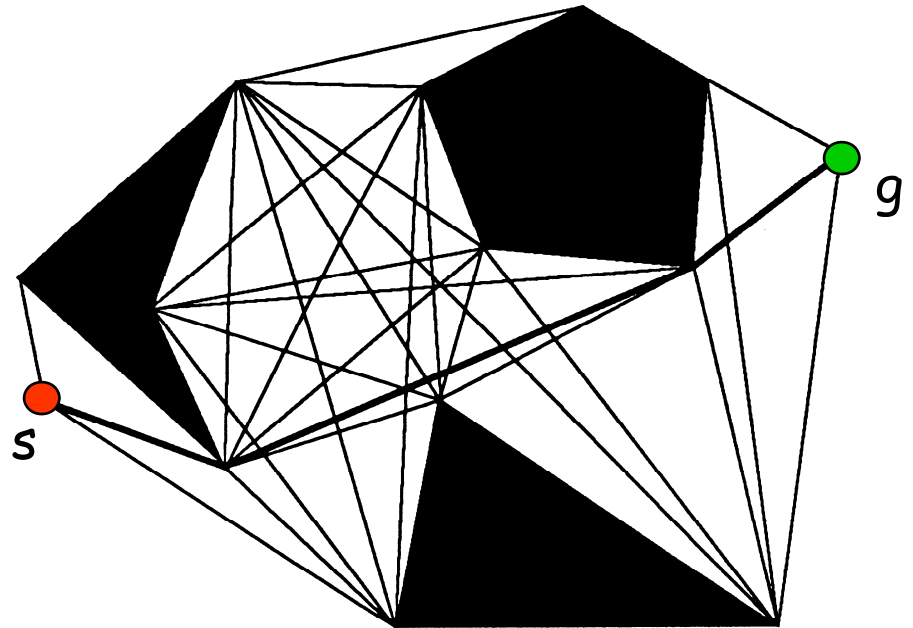
Decompose the free space into simple cells and represent the connectivity of the free space by the adjacency graph of these cells

## 3. Potential field

Define a function over the free space that has a global minimum at the goal configuration and follow its steepest descent

# Roadmap Methods

- **Visibility graph**  
Introduced in the Shakey project at SRI in the late 60s.  
Can produce shortest paths in 2-D configuration spaces



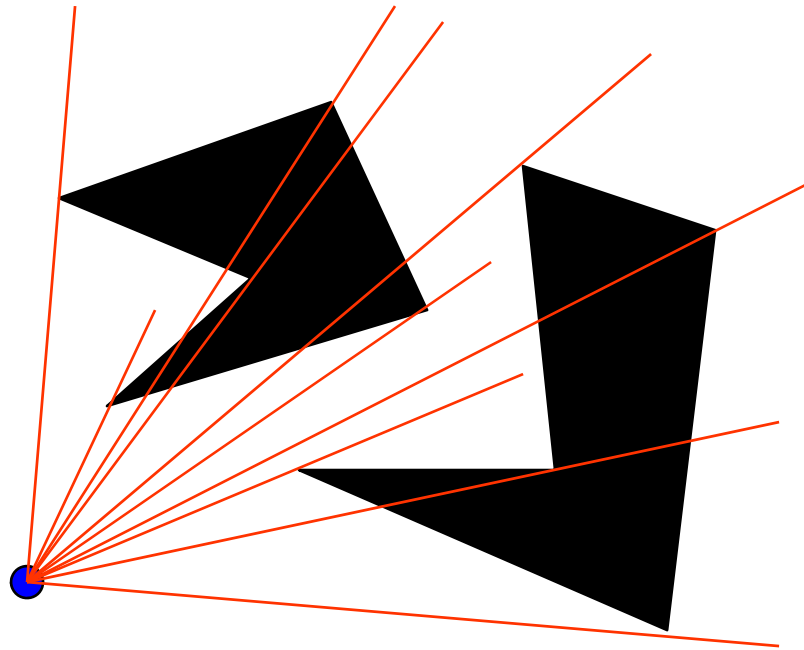
# Simple Algorithm

1. Install all obstacles vertices in  $VG$ , plus the start and goal positions
2. For every pair of nodes  $u, v$  in  $VG$
3.     If  $\text{segment}(u,v)$  is an obstacle edge then
4.         insert  $(u,v)$  into  $VG$
5.     else
6.         for every obstacle edge  $e$
7.             if  $\text{segment}(u,v)$  intersects  $e$
8.                 then goto 2
9.             insert  $(u,v)$  into  $VG$
10. Search  $VG$  using  $A^*$

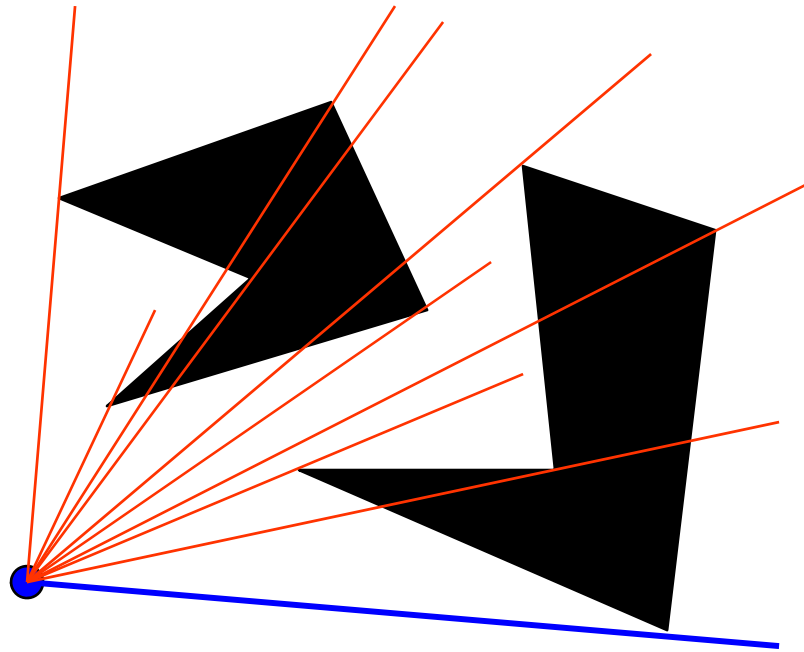
# Complexity

- Simple algorithm:  $O(n^3)$  time
- Rotational sweep:  $O(n^2 \log n)$
- Optimal algorithm:  $O(n^2)$
- Space:  $O(n^2)$

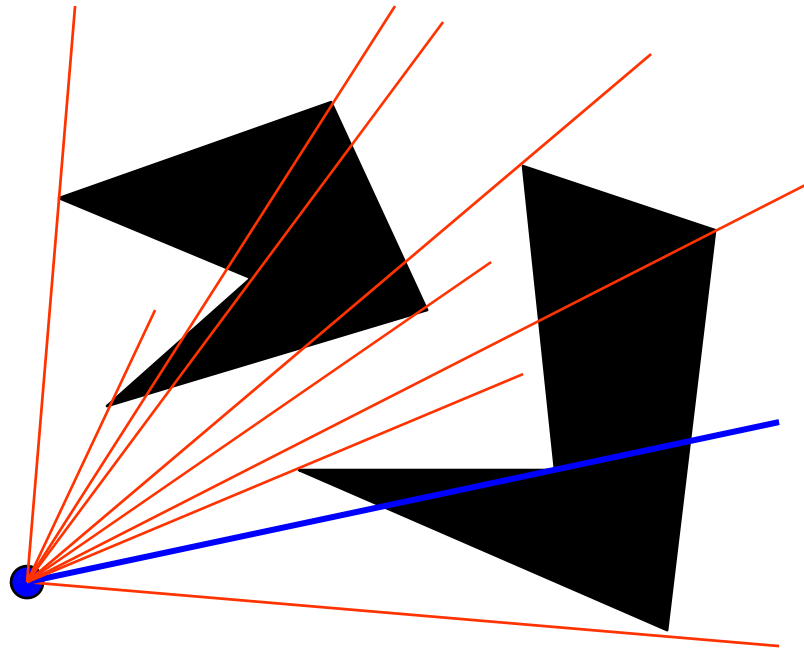
# Rotational Sweep



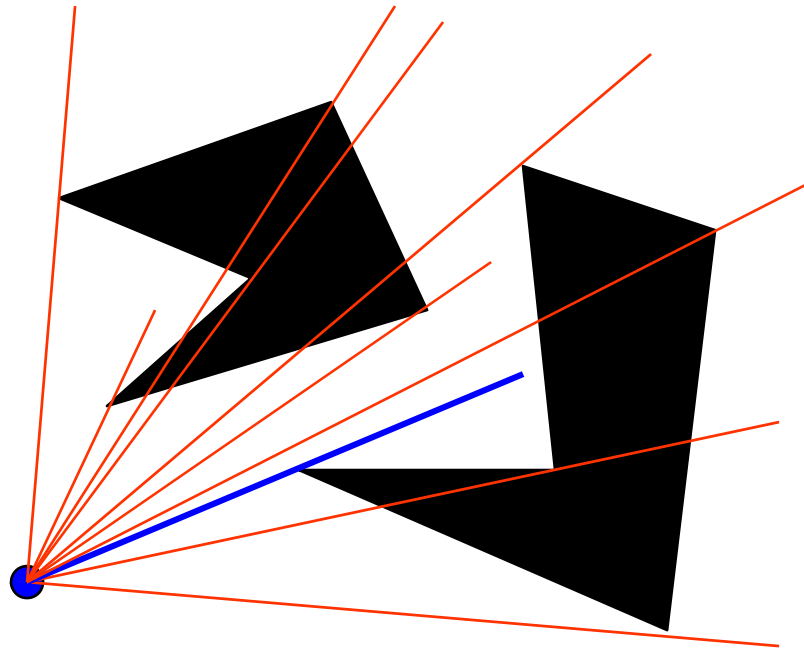
# Rotational Sweep



# Rotational Sweep

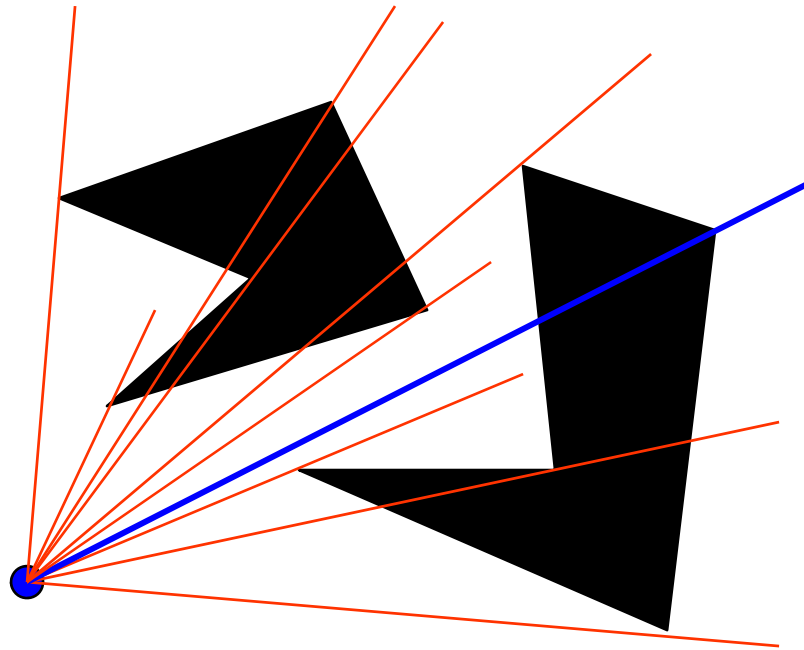


# Rotational Sweep

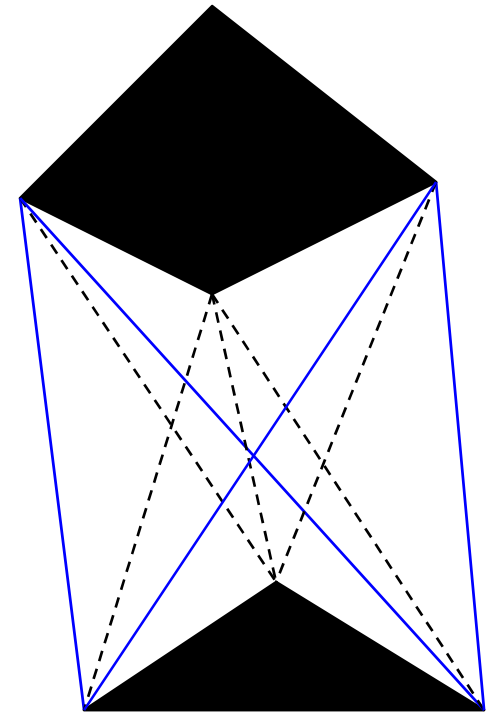
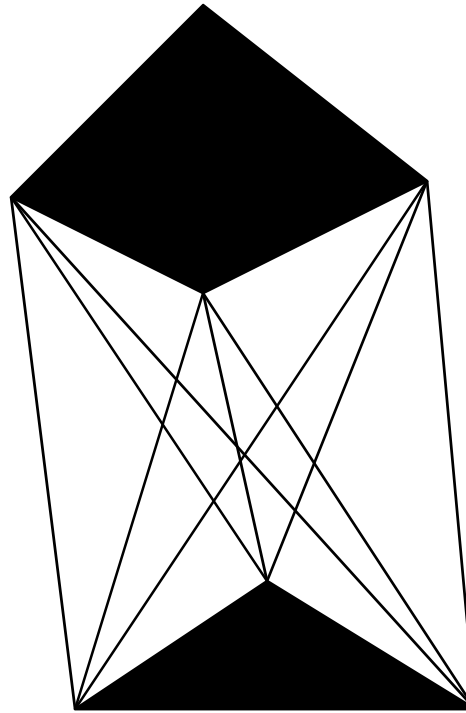
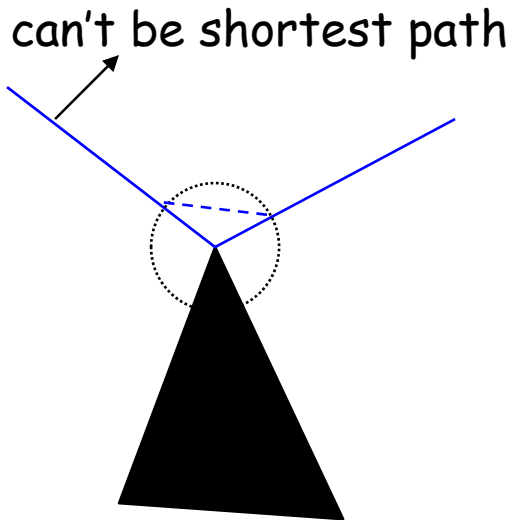




# Rotational Sweep



# Reduced Visibility Graph

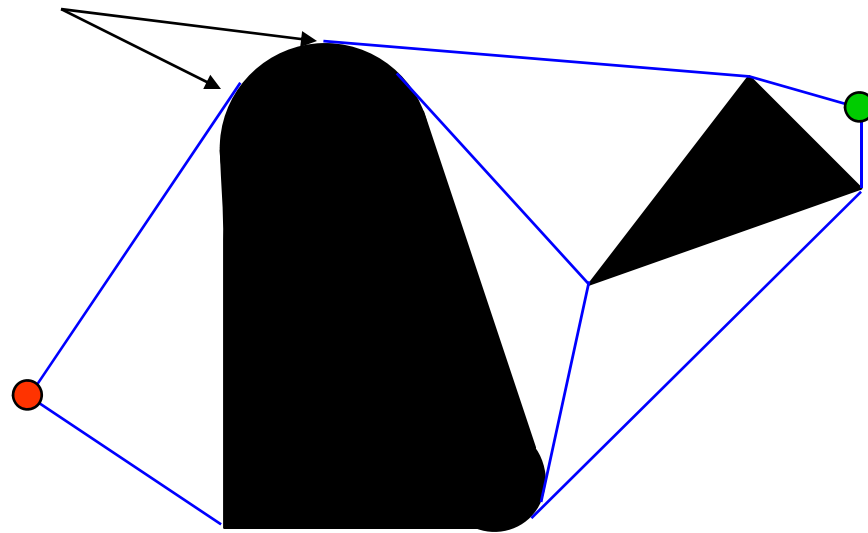


tangent segments

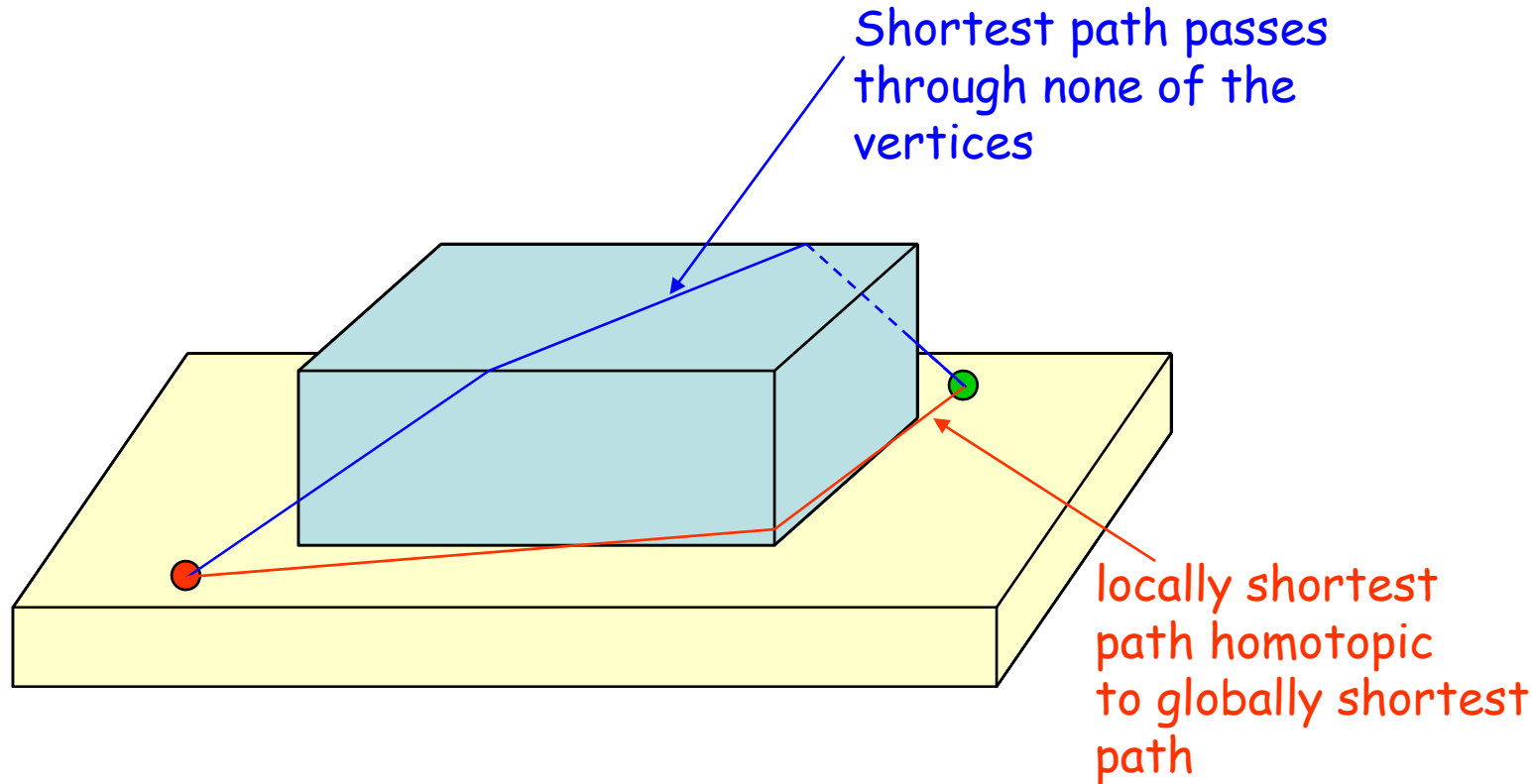
→ Eliminate concave obstacle vertices

# Generalized (Reduced) Visibility Graph

tangency point



# Three-Dimensional Space



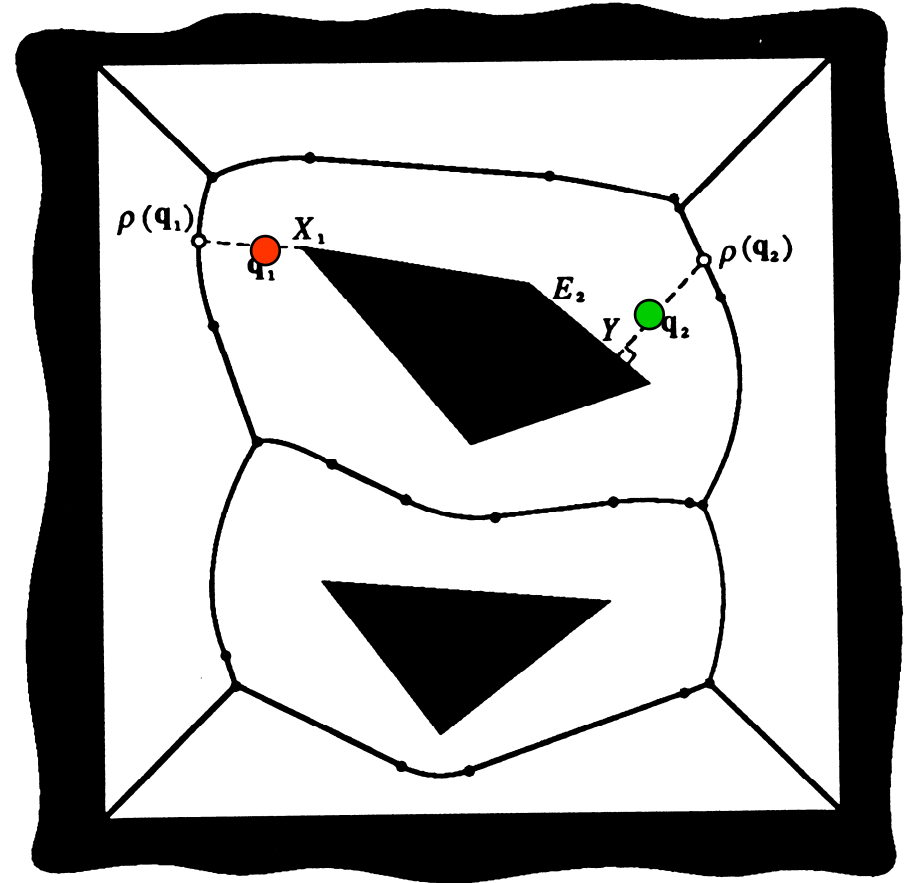
Computing the shortest collision-free path in a polyhedral space is NP-hard

# Roadmap Methods

## ■ Voronoi diagram

Introduced by Computational Geometry researchers. Generate paths that maximizes clearance.

$O(n \log n)$  time  
 $O(n)$  space



# Roadmap Methods

- **Visibility graph**
- **Voronoi diagram**
- **Silhouette**

First complete general method that applies to spaces of any dimension and is singly exponential in # of dimensions [Canny, 87]

- **Probabilistic roadmaps**

# Path-Planning Approaches

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## 2. Cell decomposition

Decompose the free space into simple cells and represent the connectivity of the free space by the adjacency graph of these cells

## 3. Potential field

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# Cell-Decomposition Methods

Two classes of methods:

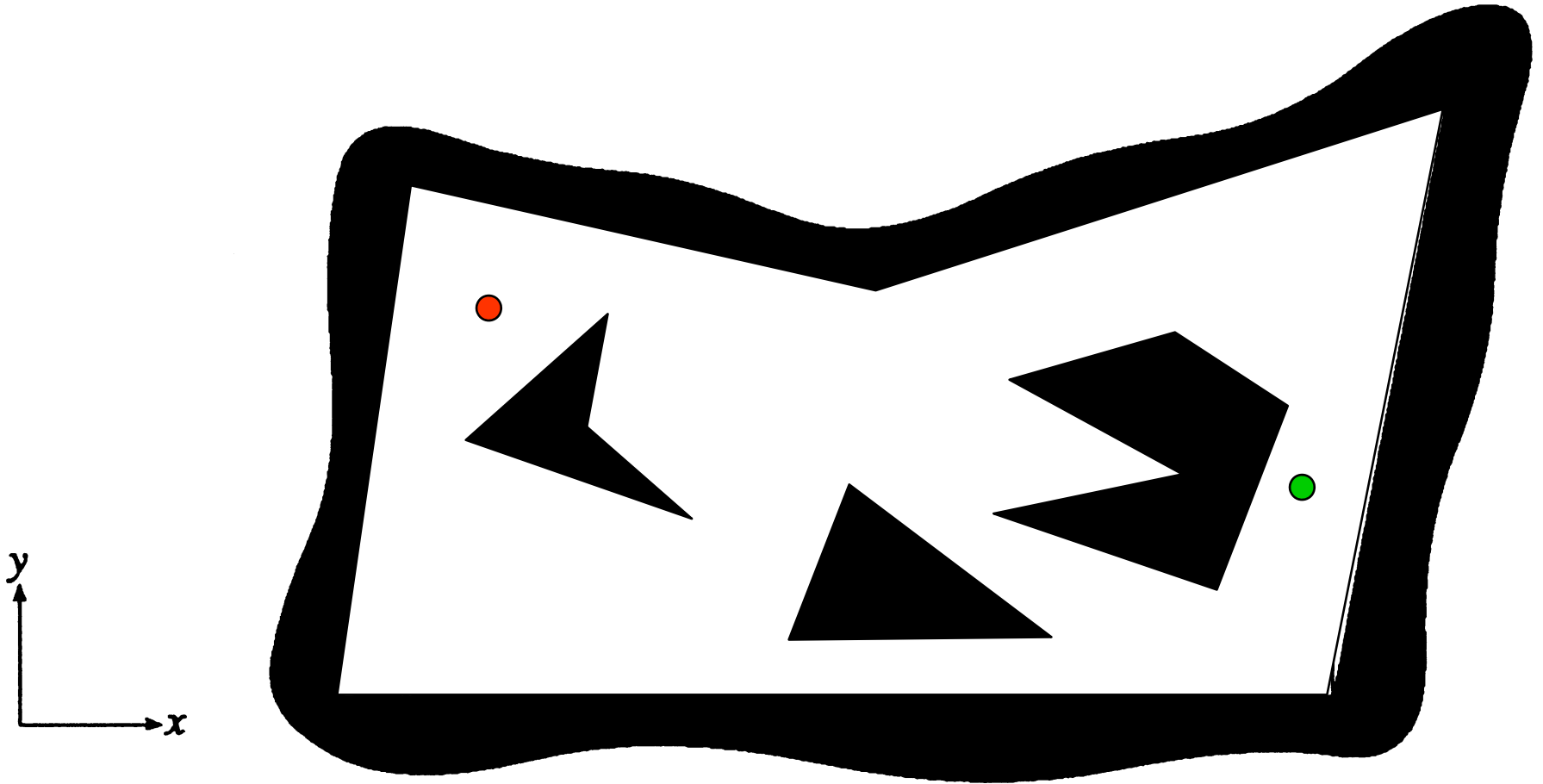
- **Exact cell decomposition**

The free space  $F$  is represented by a collection of non-overlapping cells whose union is exactly  $F$

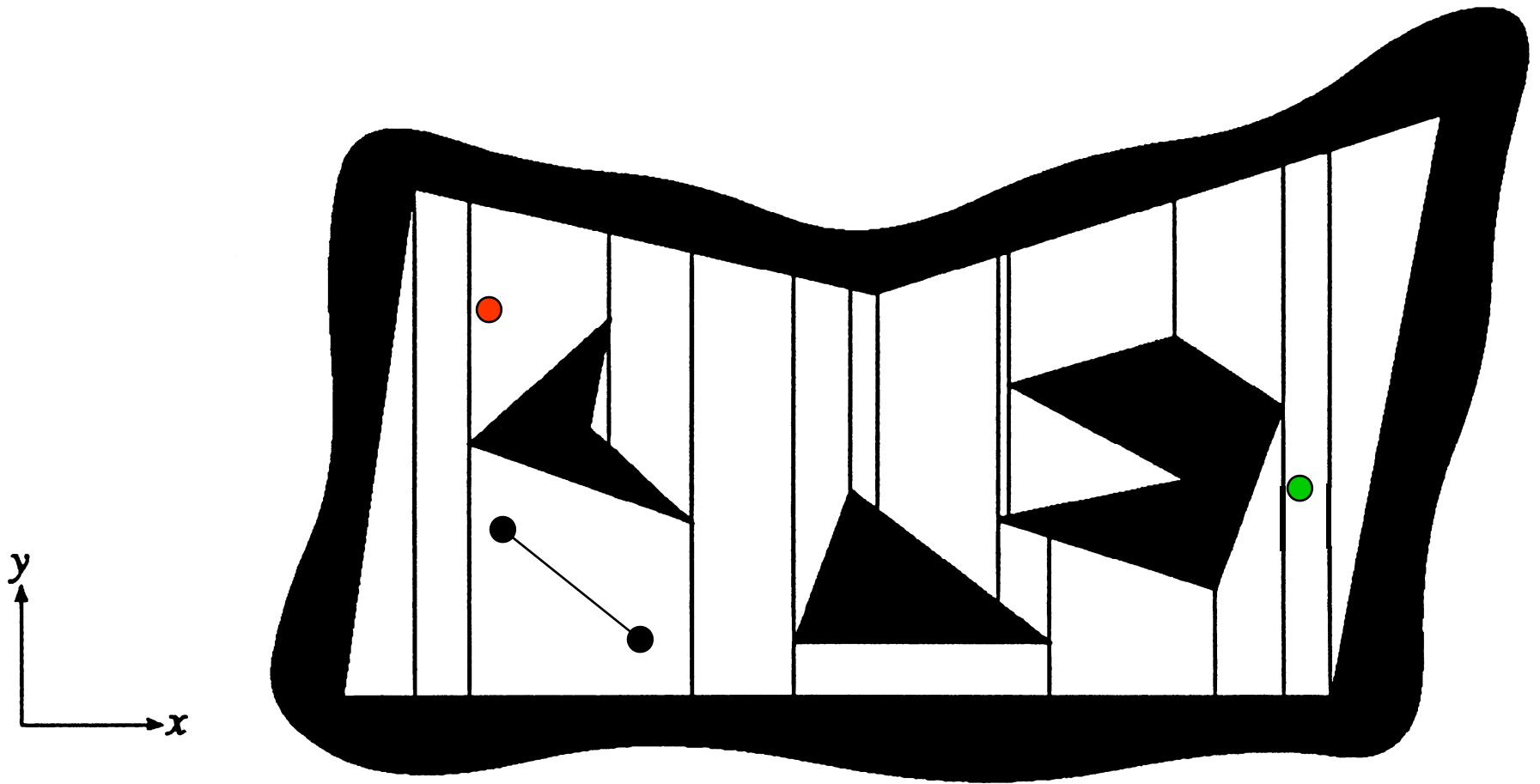
Example: trapezoidal decomposition



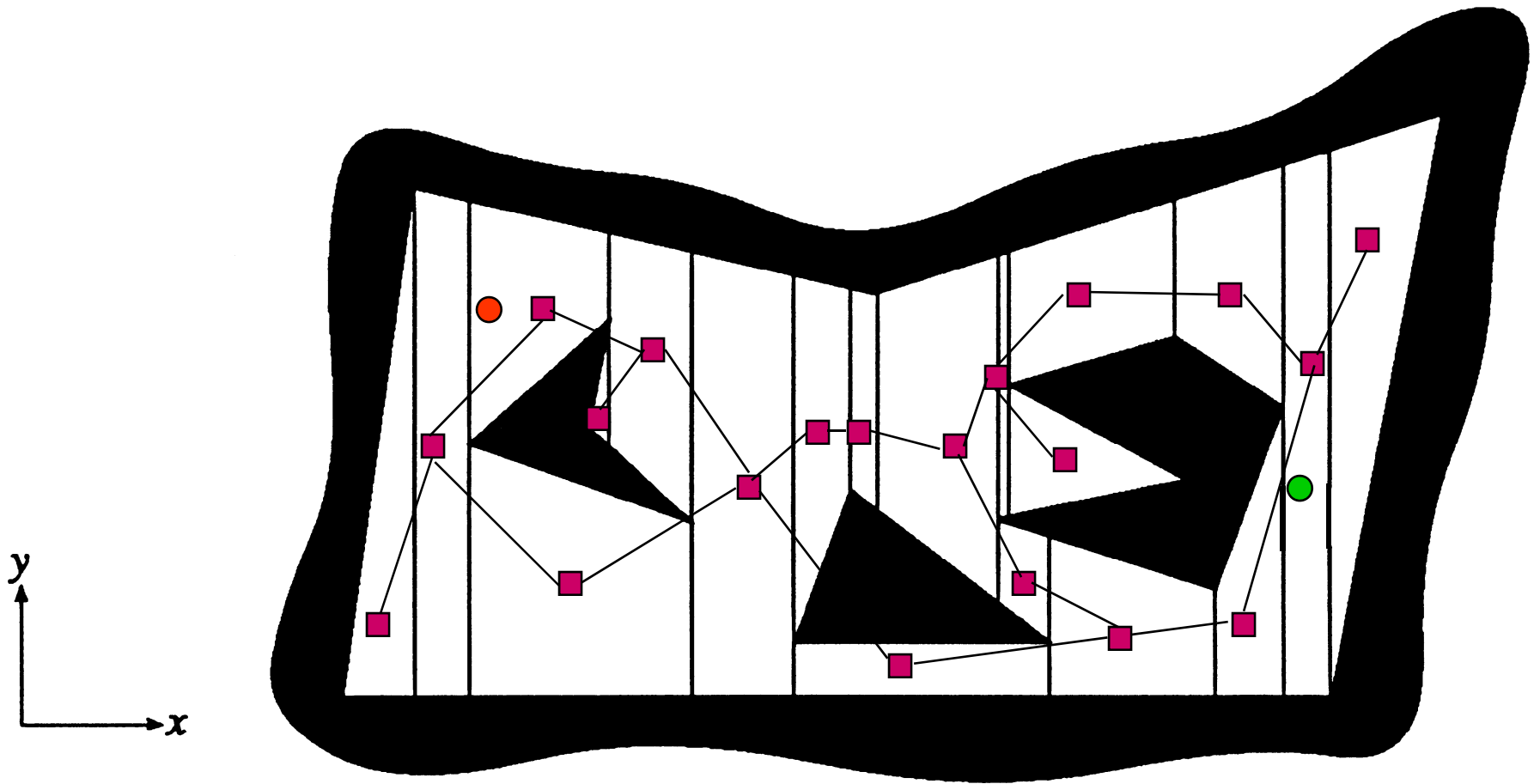
# Trapezoidal decomposition



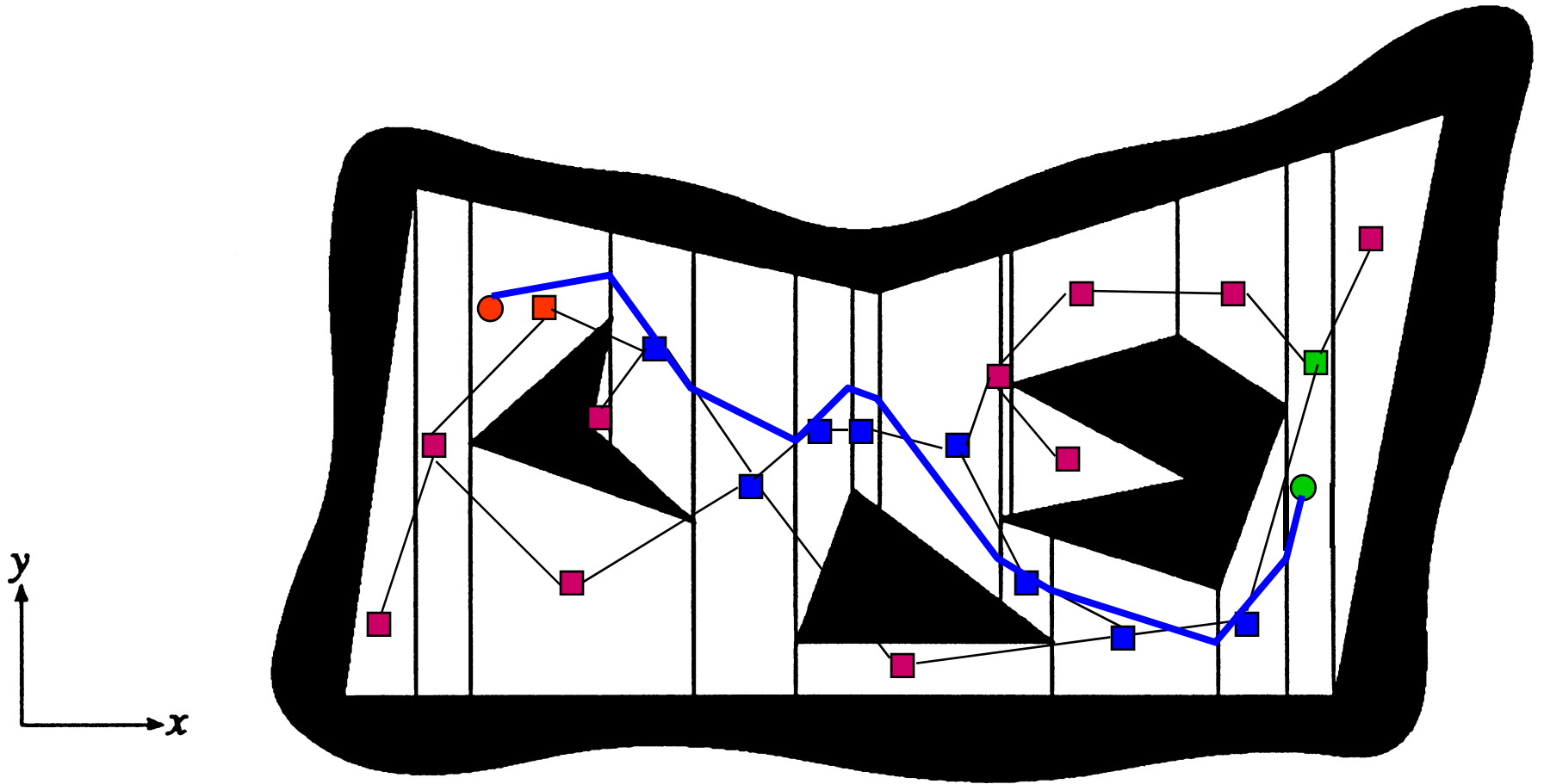
# Trapezoidal decomposition



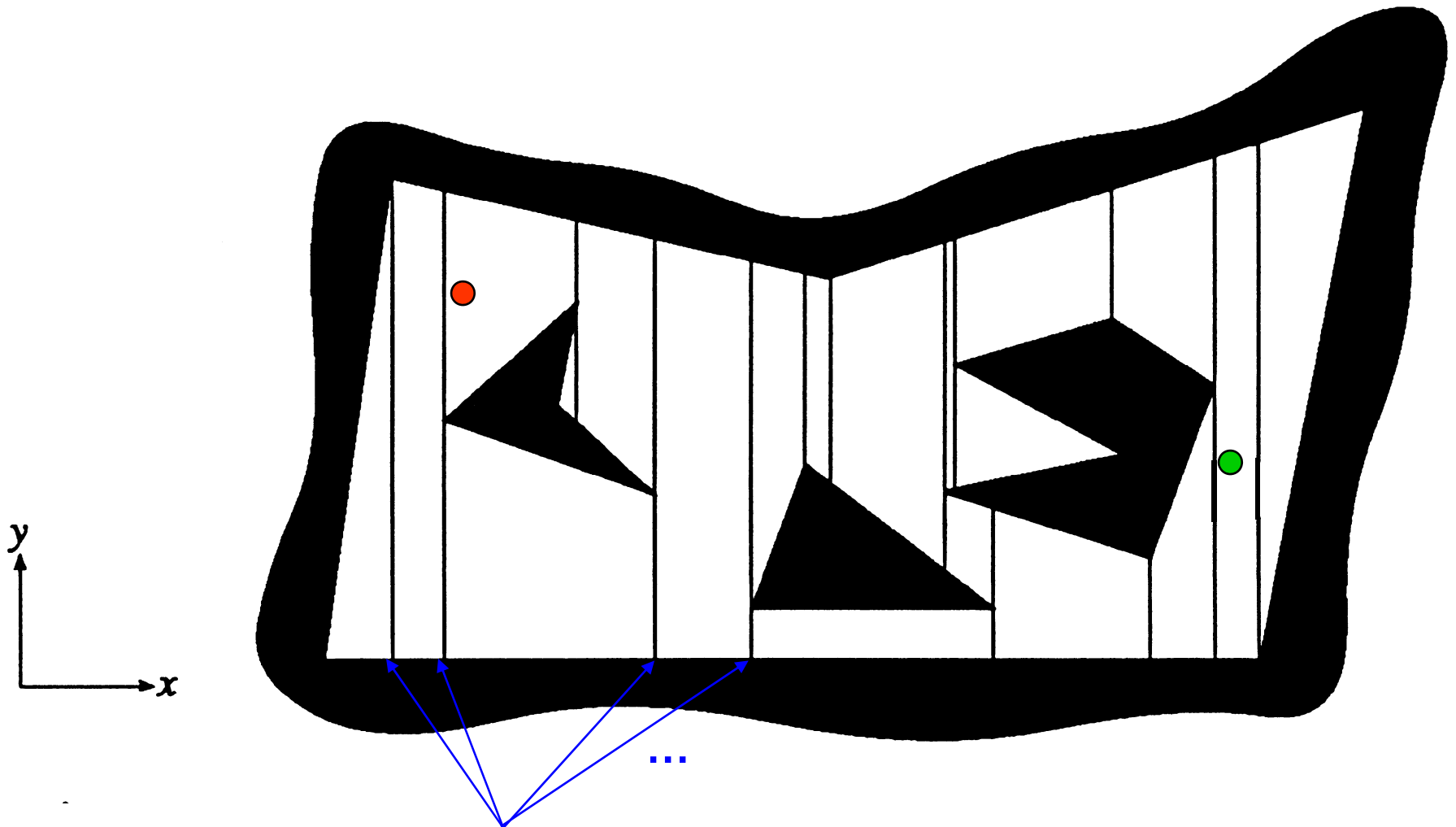
# Trapezoidal decomposition



# Trapezoidal decomposition



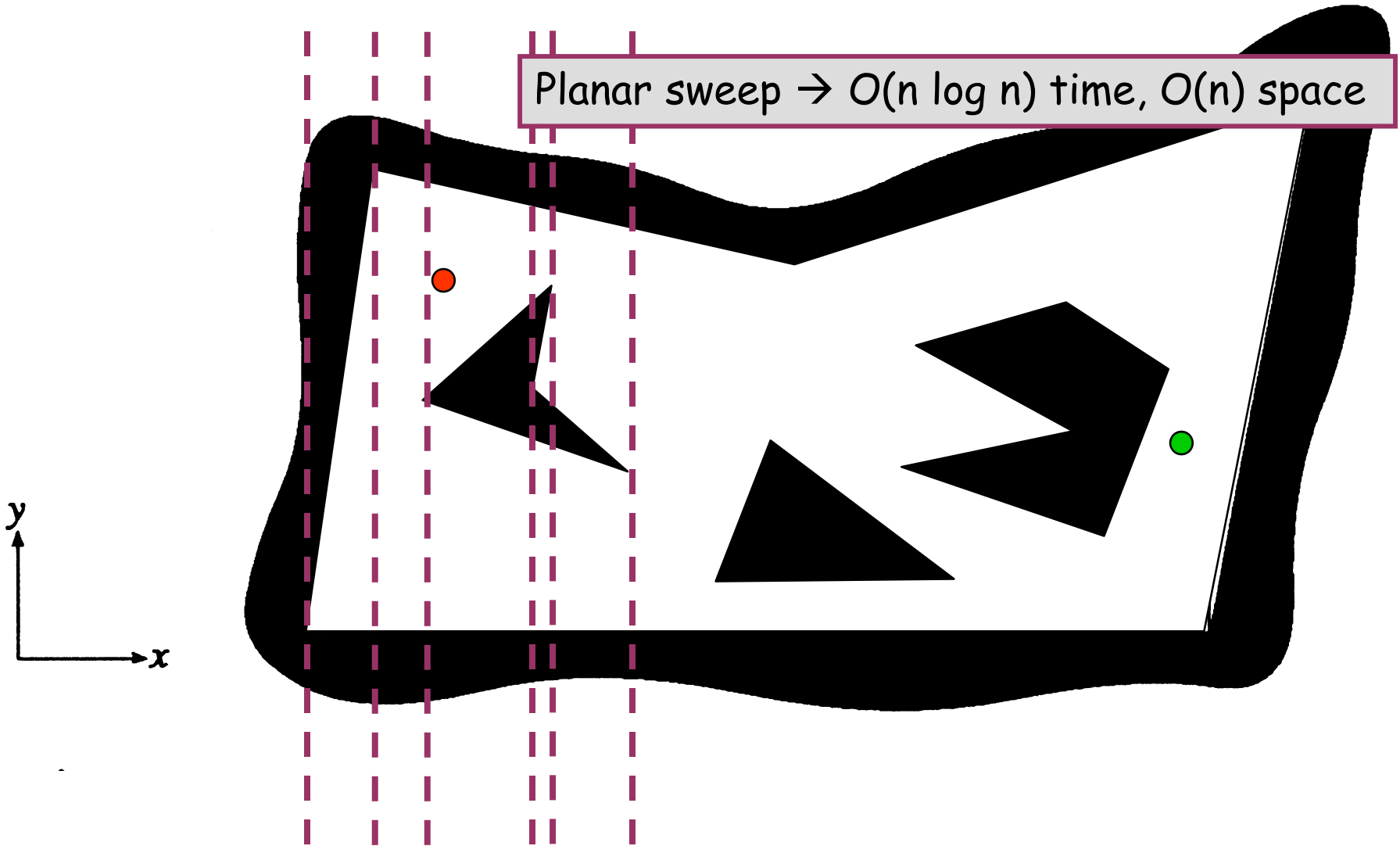
# Trapezoidal decomposition



critical events  $\rightarrow$  criticality-based decomposition

# Trapezoidal decomposition

Planar sweep  $\rightarrow O(n \log n)$  time,  $O(n)$  space



# Cell-Decomposition Methods

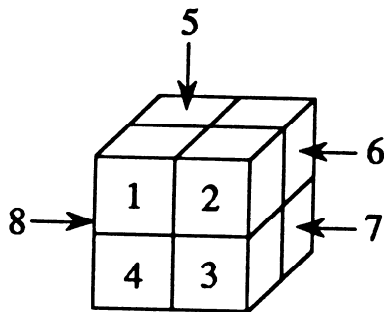
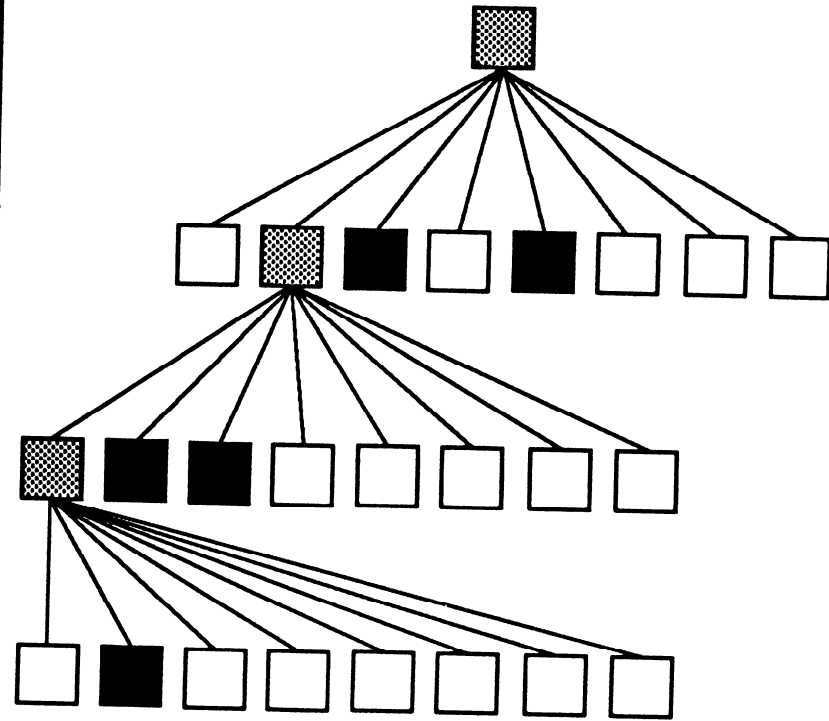
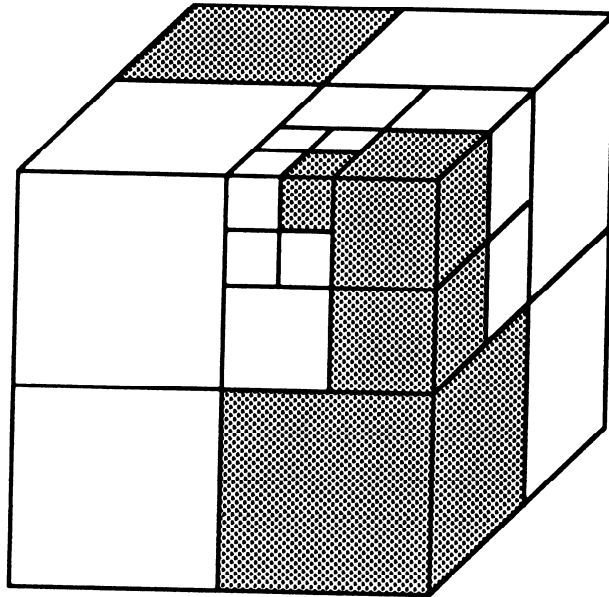
Two classes of methods:

- Exact cell decomposition
- Approximate cell decomposition

F is represented by a collection of non-overlapping cells whose union is contained in F

Examples: quadtree, octree,  $2^n$ -tree

# Octree Decomposition



 EMPTY cell    MIXED cell    FULL cell



# Sketch of Algorithm

1. Compute cell decomposition down to some resolution
2. Identify start and goal cells
3. Search for sequence of empty/mixed cells between start and goal cells
4. If no sequence, then exit with **no path**
5. If sequence of empty cells, then exit with **solution**
6. If resolution threshold achieved, then exit with **failure**
7. Decompose further the mixed cells
8. Return to **2**

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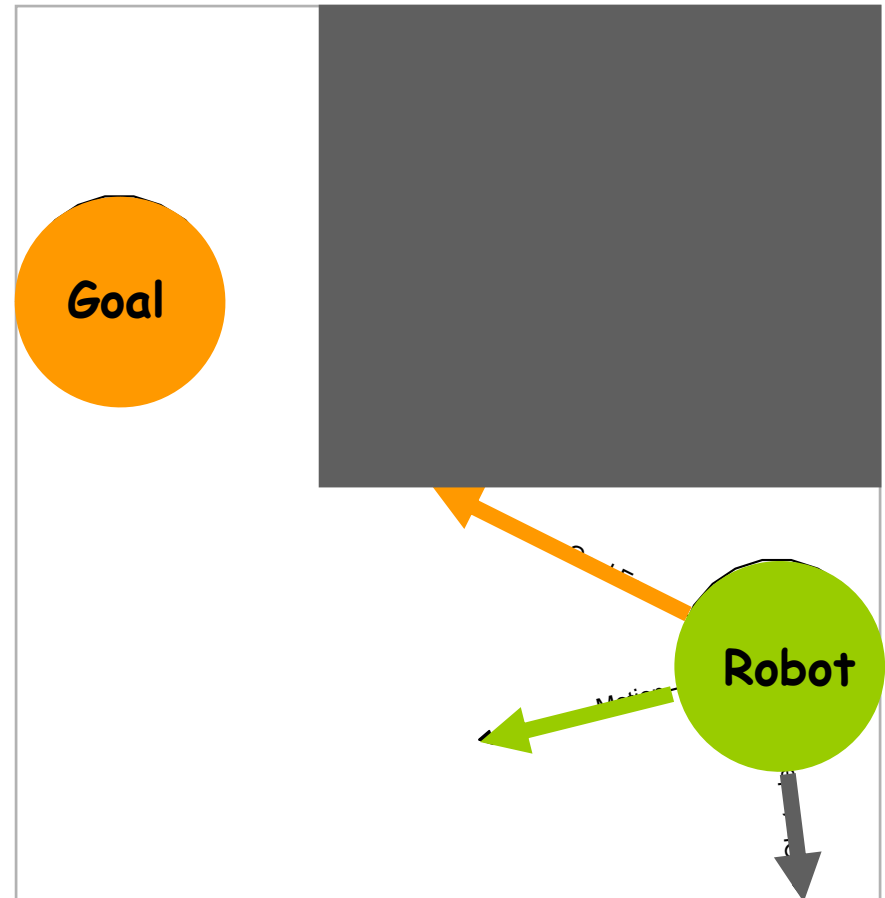
Define a function over the free space that has a global minimum at the goal configuration and follow its steepest descent

# Potential Field Methods

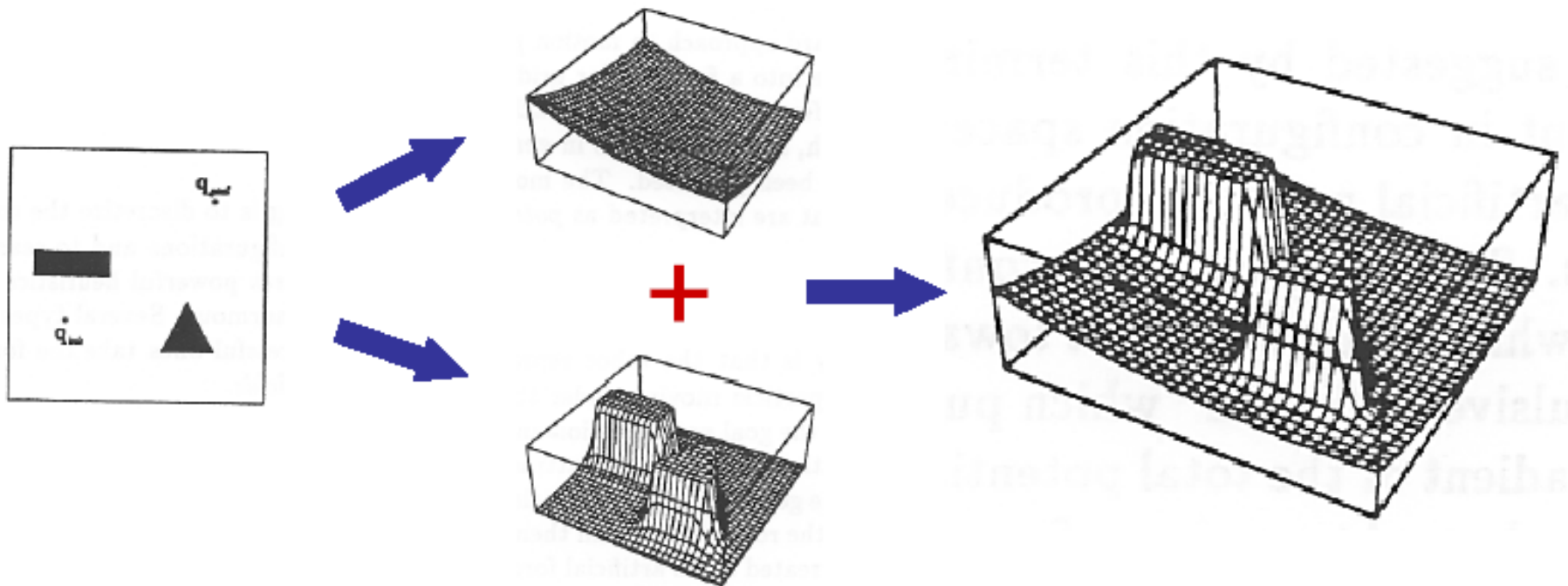
- Approach initially proposed for real-time collision avoidance [Khatib, 86]. Hundreds of papers published on it.

$$F_{Goal} = -k_p (x - x_{Goal})$$

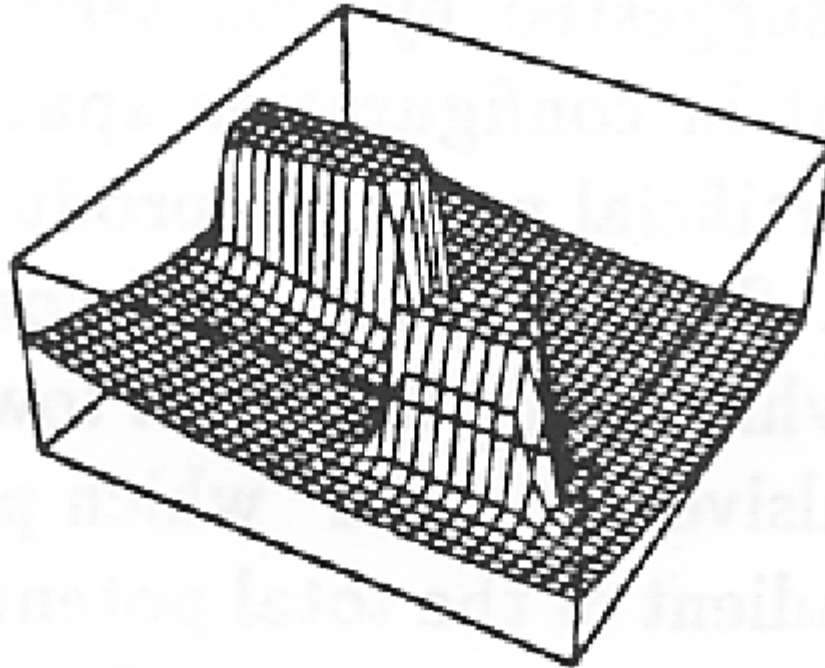
$$F_{Obstacle} = \begin{cases} \eta \left( \frac{1}{\rho} - \frac{1}{\rho_0} \right) \frac{1}{\rho^2} \frac{\partial \rho}{\partial x} & \text{if } \rho \leq \rho_0, \\ 0 & \text{if } \rho > \rho_0 \end{cases}$$



# Attractive and Repulsive fields



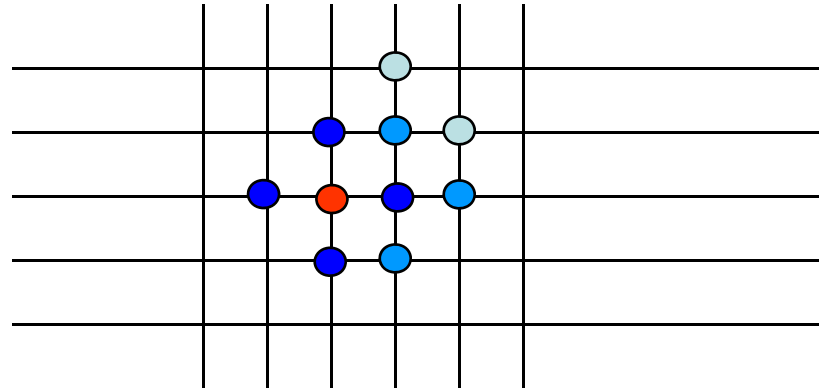
# Local-Minimum Issue



- Perform best-first search (possibility of combining with approximate cell decomposition)
- Alternate descents and random walks
- Use local-minimum-free potential (navigation function)

# Sketch of Algorithm (with best-first search)

1. Place regular grid  $G$  over space
2. Search  $G$  using best-first search algorithm with potential as heuristic function



# Simple Navigation Function

2	1	2	3
1	0	1	2
2			3
3	4	5	4

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# Completeness of Planner

- A motion planner is **complete** if it finds a collision-free path whenever one exists and return failure otherwise.
- Visibility graph, Voronoi diagram, exact cell decomposition, navigation function provide complete planners
- Weaker notions of completeness, e.g.:
  - resolution completeness  
(PF with best-first search)
  - probabilistic completeness  
(PF with random walks)

- A **probabilistically complete planner** returns a path with high probability if a path exists. It may not terminate if no path exists.
- A **resolution complete planner** discretizes the space and returns a path whenever one exists in this representation.

# Preprocessing / Query Processing

- Preprocessing:

Compute visibility graph, Voronoi diagram, cell decomposition, navigation function

- Query processing:

- Connect start/goal configurations to visibility graph, Voronoi diagram
- Identify start/goal cell
- Search graph

# Issues for Future Classes

- Space dimensionality
- Geometric complexity of the free space
- Constraints other than avoiding collision
- The goal is not just a position to reach
- Etc ...