

# Combinatorial Motion Planning Algorithms

EN.530.663: Robot Motion Planning

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# Introduction

# Combinatorial MP algorithms

- Consider  $C_{free}$  as it is.
- All algorithms are “complete”.
- Typically “low dimensionality” and complex models → can provide an elegant and practical solution.
  - e.g,  $\mathcal{W} = \mathbb{R}^2$  and the robot is only translating with fixed orientation.
- Can provide theoretical upper bounds.
- Warning: practicality issue (hard to implement)
- Application: coverage planning problem

# Roadmaps

- Let  $\mathcal{G}$  be a topological graph that maps into  $C_{free}$ . Let  $S \subset C_{free}$  be the set of all points reached by  $\mathcal{G}$ .
- The graph  $\mathcal{G}$  is called a **roadmap** if it satisfies
  - 1 **Accessibility** From any  $q \in C_{free}$ , it is simple and efficient to compute a path  $\tau : [0, 1] \rightarrow C_{free}$  such that  $\tau(0) = q$  and  $\tau(1) = s$ ,  $\forall s \in S$ .
  - 2 **Connectivity-preserving** If  $\exists \tau : [0, 1] \rightarrow C_{free}$  s.t.  $\tau(0) = q_I$  and  $\tau(1) = q_G$ , then  $\exists \tau' : [0, 1] \rightarrow S$  s.t.  $\tau(0) = s_1$  and  $\tau(1) = s_2$ , ( $s_1, s_2 \in S$ ).
- Due to these properties, a roadmap provides a discrete representation of the continuous motion planning problem.
- A query ( $q_I, q_G$ ) is solved by connecting each query point to the roadmap and then performing a graph search on  $\mathcal{G}$ .

## Exact Cell Decomposition

# Exact Cell Decomposition

## ■ General Procedures

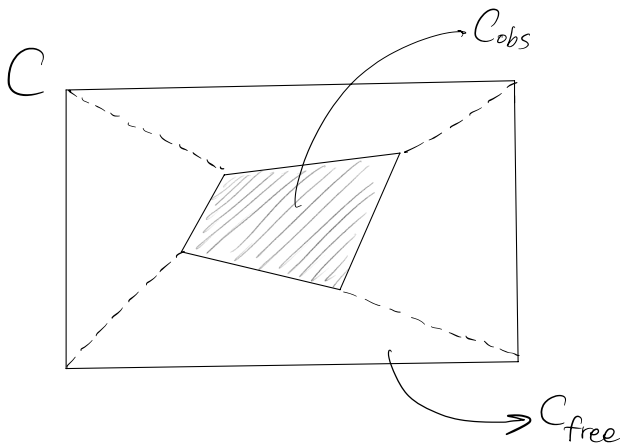
- Decompose the robot's  $C_{free}$  into a collection of non-overlapping regions (called cells) whose union is exactly  $C_{free}$ .  $\rightarrow$  need a finite data structure.
- cells  $\rightarrow$  k-cell : k-dimensional cell
- Construct and search the connectivity graph representing the adjacency relation among cells.
- Extract a path (by using Dijkstra or A\*).

# Exact Cell Decomposition

## ■ Three Properties of Cell Decomposition

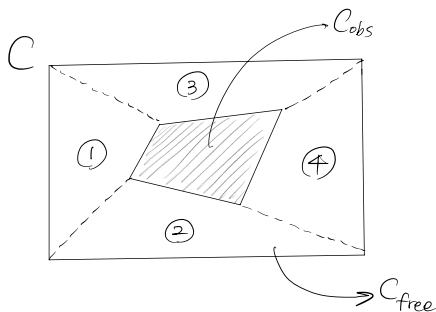
- 1 Computing a path from one point to another inside a cell must be trivially easy.
  - ex: every cell is convex  $\rightarrow$  any pair of points in a cell is connected by a line segment.
- 2 Adjacency information for the cells can be easily extracted to build a roadmap.
  - ex: edge-sharing  $\rightarrow$  then maybe choose a center point in that edge for the roadmap.
- 3 For a given  $q_I$  and  $q_G$ , it should be efficient to determine which cells contain them.
  - ex: again, convex cells are useful: in Matlab, `inpolygon`.

# Exact Cell Decomposition: Example

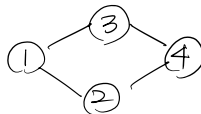




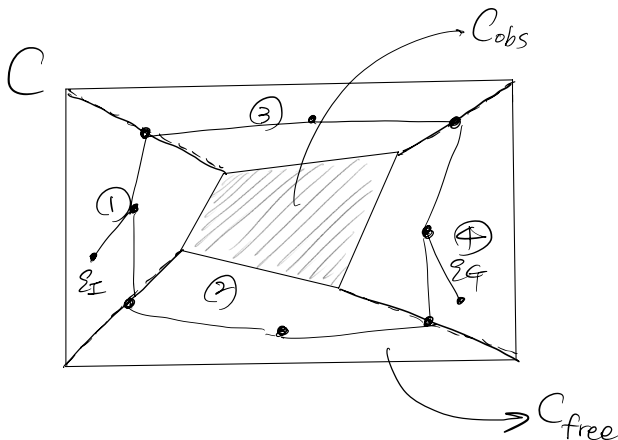
# Exact Cell Decomposition: Example



Connectivity graph



# Exact Cell Decomposition: Example



$$z_I \in \text{cell } 1$$

$$z_G \in \text{cell } 4$$

# Exact Cell Decomposition

- Other methods
  - Voronoi diagram
  - triangulation
  - Maximum-clearance roadmaps (Sec.6.2.3)
  - and more...

## Vertical/Cylindrical Cell Decomposition

# Vertical Cell Decomposition

- Cells are usually trapezoids or triangles. → also called “trapezoidal decomposition”.
- One of the easiest methods.
- Consider only  $x$ -coordinates of all vertices to form a “vertical line”.
- See Fig. 6.3 – 6.5.

# Vertical Cell Decomposition

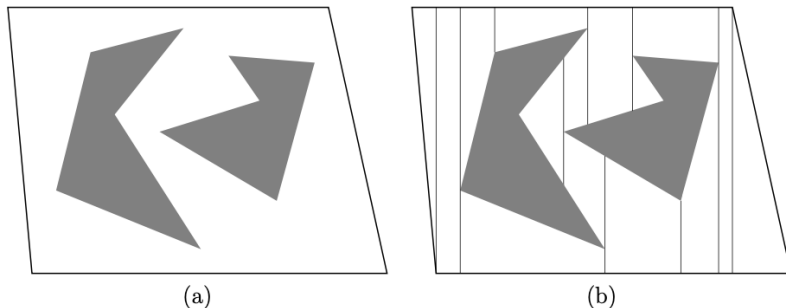


Figure 6.3: The vertical cell decomposition method uses the cells to construct a roadmap, which is searched to yield a solution to a query.

# Vertical Cell Decomposition

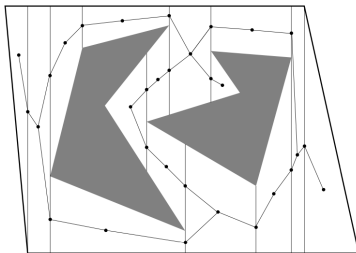


Figure 6.4: The roadmap derived from the vertical cell decomposition.

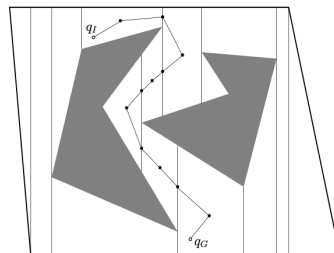
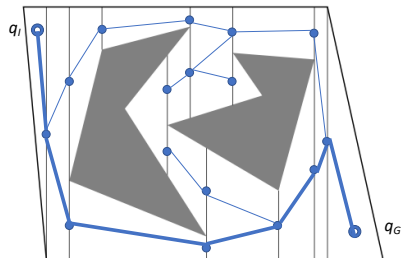
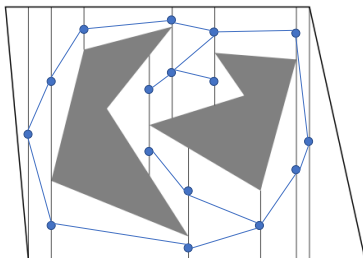


Figure 6.5: An example solution path.

# Vertical Cell Decomposition





# Vertical Cell Decomposition

## ■ Vertical Cell Decomposition Detail

- 1 Move the sweep-line from left to right.
- 2 For each vertex it touches, extend from the vertex along the line.
- 3 Stop when the line hit the features of the environment (e.g., end of the environment box).
- 4 Compute the centers and/or boundary centers and connect them.

# Vertical Cell Decomposition

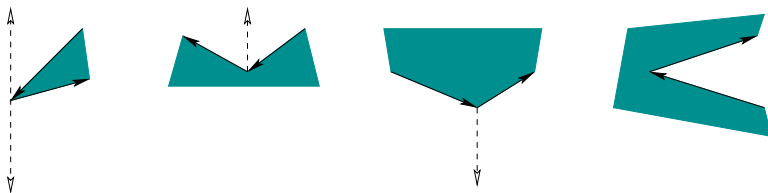


Figure 6.2: There are four general cases: 1) extending upward and downward, 2) upward only, 3) downward only, and 4) no possible extension.

# Vertical Cell Decomposition: Algorithm

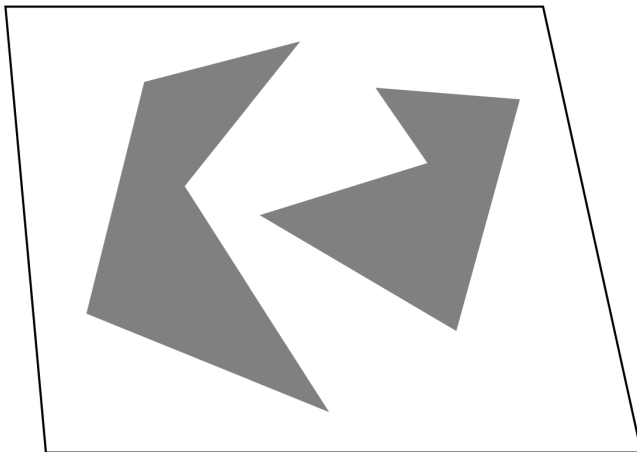
## ■ Simple Algorithm

- 1 Sort the  $x$ -coordinates of input points (vertices of  $C_{obs}$ )  $\rightarrow O(n \log n)$ .
- 2 For each point, check whether the vertical scan line intersects each line segment of the environment/obstacle, then pick the closest intersection points. In other words, given  $x_i$ , consider all line segments.
- 3 Overall, computation time:  $O(n^2)$ .

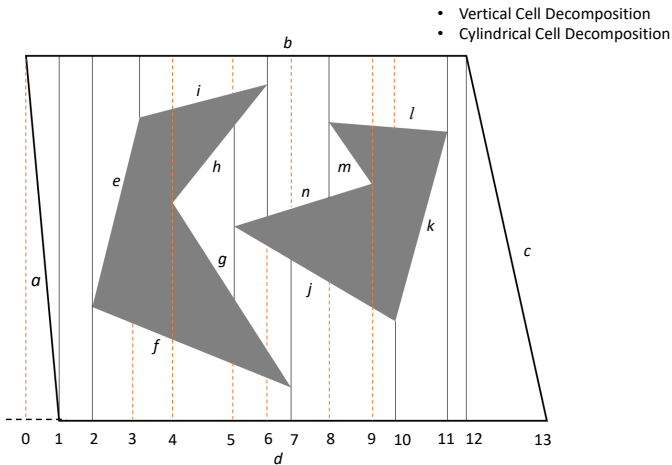
## ■ Efficient Algorithm

- Use “plane-sweep” (or “line-sweep”)  $\rightarrow O(n \log n)$ .
- Main idea: “keep the List”.

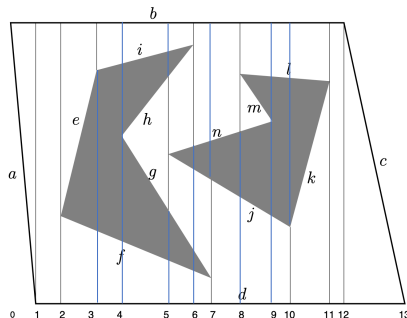
## Vertical Cell Decomposition: Algorithm Execution



# Vertical Cell Decomposition: Algorithm Execution

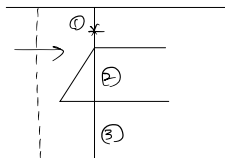


# Vertical Cell Decomposition: Algorithm Execution



Event	Sorted Edges in $L$	Event	Sorted Edges in $L$
0	$\{a, b\}$	7	$\{d, j, n, b\}$
1	$\{d, b\}$	8	$\{d, j, n, m, l, b\}$
2	$\{d, f, e, b\}$	9	$\{d, j, l, b\}$
3	$\{d, f, i, b\}$	10	$\{d, k, l, b\}$
4	$\{d, f, g, h, i, b\}$	11	$\{d, b\}$
5	$\{d, f, g, j, n, h, i, b\}$	12	$\{d, c\}$
6	$\{d, f, g, j, n, b\}$	13	$\{\}$

# Vertical Cell Decomposition: Algorithm Execution



→ split into  
3 segments

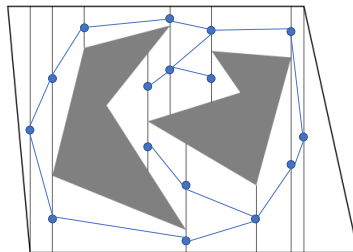
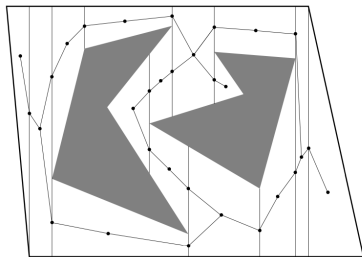
For ①: keep it (\* : center point)

For ②: ignore (NOT consider)

For ③: { keep it ⇒ cylindrical cell decomposition  
          ignore ⇒ vertical cell decomposition

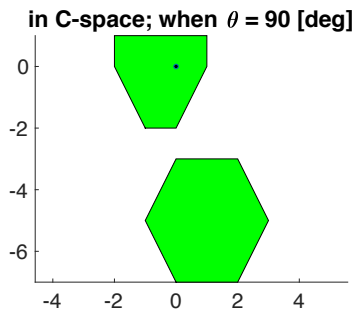
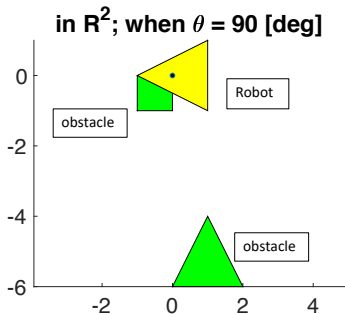
## Vertical Cell Decomposition: Algorithm Execution

- Line segment split and collect center points
- Then generate a graph.

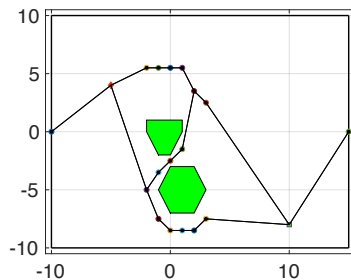
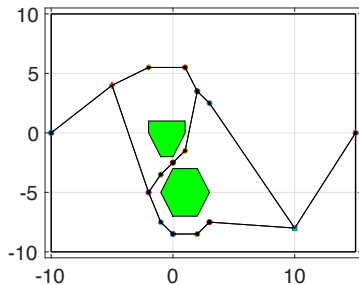




# Vertical Cell Decomposition: Example



# Vertical Cell Decomposition: Example



# Vertical Cell Decomposition: 3D example

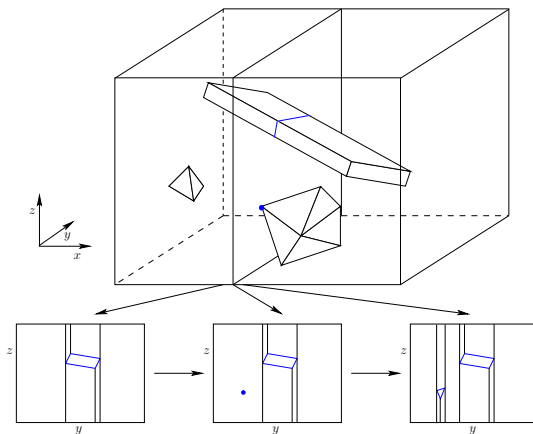
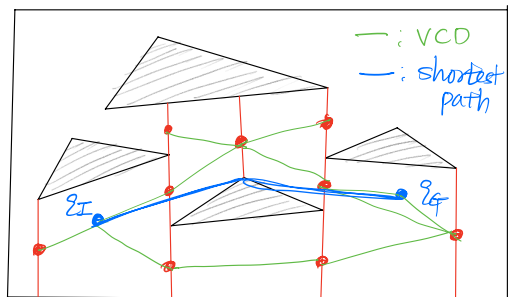


Figure 6.20: In higher dimensions, the sweeping idea can be applied recursively.

## Visibility Graph

# Visibility Graph



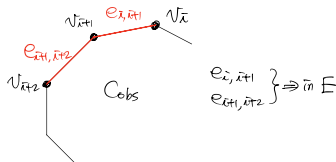
# Visibility Graph

- Visibility graph  $G = (V, E)$ 
  - $V = \{v_i\}$  node set: includes  $q_I$ ,  $q_G$ , and all the vertices of the configuration space obstacles.
  - $E = \{e_{ij}\}$  where  $e_{ij}$  denotes a straight line segment that connects  $v_i$  and  $v_j$ .
  - $e_{ij} \neq \emptyset \Leftrightarrow tv_i + (1 - t)v_j \in \mathcal{CI}(C_{free}), \forall t \in [0, 1]$

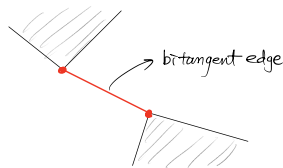
# Visibility Graph

Specifically:

- 1 Consecutive reflex vertices
- 2 Bitangent edges: touches two reflex vertices that are mutually visible.



(a) Consecutive edge



(b) Bitangent edge

# Visibility Graph: Radial Sweep

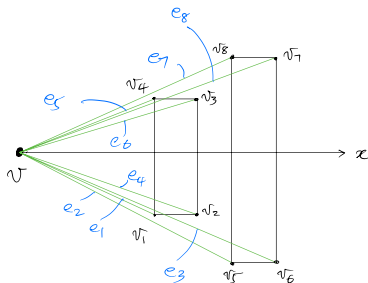
## ■ Rotational Plane Sweep Algorithm:

- 1 Sort the obstacle vertices according to the CCW angle that  $\overline{v_i v_j}$  makes with the positive  $x$ -axis.
- 2 Check if  $v_i, v_j \in \text{same } C_{obs}$ .
- 3 If so, keep only “boundary” edges to insert into  $G$ .
- 4 If NOT, insert the edges that are “visible” to  $G$ .

## ■ Improvements: read p.218 (Sec.6.2.4)



# Visibility Graph: Radial Sweep: Visible



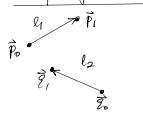
- Sorted edges:  $\{e_6, e_8, e_5, e_7, e_2, e_1, e_3, e_4\}$
- Edges to keep (visible edges from  $v$ ):  $\{e_5, e_7, e_2, e_1\}$

# Visibility Graph

- Needs an algorithm to check the intersection of line segments.
- Regarding the “piano mover’s problem”, it may not provide a best solution.
- For higher dimensional problems (e.g., 3D), it does not provide a shortest-path solution.
  - The shortest path in 3D does not need to pass through vertices.

# Visibility Graph: Line Segments Intersection

□ Computing two line segments intersection



$$l_1: \vec{p}_0 + s(\vec{p}_1 - \vec{p}_0), s \in [0, 1]$$

$$l_2: \vec{z}_0 + t(\vec{z}_1 - \vec{z}_0), t \in [0, 1]$$

Let  $\begin{cases} \vec{u} = \vec{p}_1 - \vec{p}_0 \\ \vec{v} = \vec{z}_1 - \vec{z}_0 \end{cases}$

•  $\left| \frac{\vec{u} \cdot \vec{v}}{\|\vec{u}\| \|\vec{v}\|} \right| = 1 \rightarrow l_1, l_2 \text{ are parallel.}$

• Let  $A = \begin{bmatrix} \vec{u}_1 & \vec{u}_2 \end{bmatrix} \in \mathbb{R}^{2 \times 2}$  }  $\Rightarrow$  solve  $A\vec{x} = \vec{b}$   
 $\vec{b} = \vec{p}_0 - \vec{z}_0$   $\vec{x} = \begin{pmatrix} s \\ t \end{pmatrix}$

•  $\therefore l_1 = l_2$

$$\vec{p}_0 + s(\vec{p}_1 - \vec{p}_0) = \vec{z}_0 + t(\vec{z}_1 - \vec{z}_0)$$

$$(\vec{p}_0 - \vec{p}_1)s + (\vec{z}_1 - \vec{z}_0)t = \vec{p}_0 - \vec{z}_0$$

$$\underbrace{\begin{bmatrix} \vec{p}_0 - \vec{p}_1 & \vec{z}_1 - \vec{z}_0 \end{bmatrix}}_A \underbrace{\begin{pmatrix} s \\ t \end{pmatrix}}_{\vec{x}} = \underbrace{\vec{p}_0 - \vec{z}_0}_{\vec{b}}$$

First, check parallel  
 $A = \begin{bmatrix} \vec{u}_1 & \vec{u}_2 \end{bmatrix} \Rightarrow \left| \frac{\vec{u}_1 \cdot \vec{u}_2}{\|\vec{u}_1\| \|\vec{u}_2\|} \right| = 1$

If not, compute for  $s$  and  $t$

if  $\bullet 0 < s < 1$  and  $0 < t < 1 \Rightarrow$  intersect



else if  $\bullet (s=0 \text{ or } s=1)$  and  $(0 < t < 1)$



$\Rightarrow$  intersect

else if  $\bullet (0 < s < 1)$  and  $(t=0 \text{ or } t=1)$



$\Rightarrow$  intersect

else if  $\bullet (s=0 \text{ or } s=1)$  and  $(t=0 \text{ or } t=1)$



$\Rightarrow$  NOT intersect

else NOT intersect



# Visibility Graph: Example

in C-space; when  $\theta = 90$  [deg]

