

CSCI 4560/6560 Computational Geometry

<https://www.cs.rpi.edu/~cutler/classes/computationalgeometry/S22/>

# Lecture 11: Voronoi Diagrams, Part 2

# Outline for Today

- Homework 4 Posted soon... (sorry)
- Last Time: Line Sweep construction of Voronoi Diagram
- Closest Point to a Line Segment
- Voronoi Diagram of Line Segments
- Motivation Application: Robotic Motion Planning
- Farthest Point Voronoi Diagram
- Motivating Application: Smallest Annulus
- Medial Axis & Higher-Order Voronoi Diagrams
- Next Time: Centroidal Voronoi Diagram & K-Means Clustering

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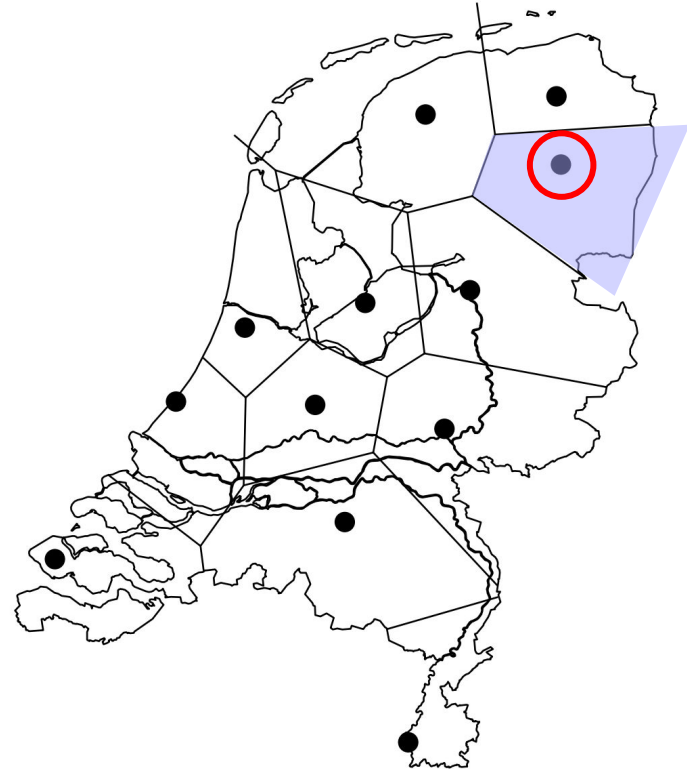
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# Voronoi Diagram - Social Geography

- There are a bunch of grocery stores spread across a large city.
- You're planning to open another grocery store at **a specific location**.
- How many customers can you expect at the new store location?

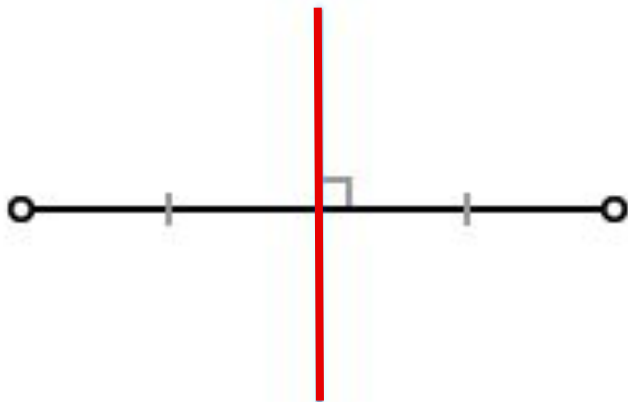
*Customers will choose the new store if it is closer to their home than their current store.*

- a.k.a. The “Post Office Problem”

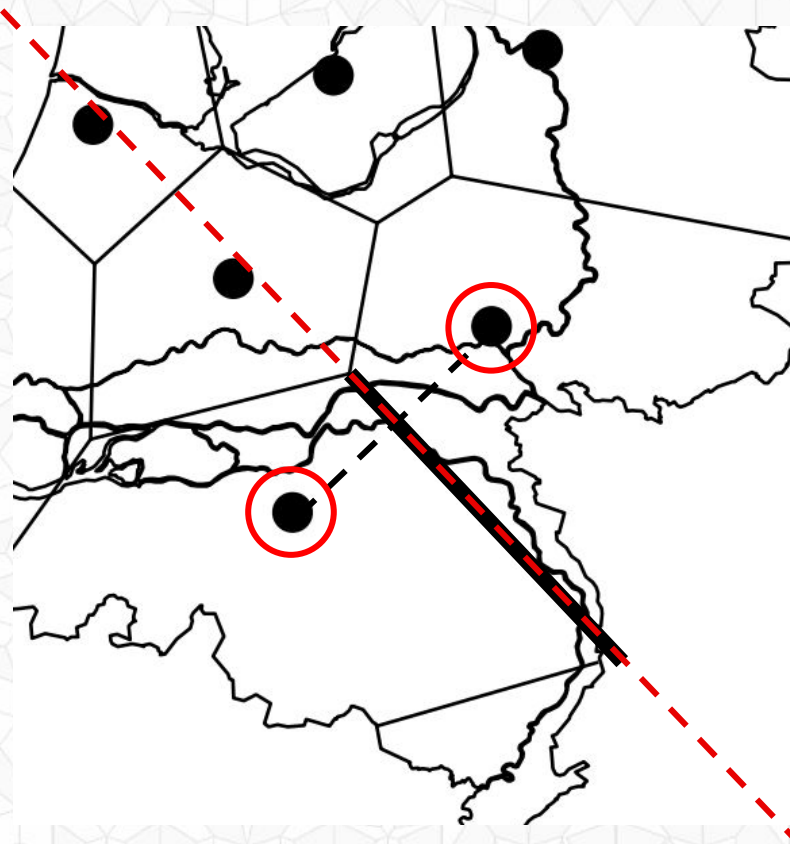


# Observation: Perpendicular Bisector

- Points on the edge between two Voronoi cells are equidistant from two Voronoi sites.
- Edges of Voronoi cells are perpendicular bisectors of two Voronoi sites.



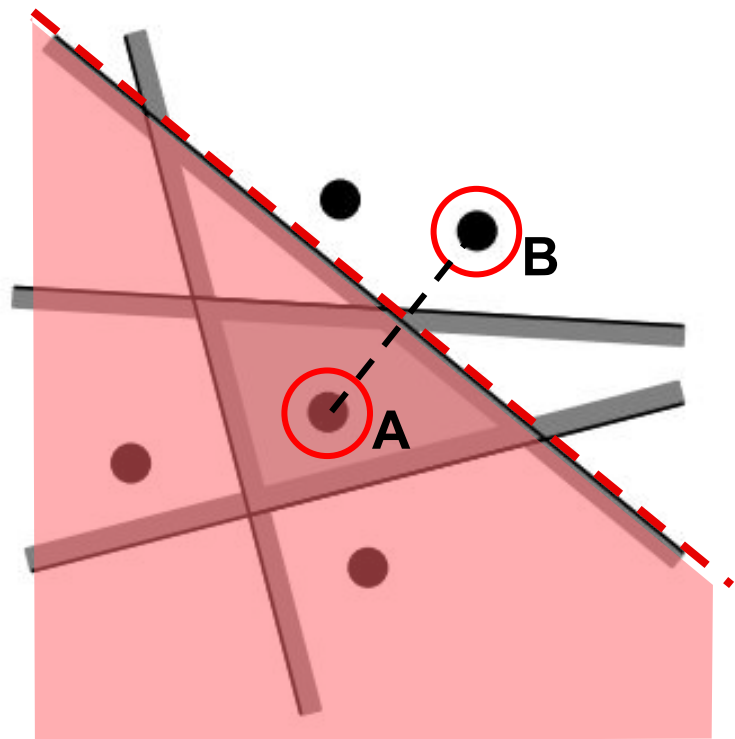
[https://euclidea.fandom.com/wiki/Perpendicular\\_Bisector](https://euclidea.fandom.com/wiki/Perpendicular_Bisector)



*Computational Geometry Algorithms and Applications,*  
de Berg, Cheong, van Kreveld and Overmars, Chapter 7

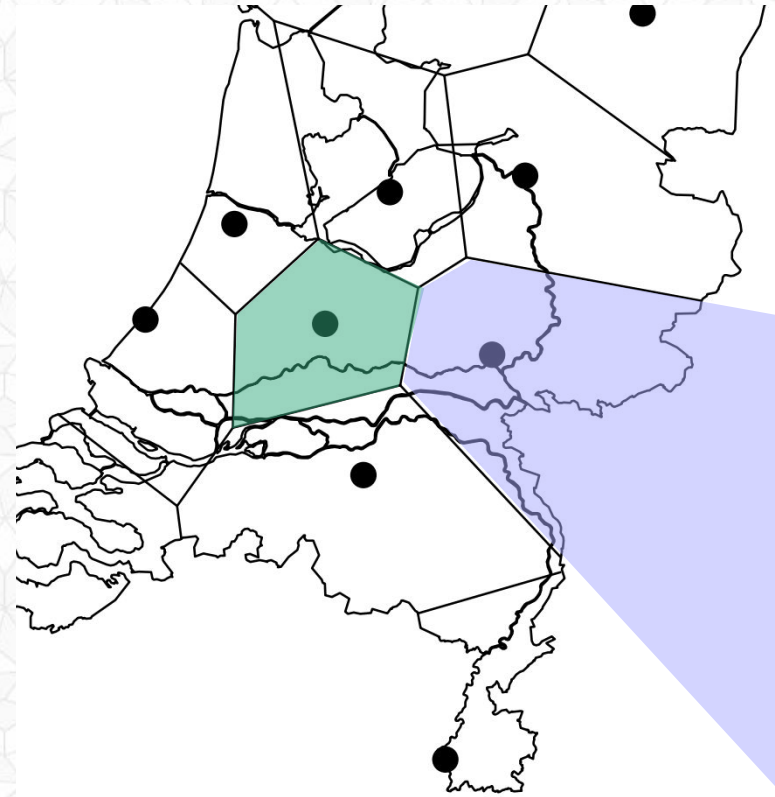
# Observation: Intersection of Half Spaces

- All points that lie on one side of the perpendicular bisector,
- Are the half-space of points that will chose site A over site B because site A is closer than site B.
- This suggests a brute force construction algorithm...



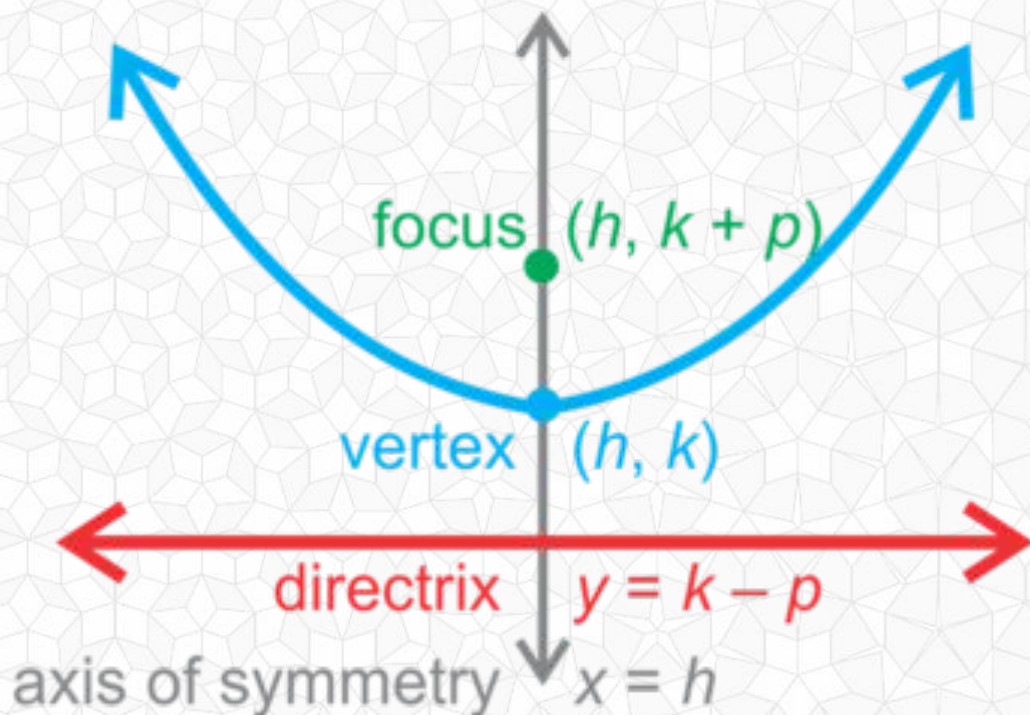
# Observation: Voronoi Cells are Convex

- Because a Voronoi cell is the intersection of half-spaces...
- A Voronoi Cell must be **convex**
- *Note: Some Voronoi Cells are unbounded*



# How to Graph a Parabola

- Typical parabola equation  
 $y = ax^2 + bx + c$
- Rewrite as  
 $(x-h)^2 = 4p(y-k)$
- $h$  gives you the vertical axis of symmetry
- $p$  &  $k$  gives you the focus & directrix



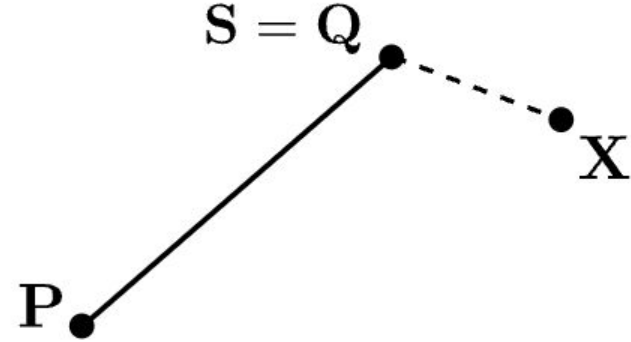
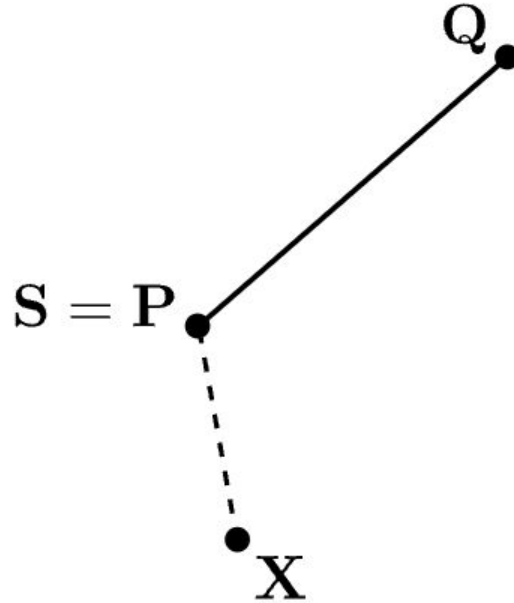
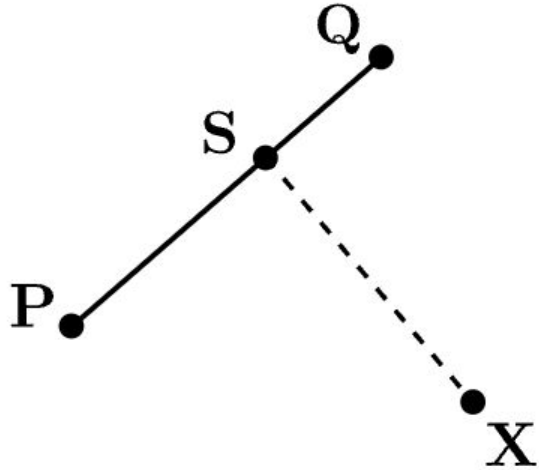


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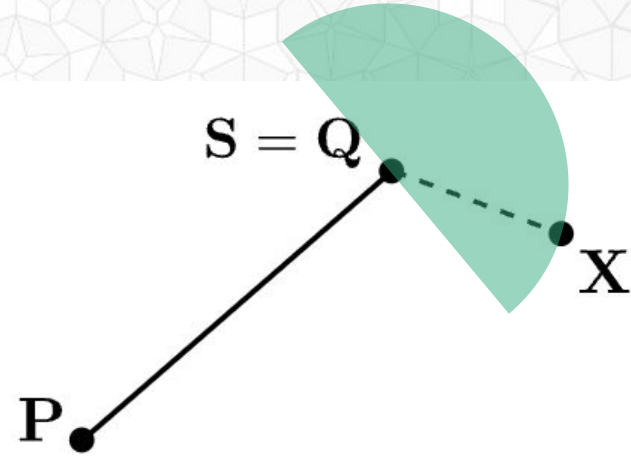
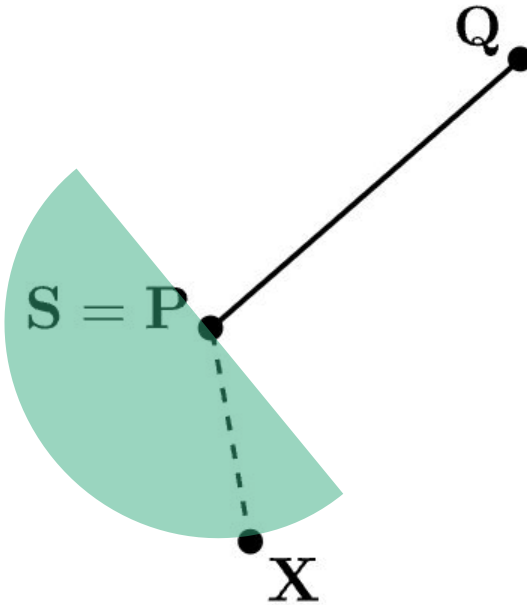
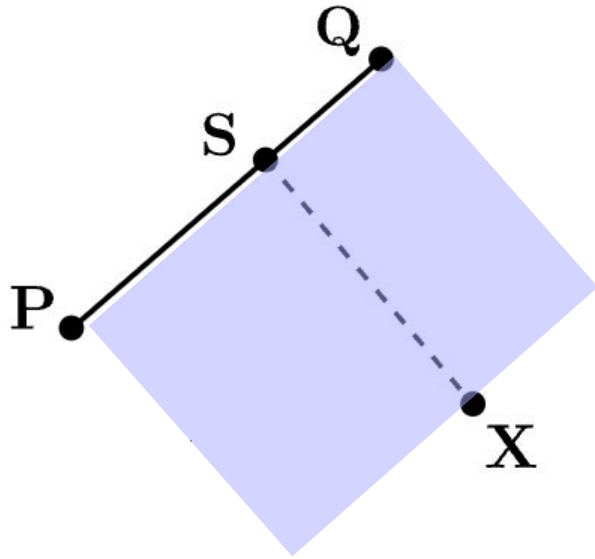
# Closest Point on a Line Segment

Need to explicitly handle 3 cases:

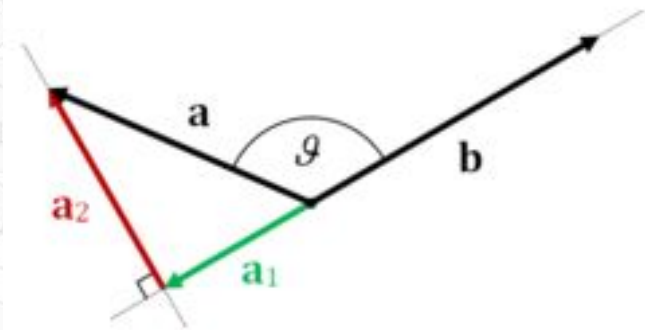
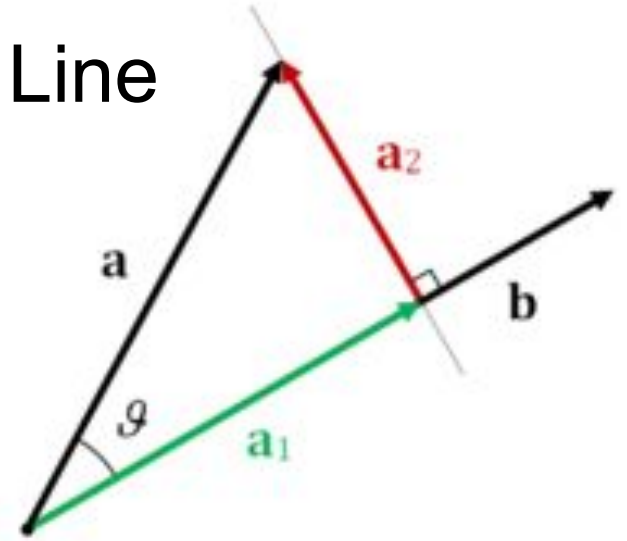


# Closest Point on a Line Segment

Need to explicitly handle 3 cases:



# Orthogonal Projection of Point to Line

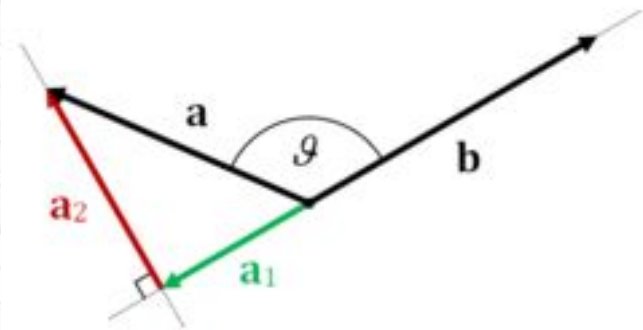
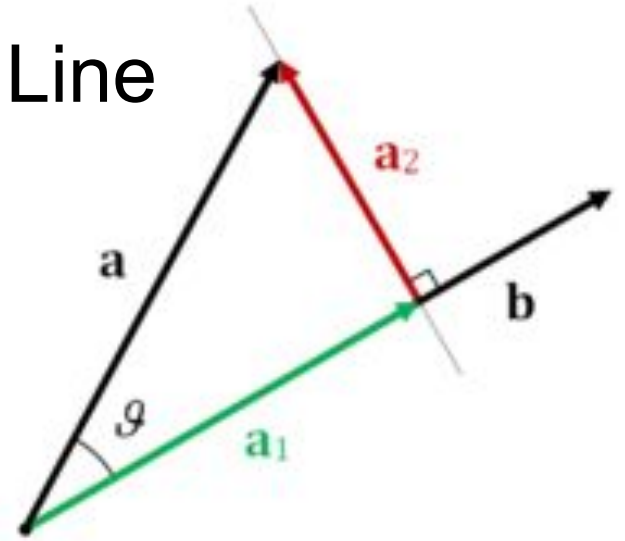


# Orthogonal Projection of Point to Line

- Break the vector  $\mathbf{a}$  into two subvectors, one parallel to  $\mathbf{b}$ , one perpendicular to  $\mathbf{b}$
- If  $\theta < 90^\circ$ ,  $\cos \theta$  will be positive
- If  $\theta > 90^\circ$ ,  $\cos \theta$  will be negative

$$a_1 = \|\mathbf{a}\| \cos \theta = \mathbf{a} \cdot \hat{\mathbf{b}}$$

$$\mathbf{a}_1 = (\mathbf{a} \cdot \hat{\mathbf{b}}) \hat{\mathbf{b}} = \frac{\mathbf{a} \cdot \mathbf{b}}{\|\mathbf{b}\|} \frac{\mathbf{b}}{\|\mathbf{b}\|} = \frac{\mathbf{a} \cdot \mathbf{b}}{\|\mathbf{b}\|^2} \mathbf{b} = \frac{\mathbf{a} \cdot \mathbf{b}}{\mathbf{b} \cdot \mathbf{b}} \mathbf{b}$$

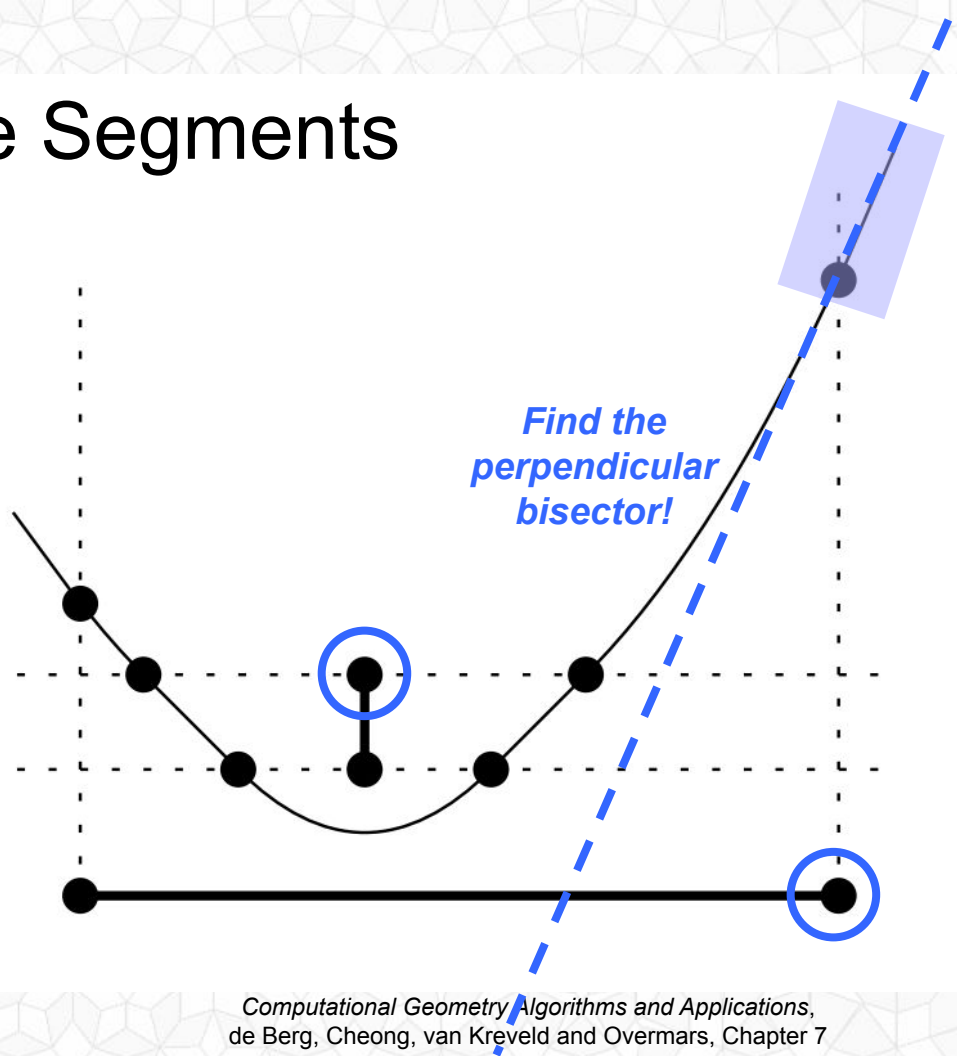


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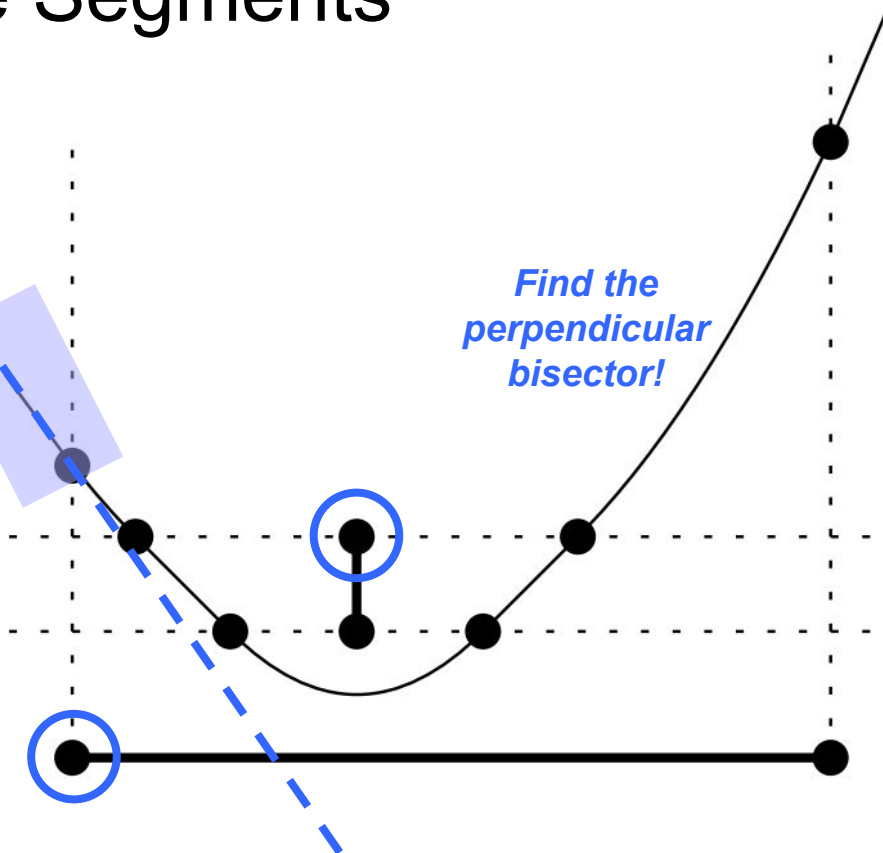
# Voronoi Diagram of Line Segments

- Points equidistant between two points form a line.



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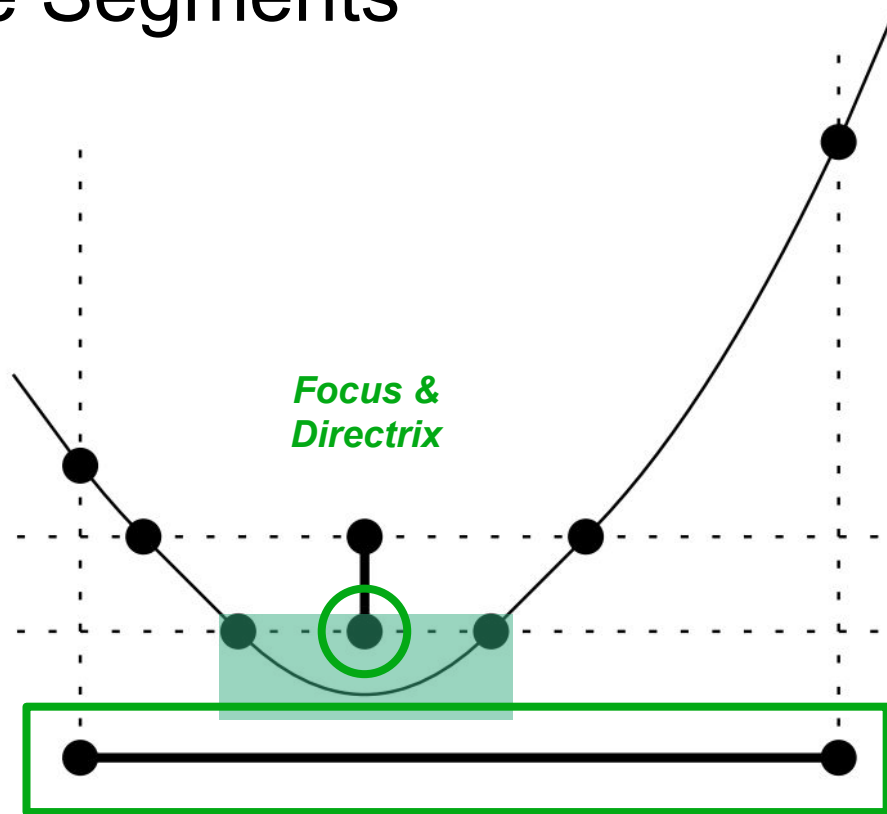
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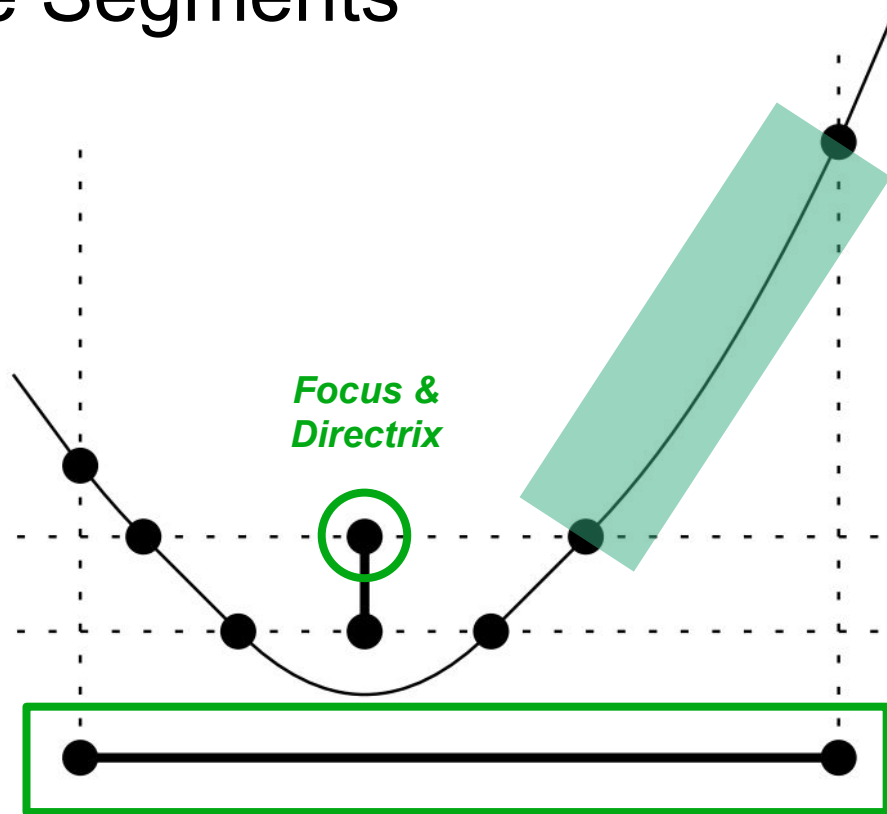
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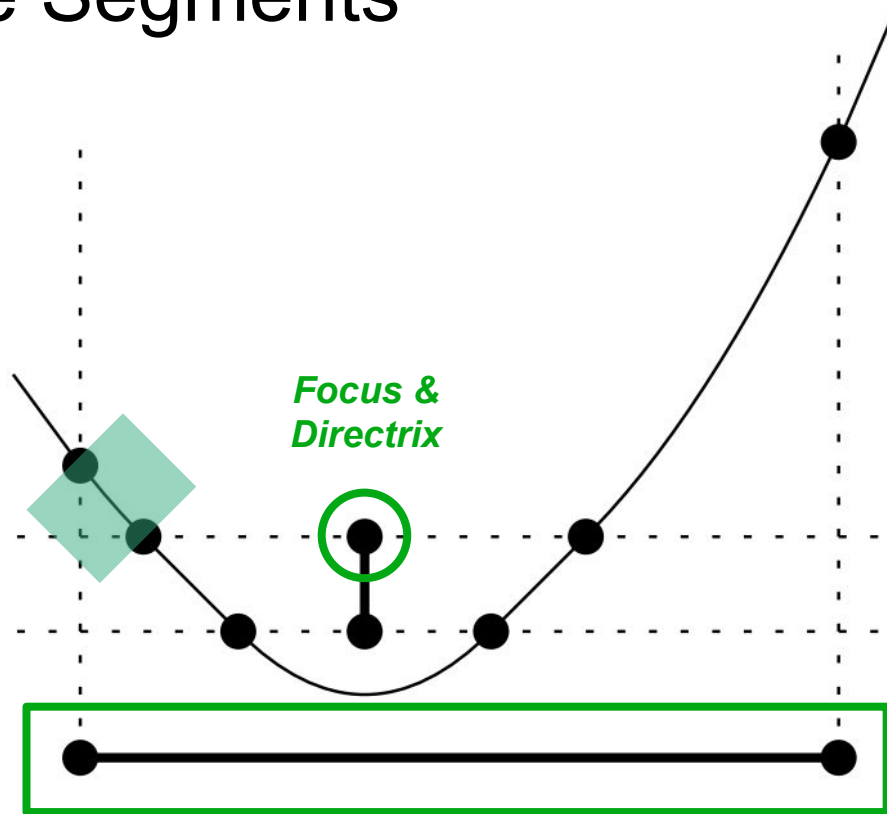
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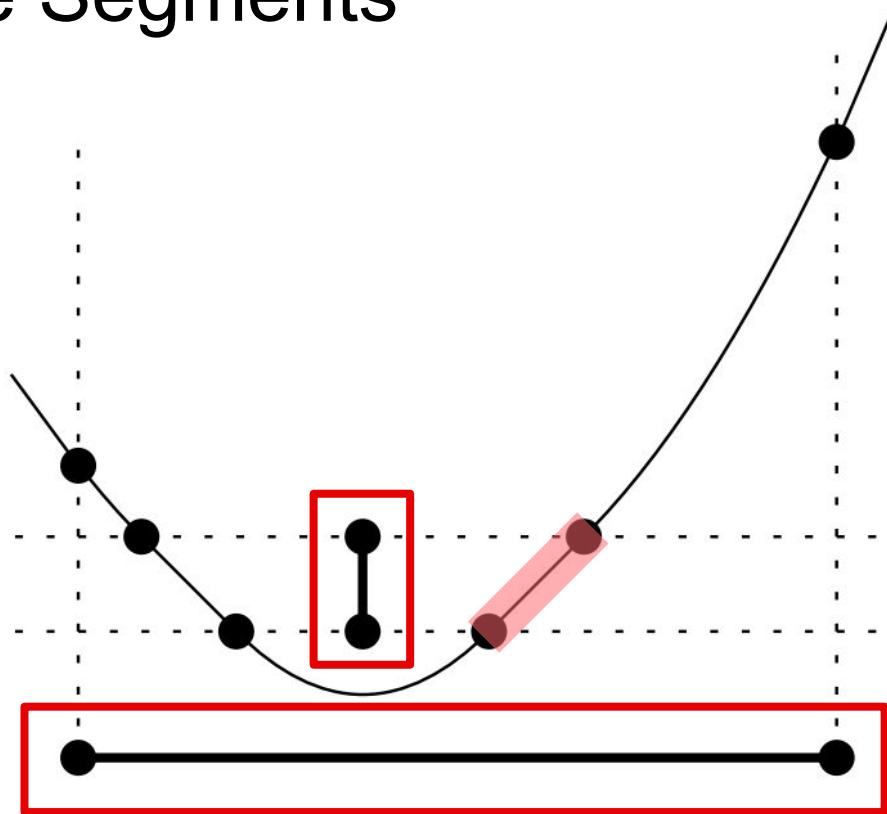
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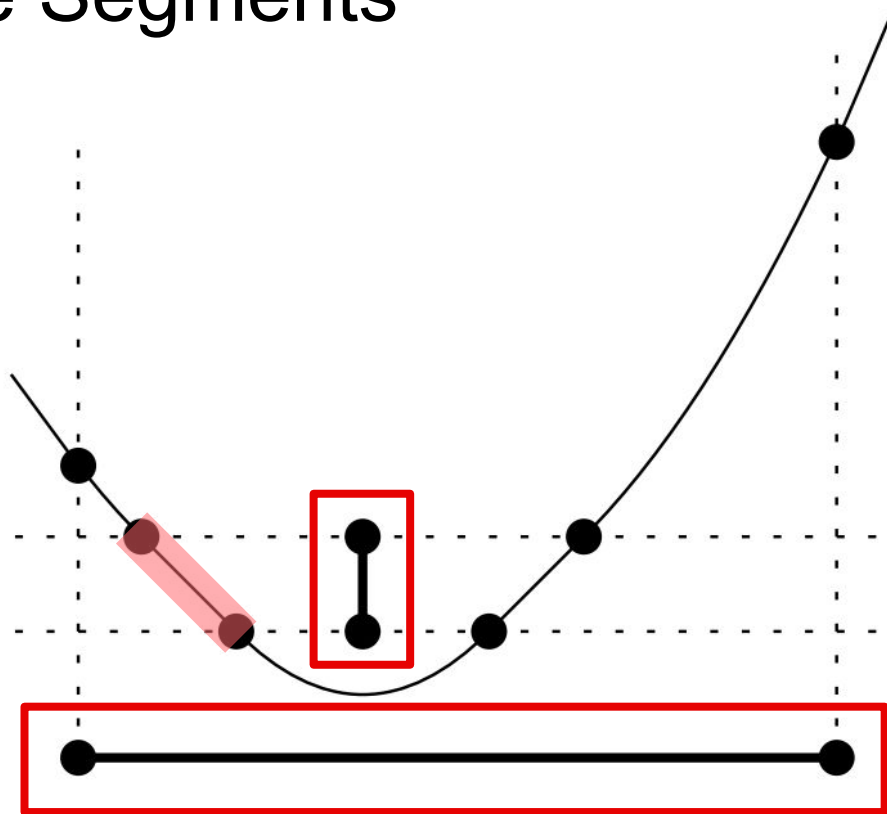
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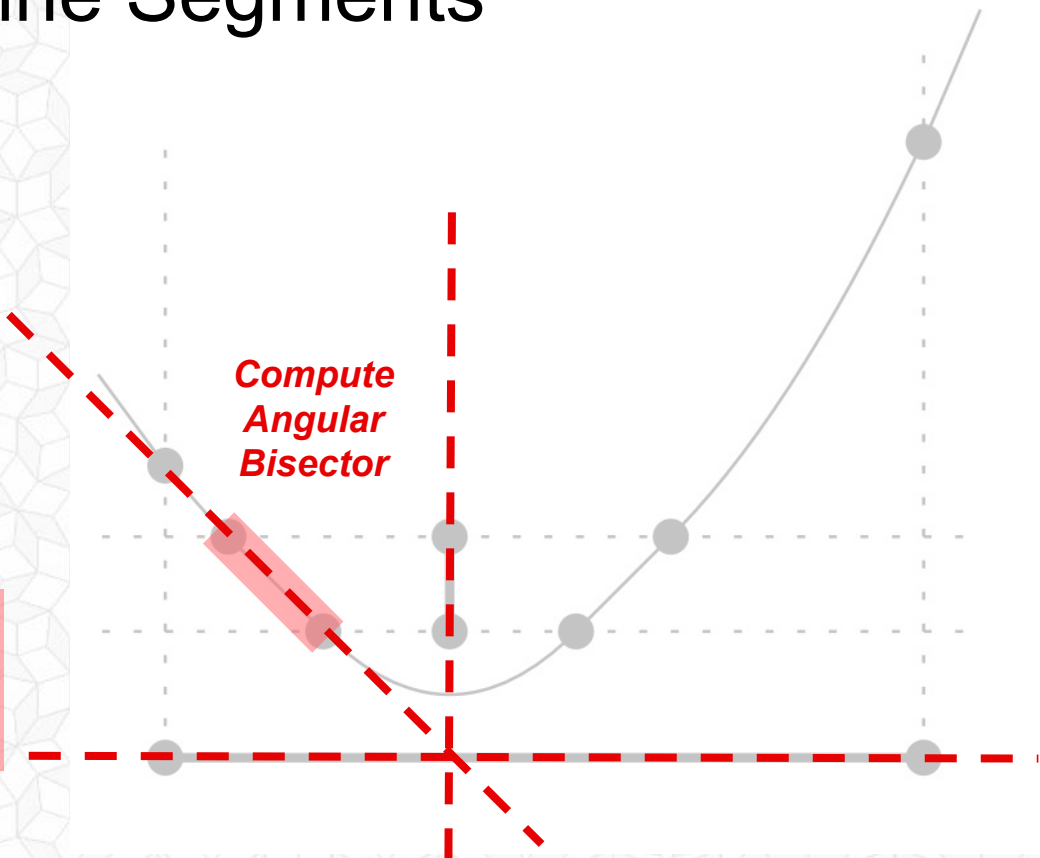
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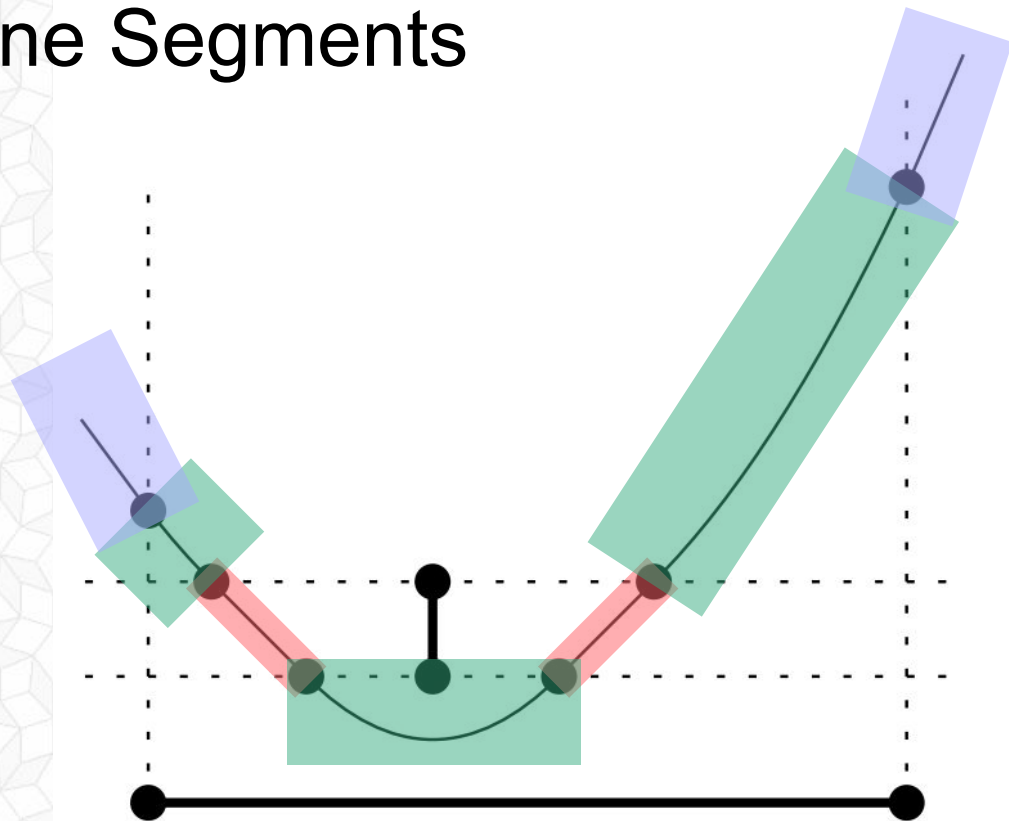
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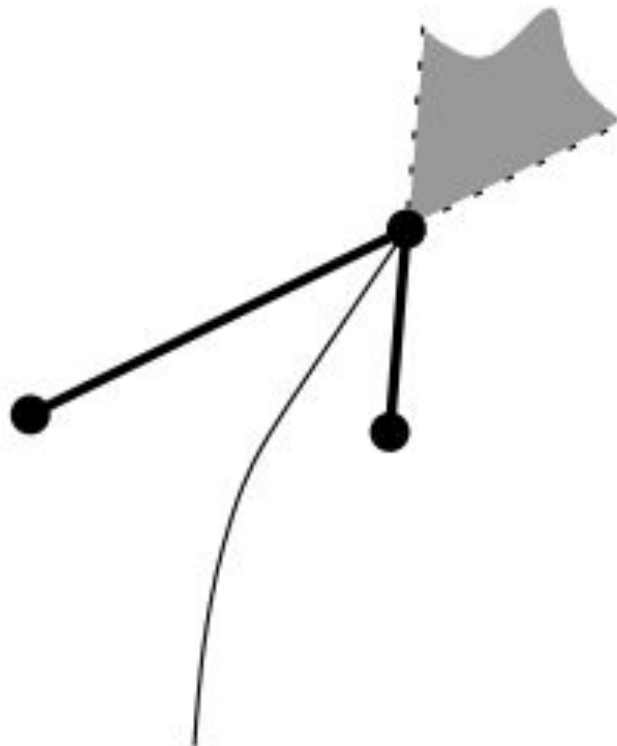
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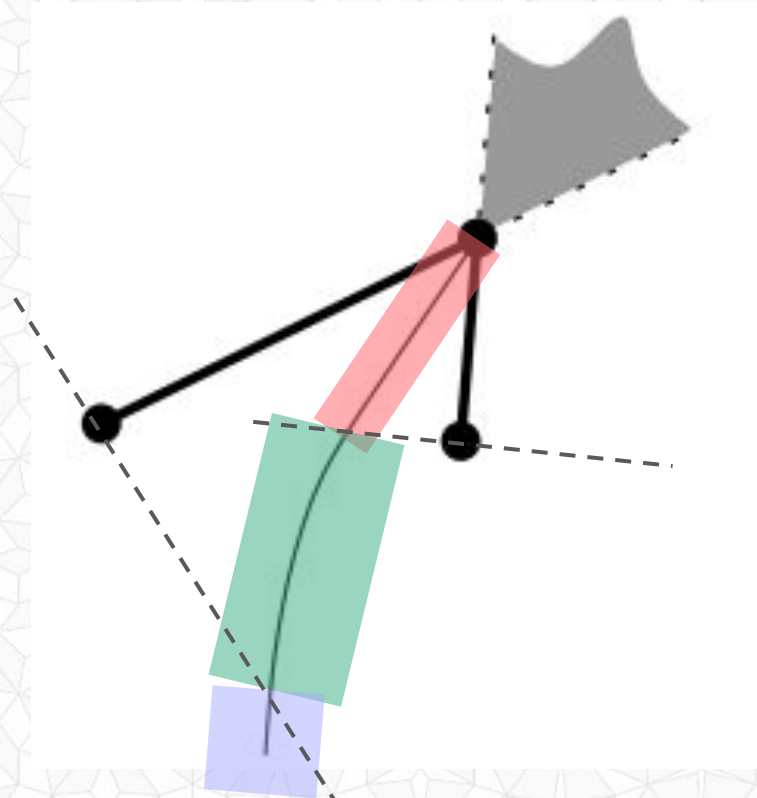
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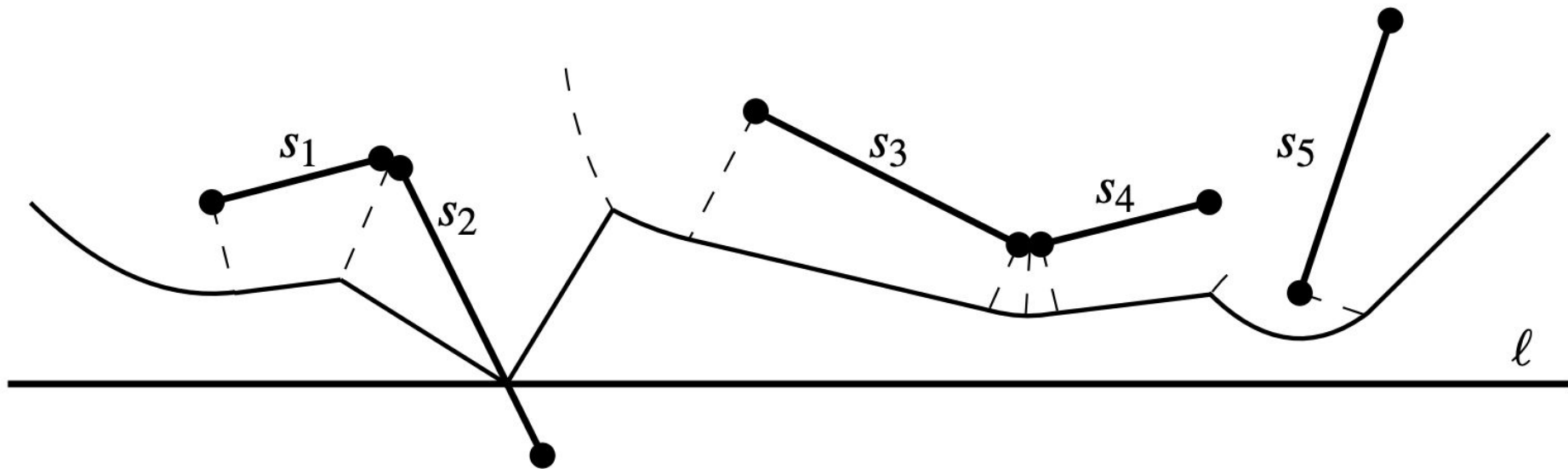
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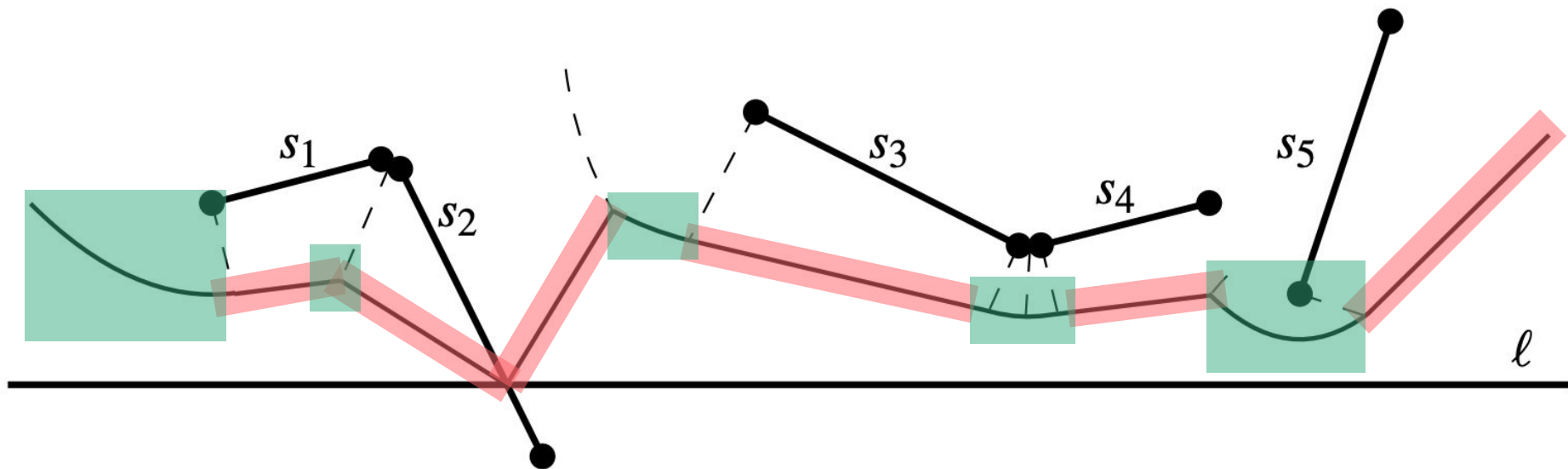
# Sweep Line: More Complicated Beach Front

- Fortunately, the complexity (# of segments) is still  $O(n)$  in the size of the input – now line segments instead of just points!



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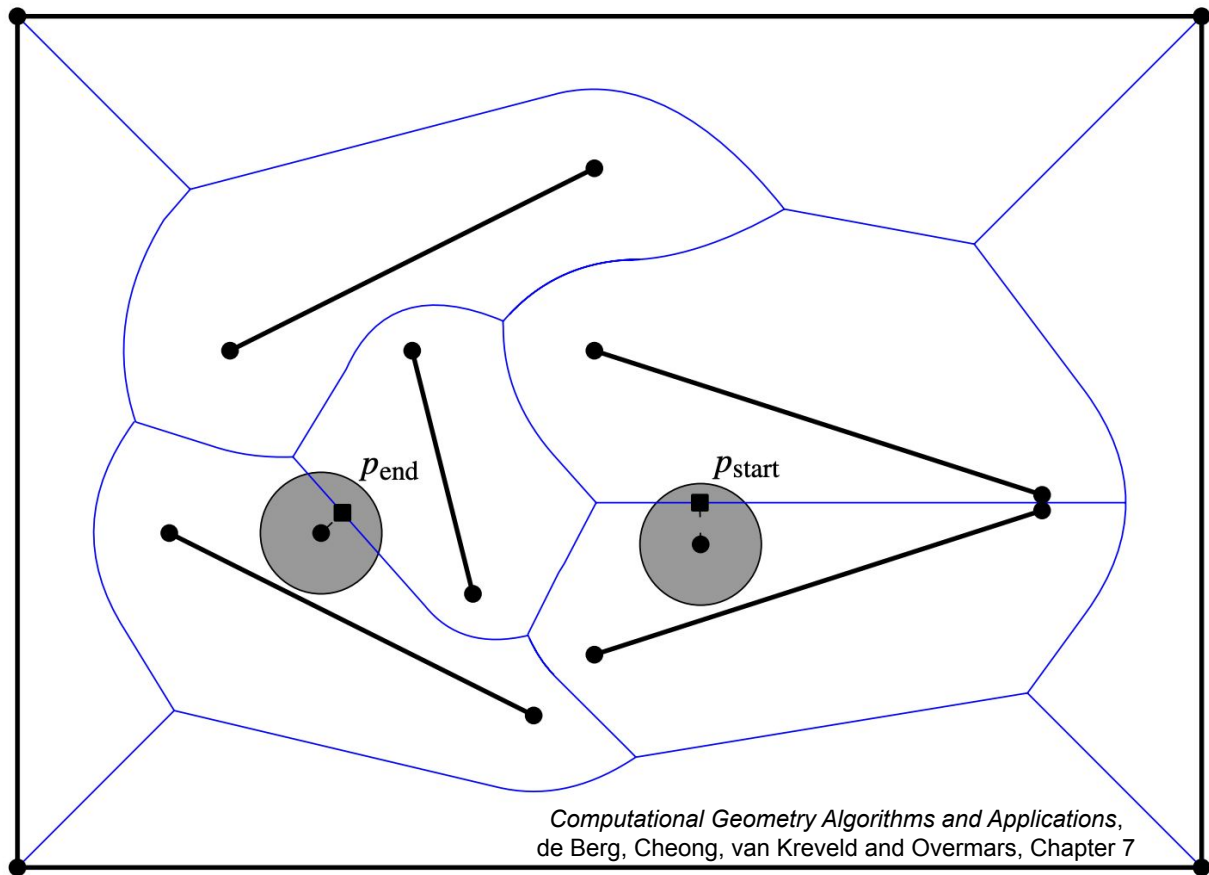


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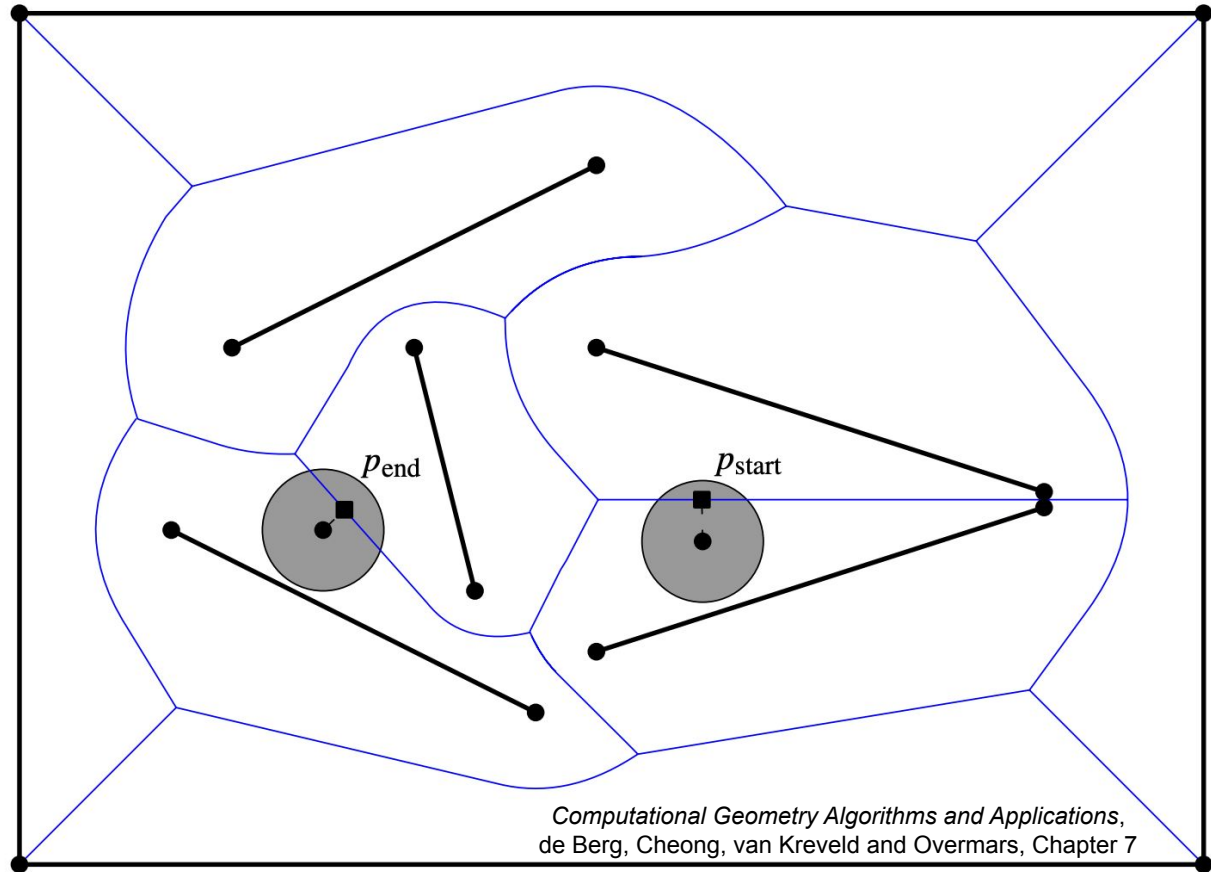
# Finished Voronoi Diagram of Line Segments

- Finished diagram has parabolic curved segments
- But is still  $O(n)$  in complexity - (# of segments)
- And can be computed in  $O(n \log n)$
- *But why is this useful?*



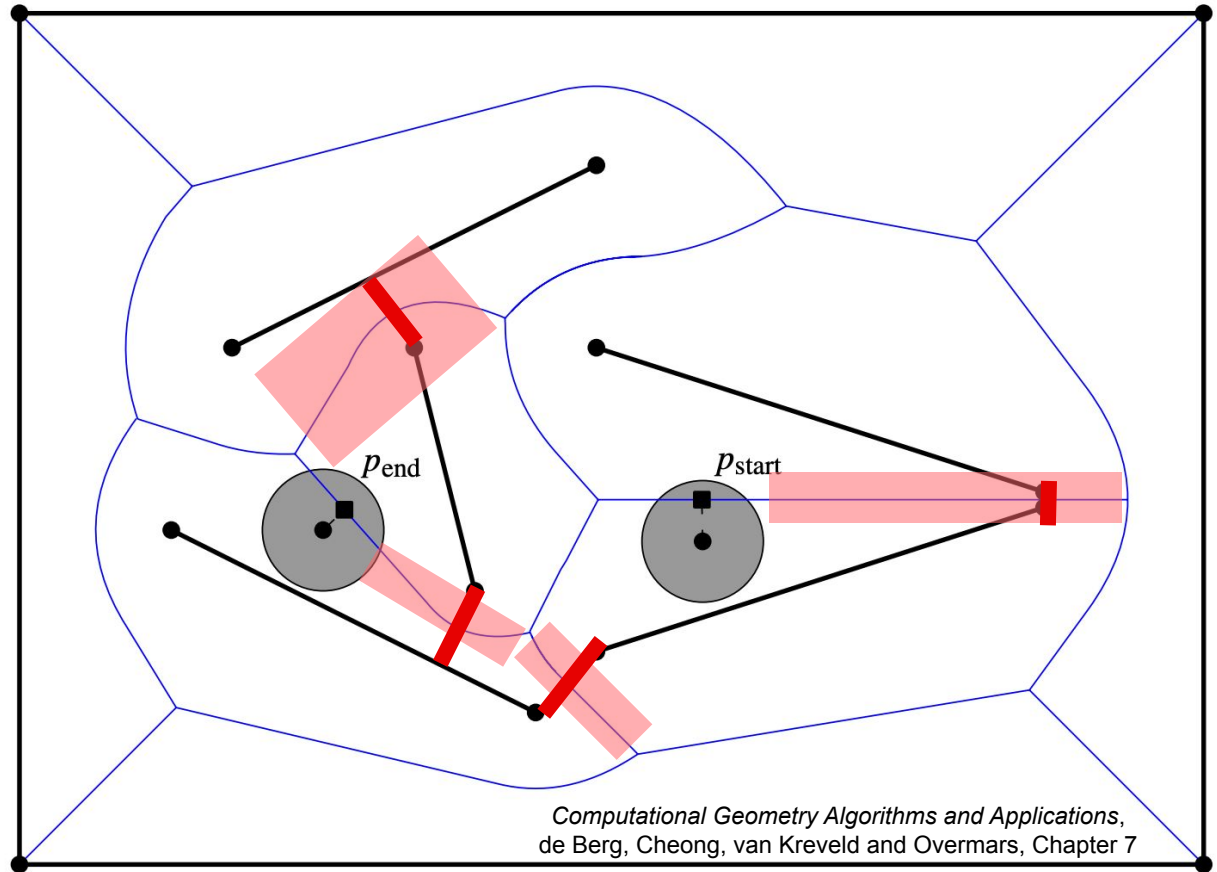
# Application: Robotics & Motion Planning

- Let's move a circular/disk robot from the start position to the end position.
- Step 1: Project the robot center to the closest Voronoi edge (line segment or parabolic curve)



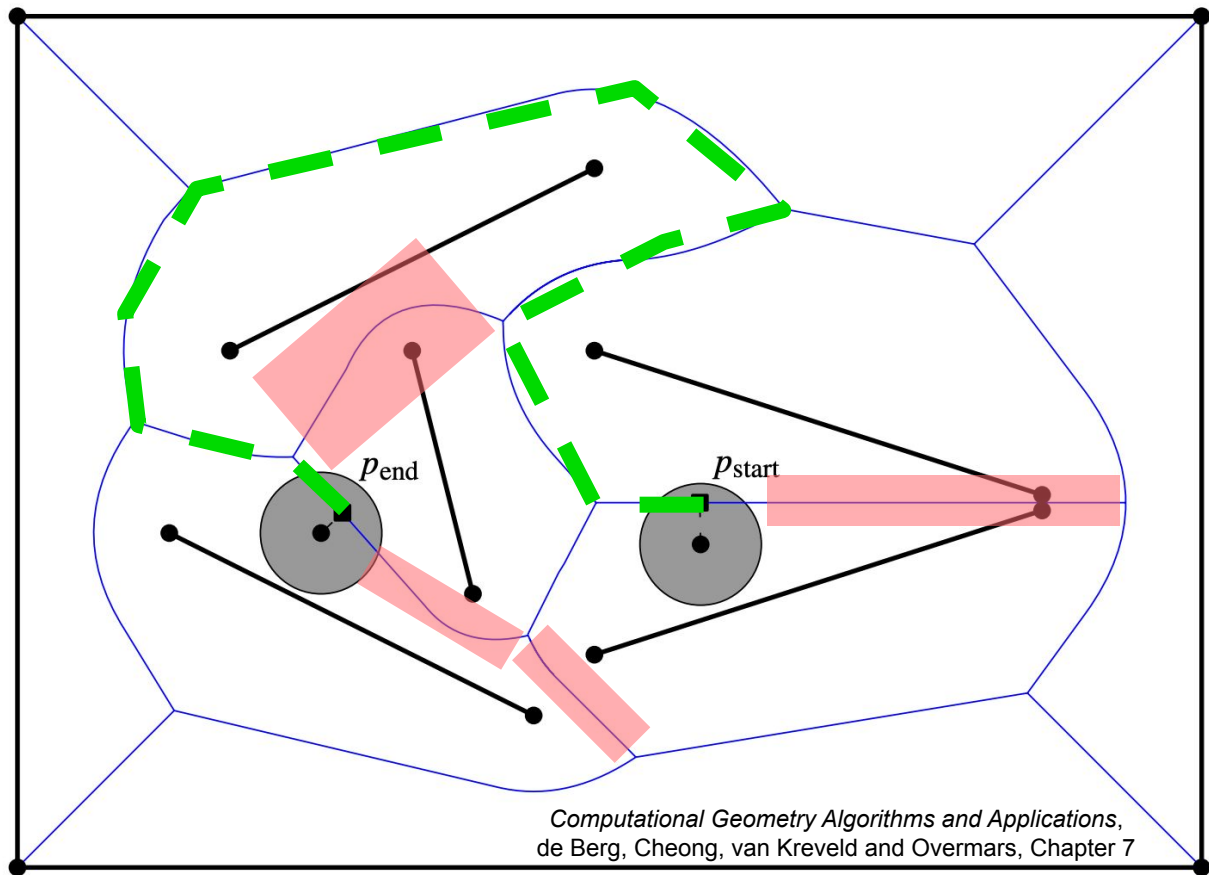
# Application: Robotics & Motion Planning

- Step 1: Project the robot center to the closest Voronoi edge (line segment or parabolic curve)
- Step 2: Remove edges from the diagram graph with smallest distance to segment  $<$  radius.



# Application: Robotics & Motion Planning

- Step 2: Remove edges from the diagram graph with smallest distance to segment  $<$  radius.
- Step 3: Search the remaining graph for a connected path from start to end.





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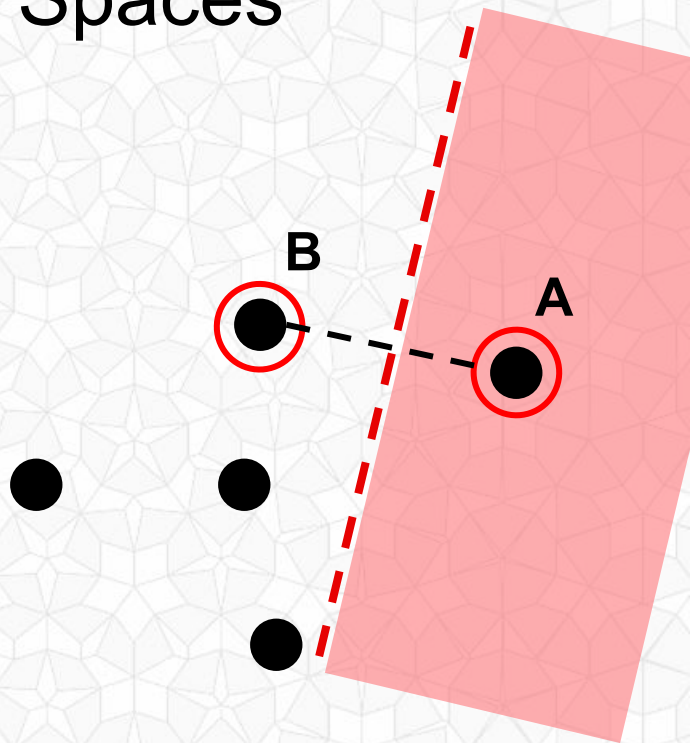
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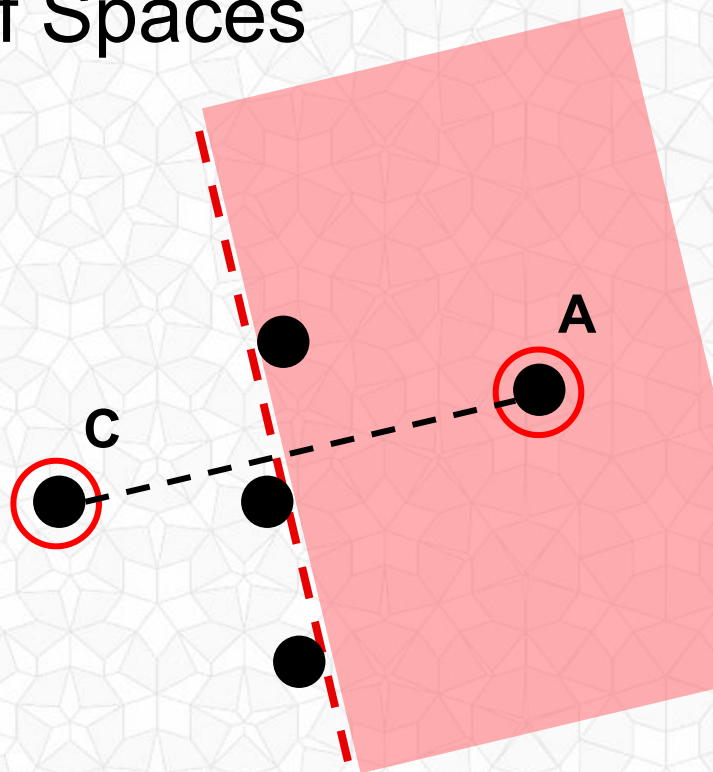
# Voronoi Cell: Intersection of Half Spaces

- All points that lie on one side of the perpendicular bisector,
- Are the half-space of points that will chose site A over site B because site A is closer than site B.



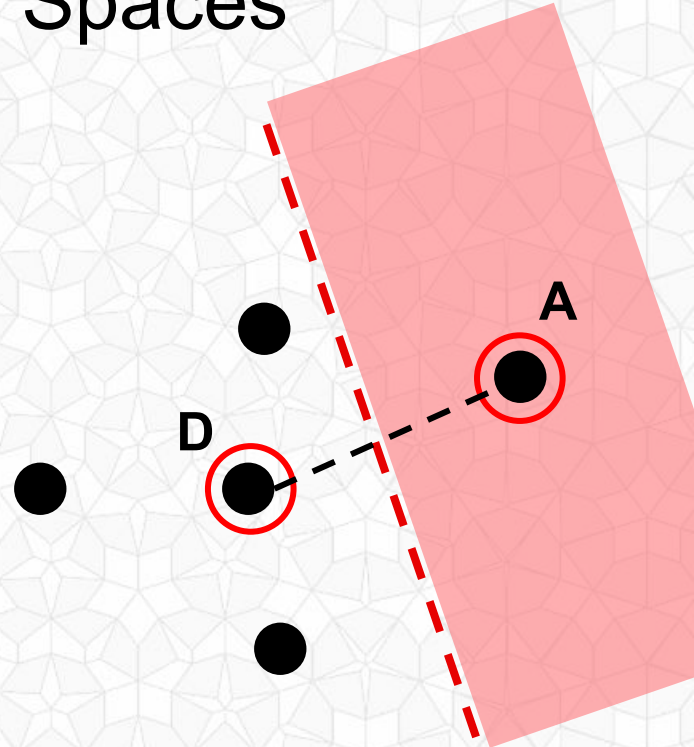
# Voronoi Cell: Intersection of Half Spaces

- All points that lie on one side of the perpendicular bisector,
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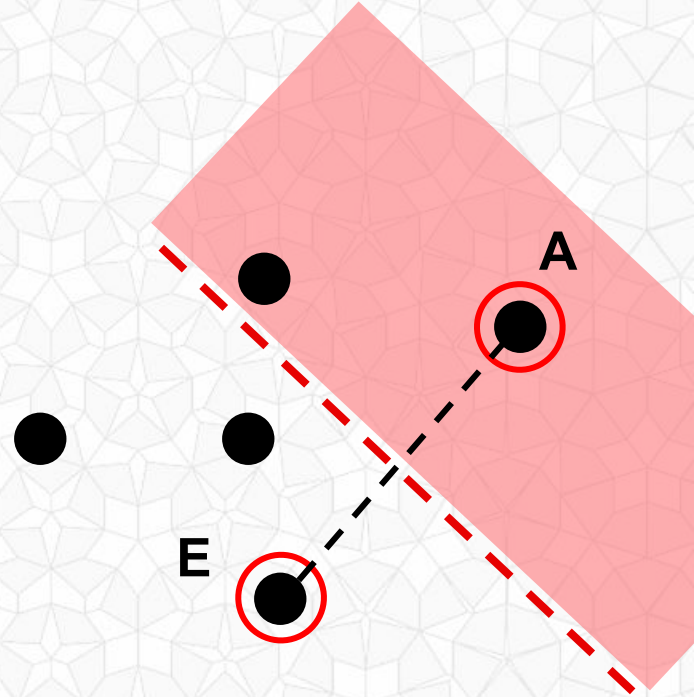
# Observation: Intersection of Half Spaces

- All points that lie on one side of the perpendicular bisector,
- Are the half-space of points that will chose site A over site D because site A is closer than site D.



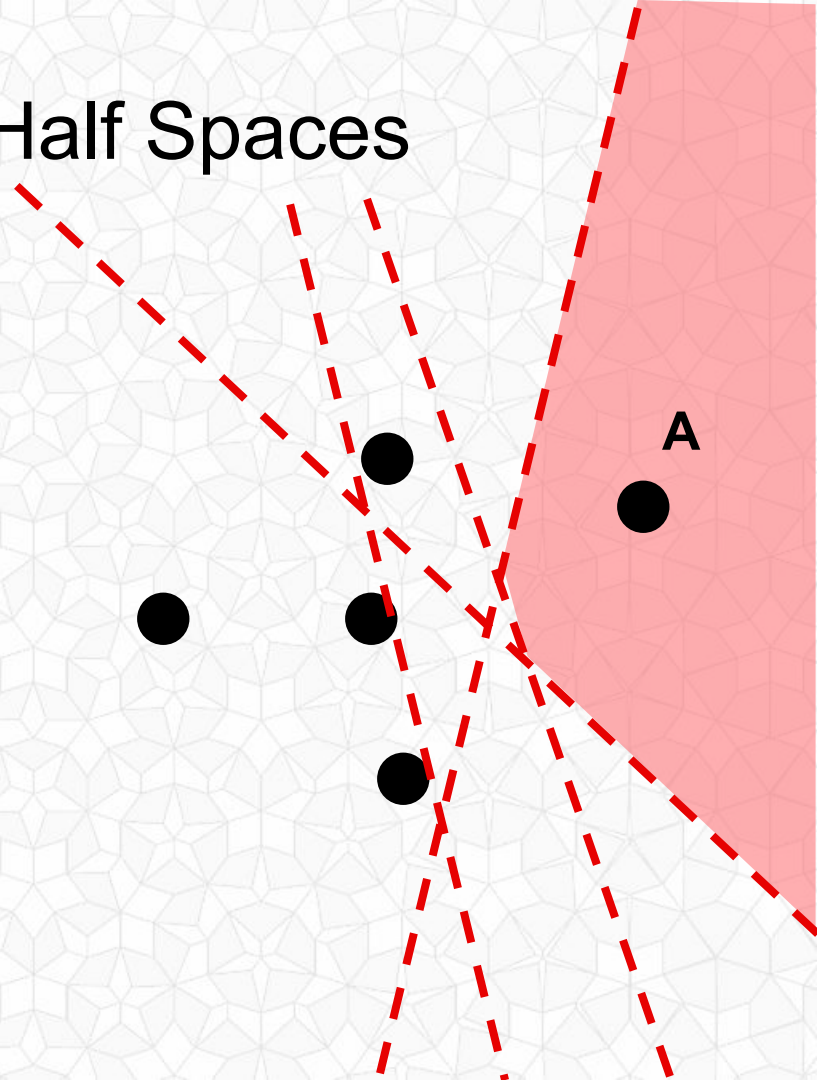
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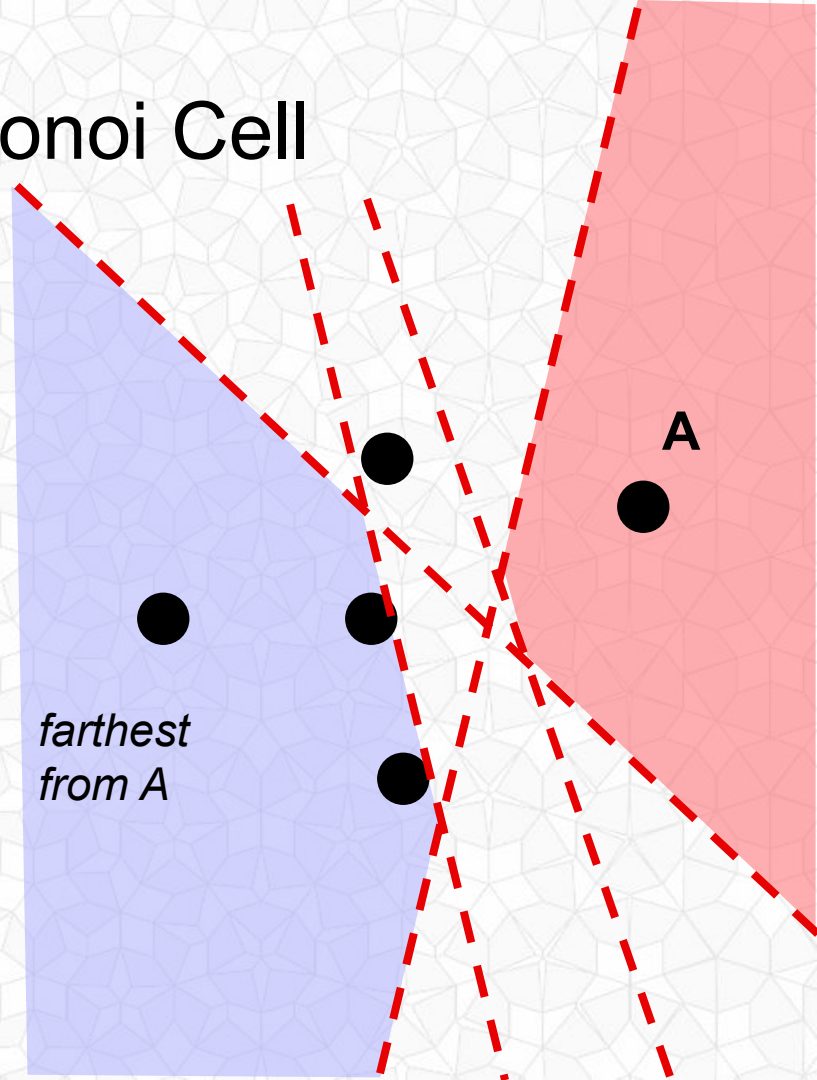
# Voronoi Cell: Intersection of Half Spaces

- The intersection of these half-spaces is the Voronoi Cell for  $A$  – *all points that choose  $A$  as their closest Voronoi site.*



# Definition: Farthest Point Voronoi Cell

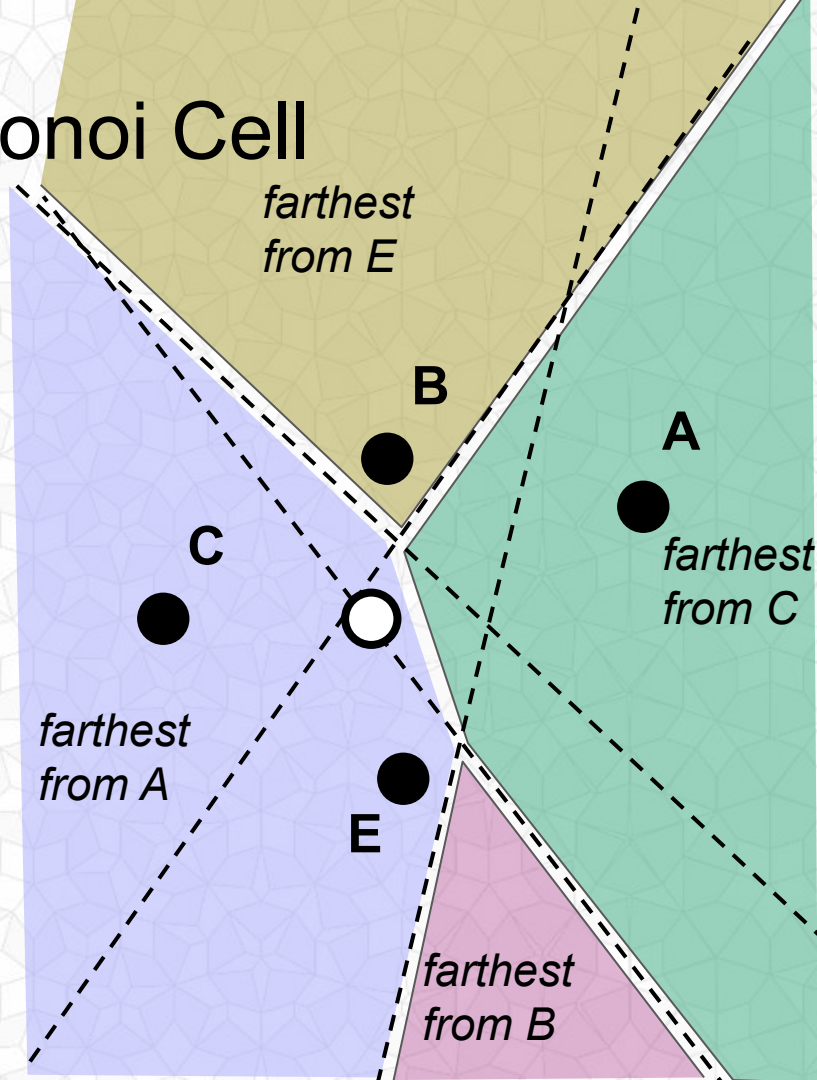
- The intersection of these half-spaces is the Voronoi Cell for  $A$  – all points that choose  $A$  as their closest Voronoi site.
- The intersection of the opposite half-space is the Farthest Point Voronoi Cell - all points that indicate that  $A$  is their furthest Voronoi site.





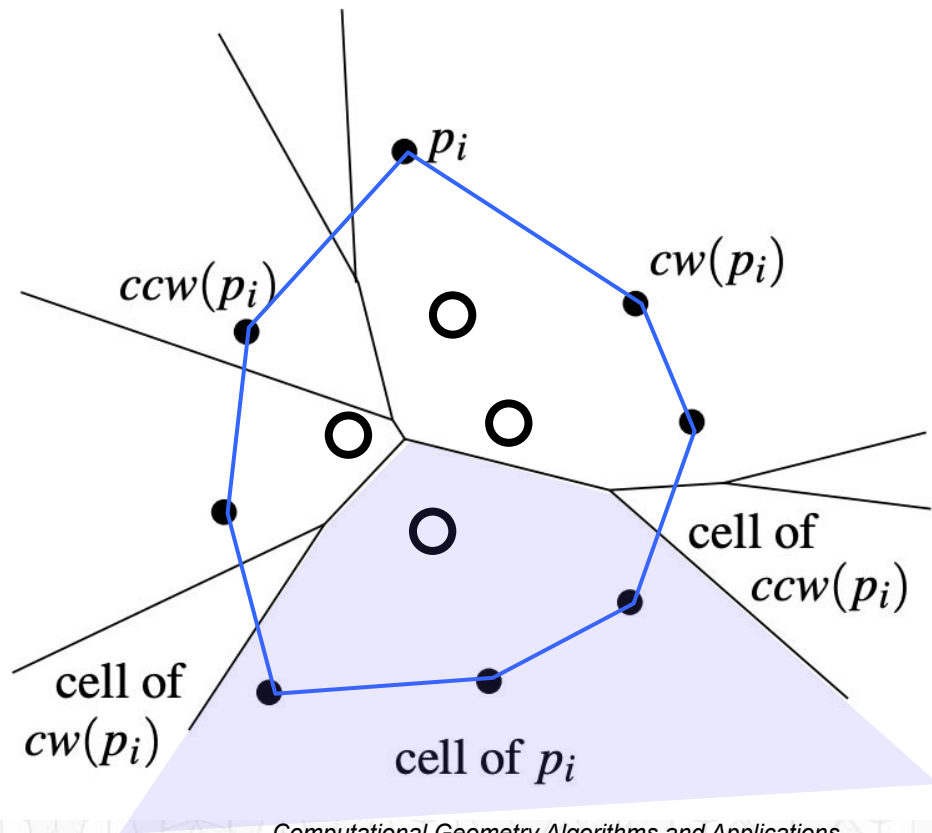
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# Farthest-Point Voronoi Diagram

- Observation: Only sites on the convex hull will have a cell in the farthest point diagram.
- Observation: All farthest-point cells are *unbounded*.
- Observation: The diagram is a tree – no cycles!  
*If there were a cycle, that would mean we had a bounded cell.*



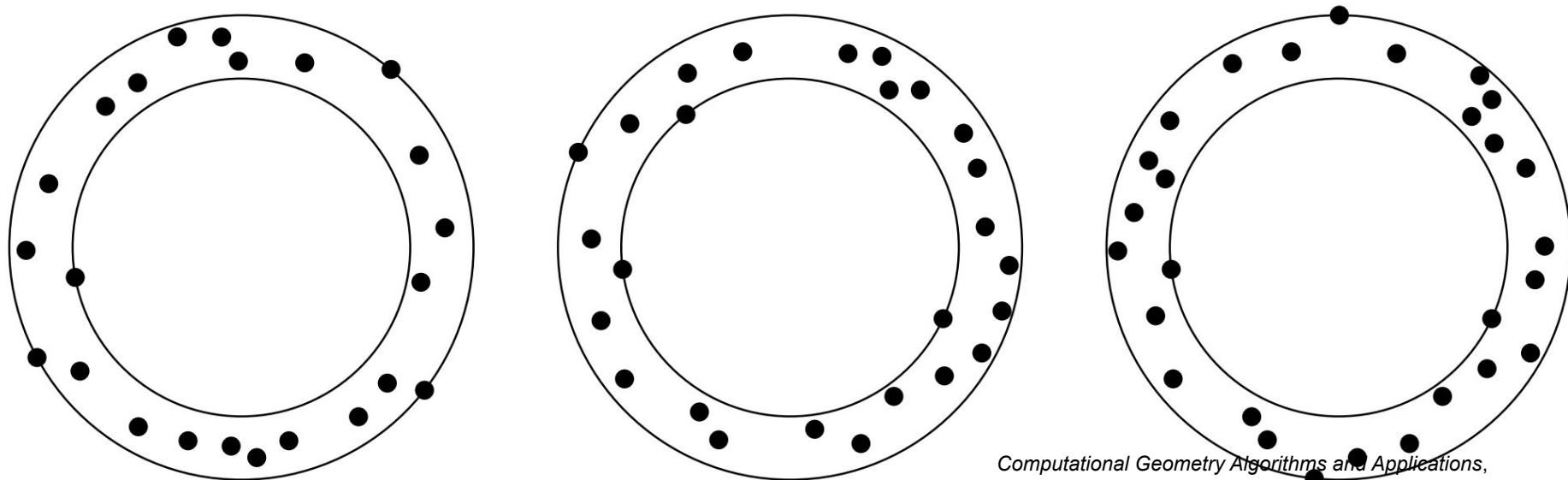
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# Finding the Smallest-Width Annulus

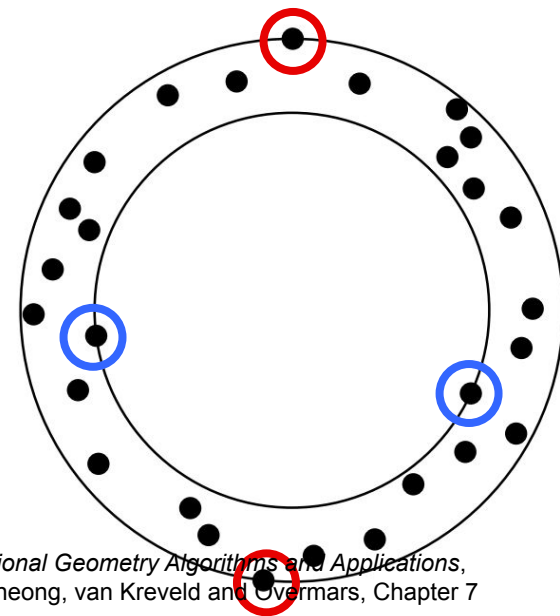
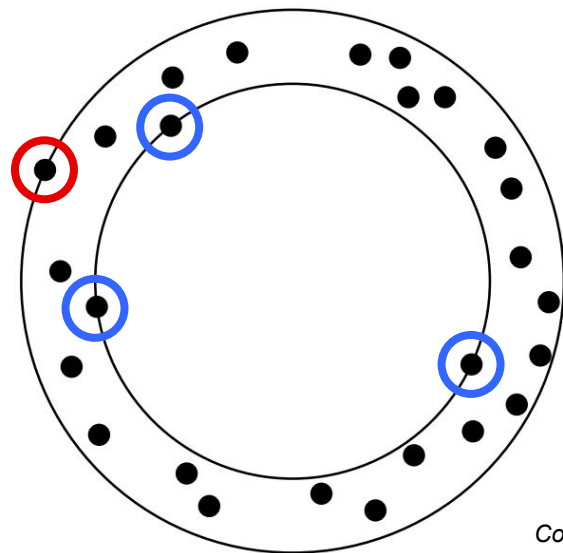
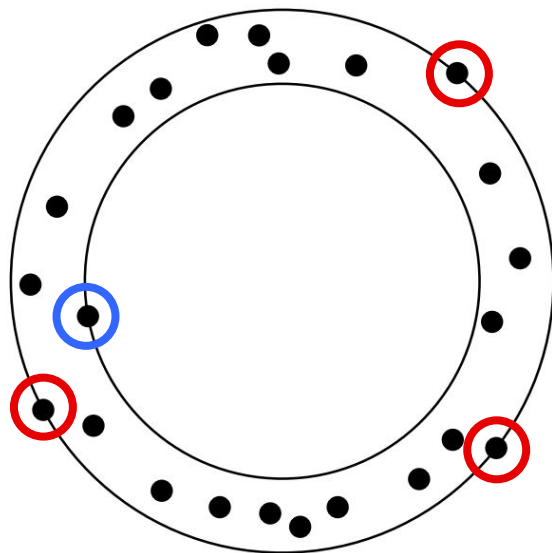
- Manufacturing Application:

*This object is supposed to be perfectly round (spherical), given precise measurements of the actual object, what are the error bounds?*



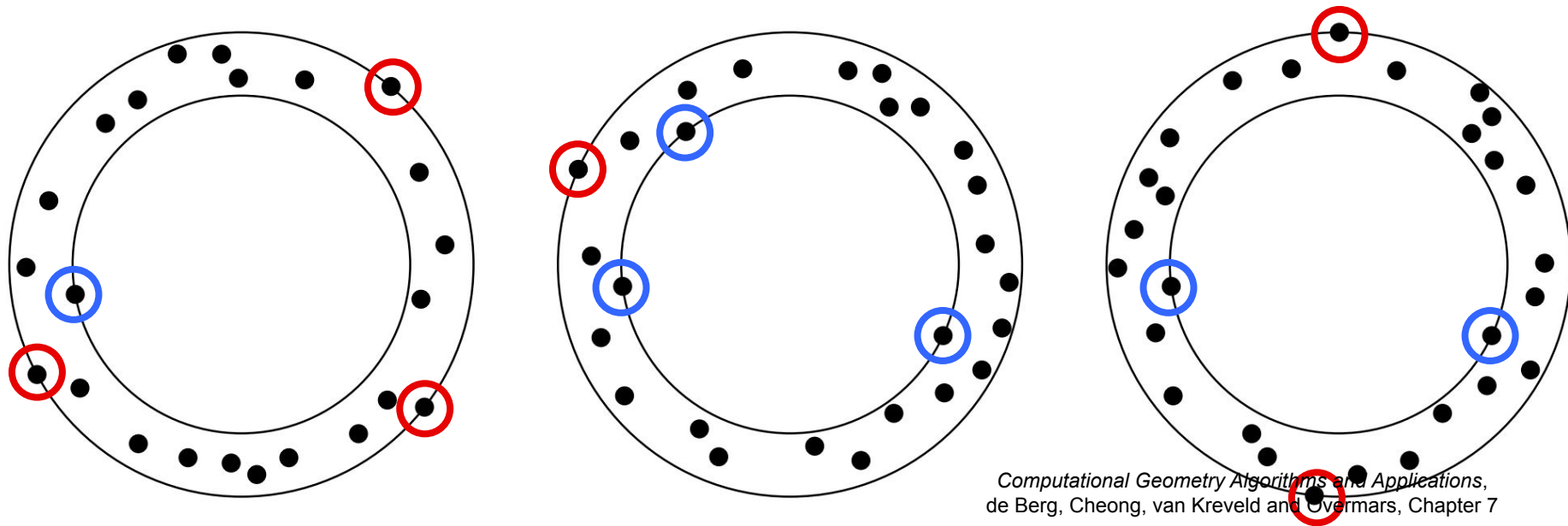
# Finding the Smallest-Width Annulus

- 3 points on the outer circle, 1 point on the inner circle
- 1 point on the outer circle, 3 points on the inner circle
- 2 points on the outer circle, 2 points on the inner circle



# Finding the Smallest-Width Annulus

- Easy to compute once we know the center  
(it is the center of both the inner & outer circle)
- *What points might be the center? Any point on the plane?*

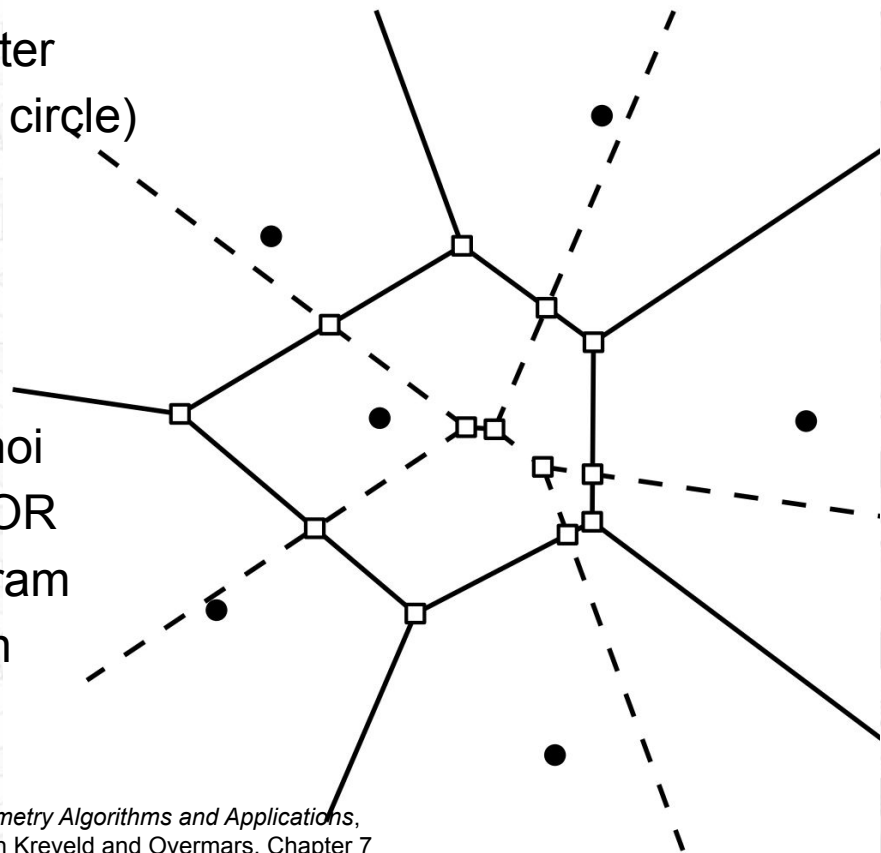


# Finding the Smallest-Width Annulus

- Easy to compute once we know the center (it is the center of both the inner & outer circle)
- *What points might be the center?*

It must be:

- A vertex of the Voronoi Diagram (equally close to 3 sites) OR
- A vertex of the Farthest Point Voronoi Diagram (equally far from 3 sites) OR
- An intersection of the Voronoi Diagram and Farthest Point Voronoi Diagram (equally close to 2 sites AND equally far from 2 sites)

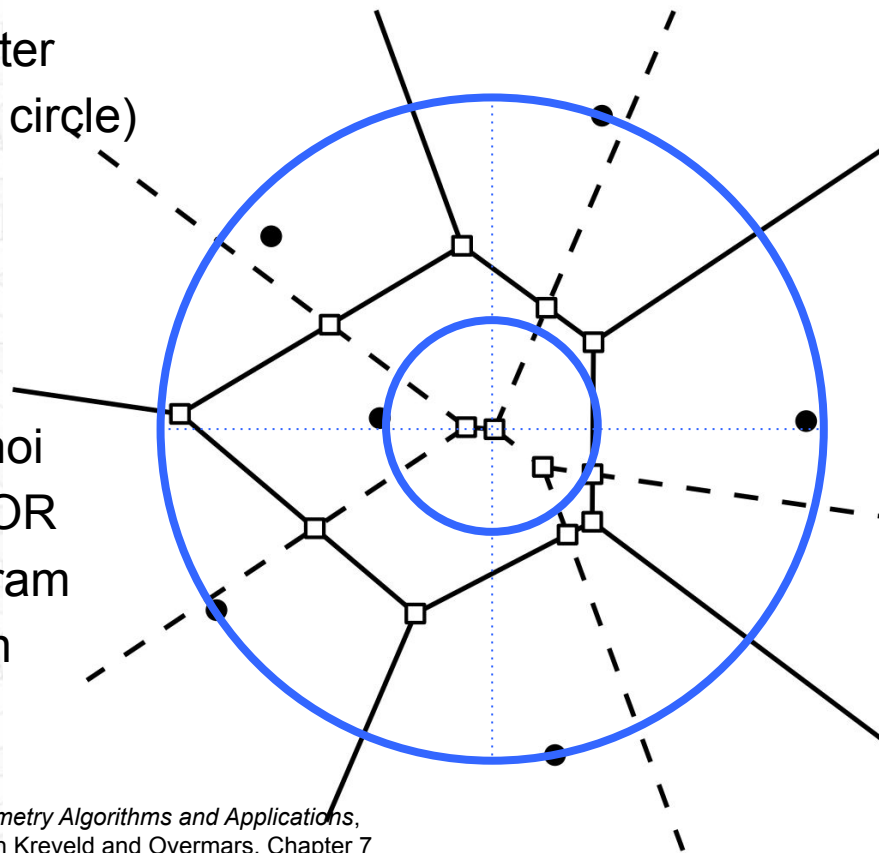


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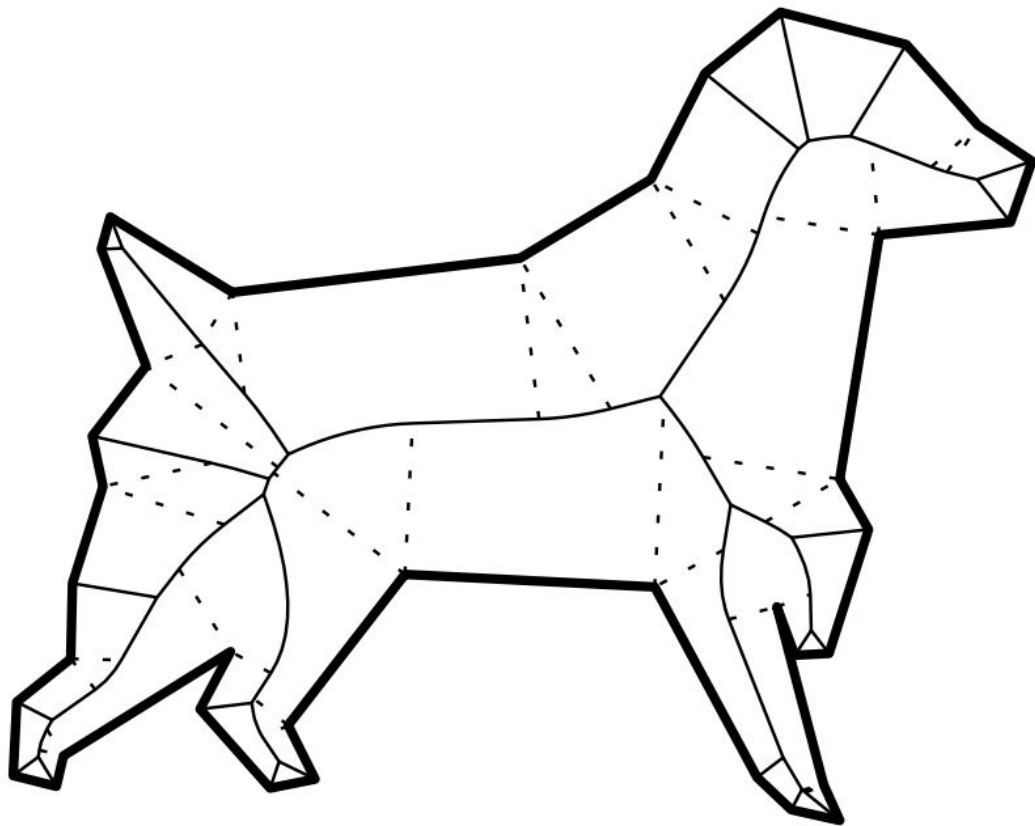


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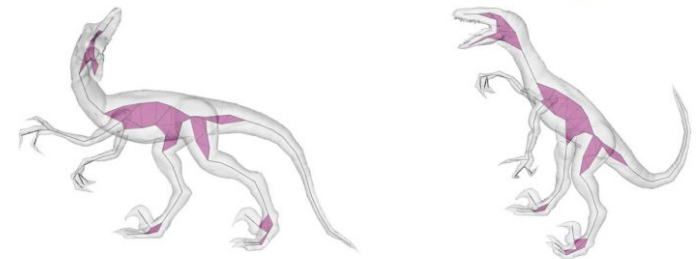
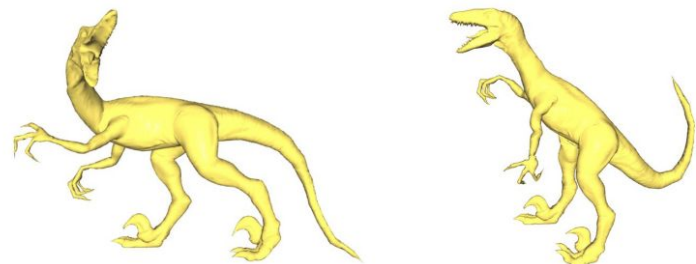
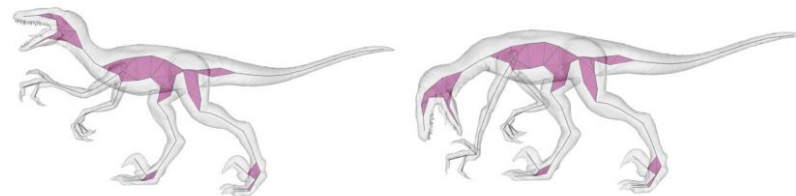
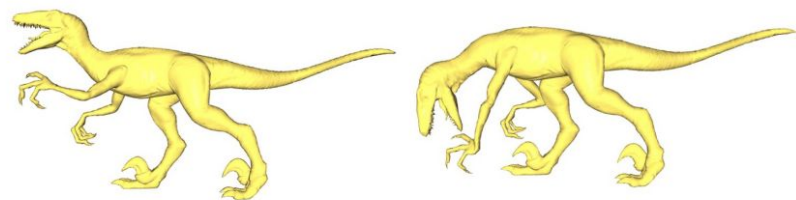
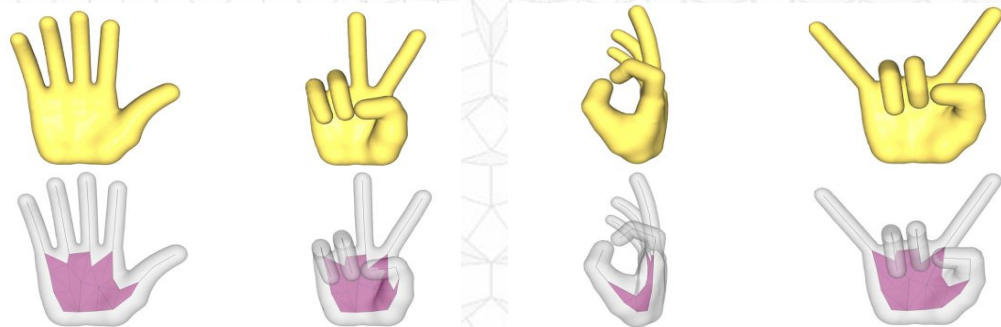
# Medial Axis - Voronoi Diagram of Simple Polygon

- a.k.a. Skeleton
- Applications to:
  - Shape Analysis
  - Deformation



# Application of Medial Axis

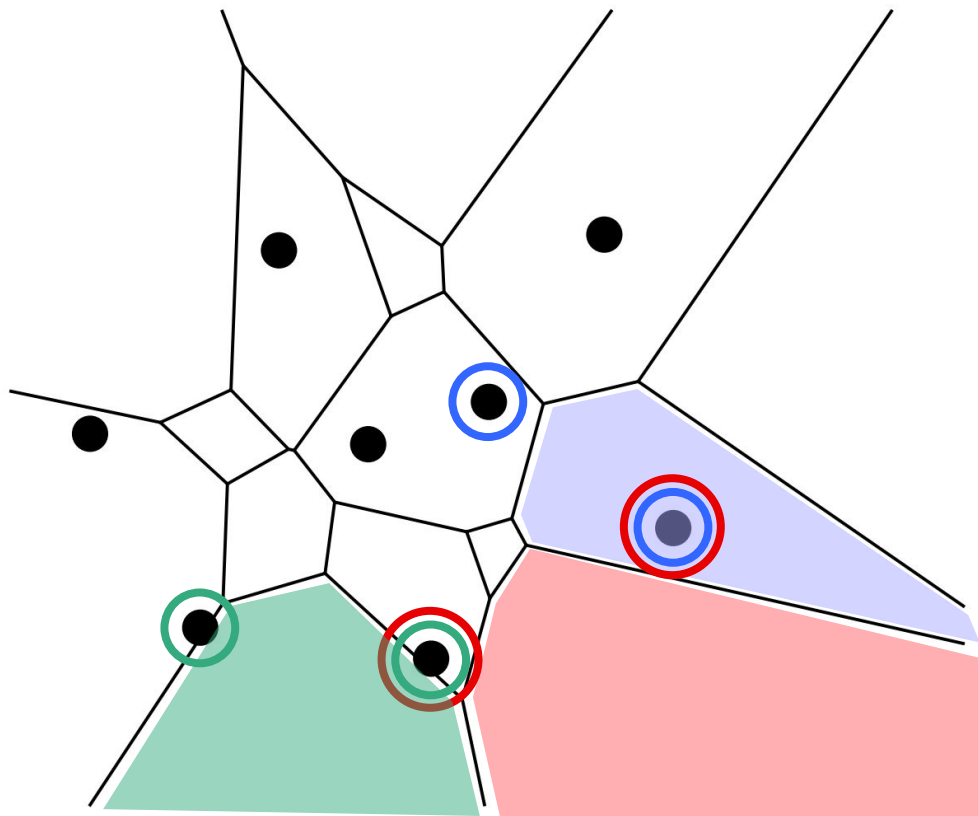
- Placing the skeleton inside of a 3D object
- Automated Rigging



“Medial-Axis-Driven Shape Deformation with Volume Preservation” Lan, Yao, Huang, Guo, Visual Computer 2017

# Higher-Order Voronoi / k-Closest Sites

- For example,  $k = 2$ ...
- Subdivide the plane into regions that have the same closest *and* second closest sites



# Outline for Today

- Homework 4 Posted soon
- Last Time: Line Sweep construction of Voronoi Diagram
- Closest Point to a Line Segment
- Voronoi Diagram of Line Segments
- Motivation Application: Robotic Motion Planning
- Farthest Point Voronoi Diagram
- Motivating Application: Smallest Annulus
- Medial Axis & Higher-Order Voronoi Diagrams
- **Next Time: Centroidal Voronoi Diagram & K-Means Clustering**