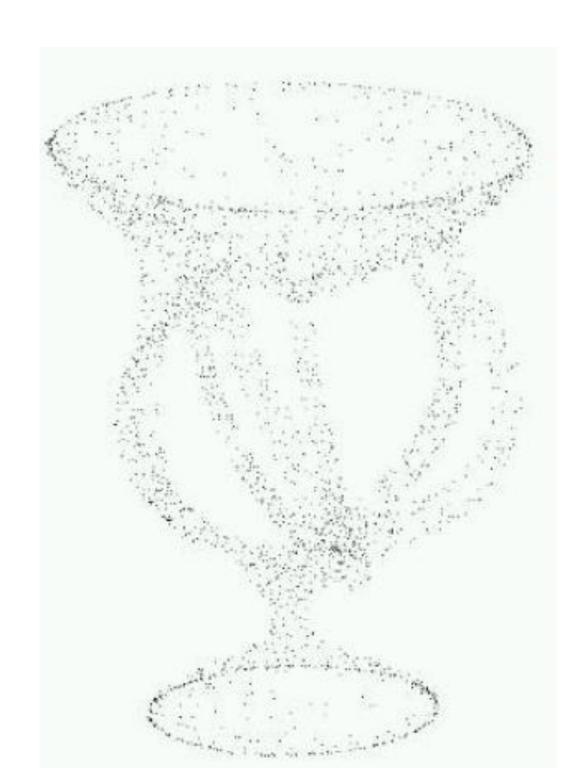
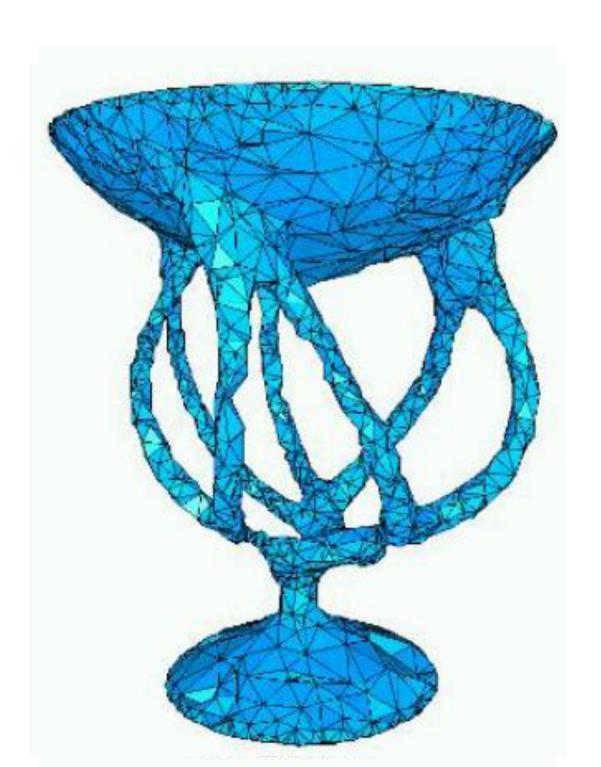
From points

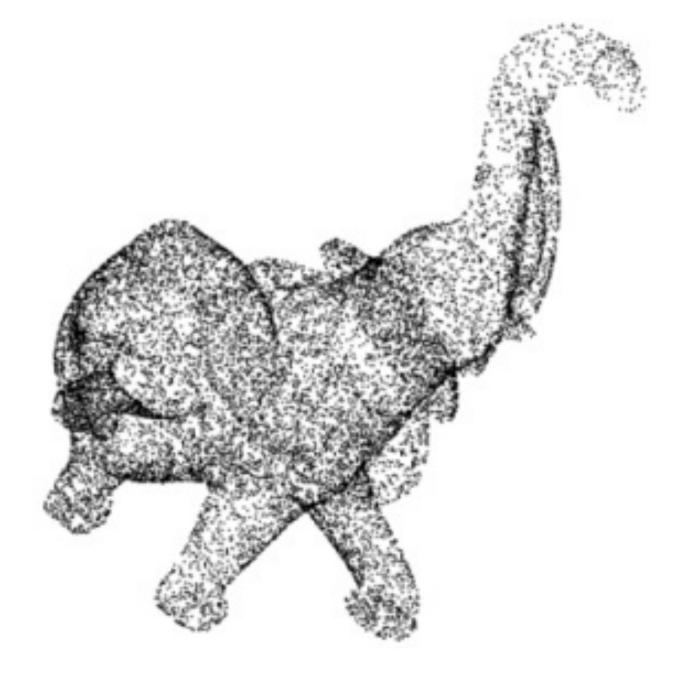


From points

to shape

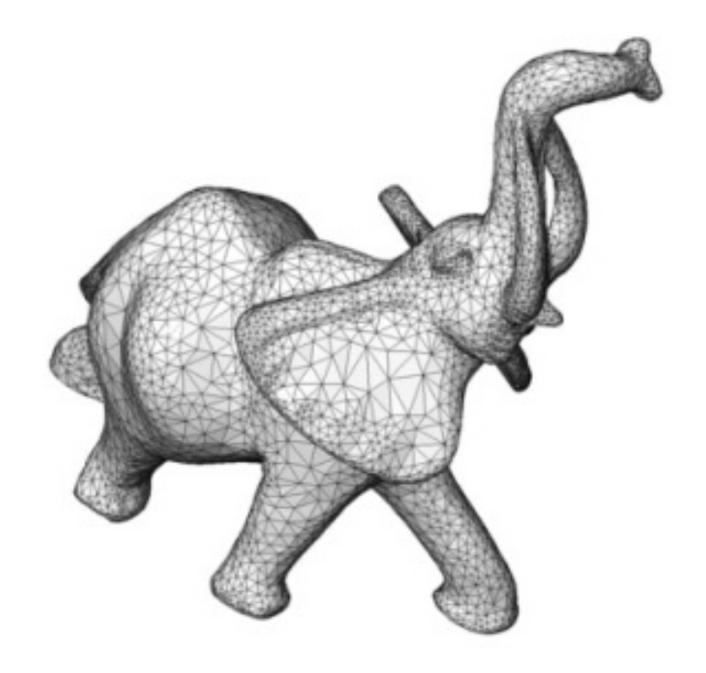


From points

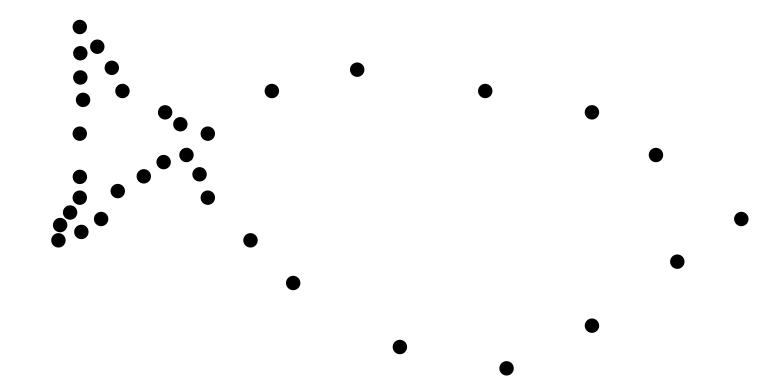


From points

to shape

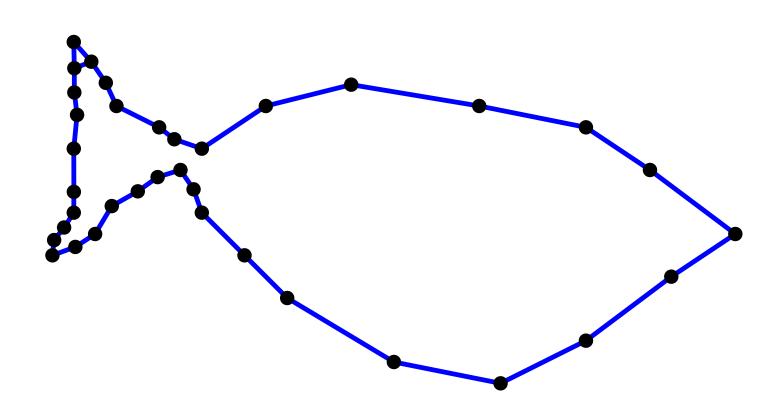


### From points



From points

to shape



Context

Delaunay is a good start

(wanted result ⊂ Delaunay)

Crust 2D

Algorithm

 $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ 

 $0.25 \text{ sample} \Rightarrow \text{crust} \subset \text{wanted result}$ 

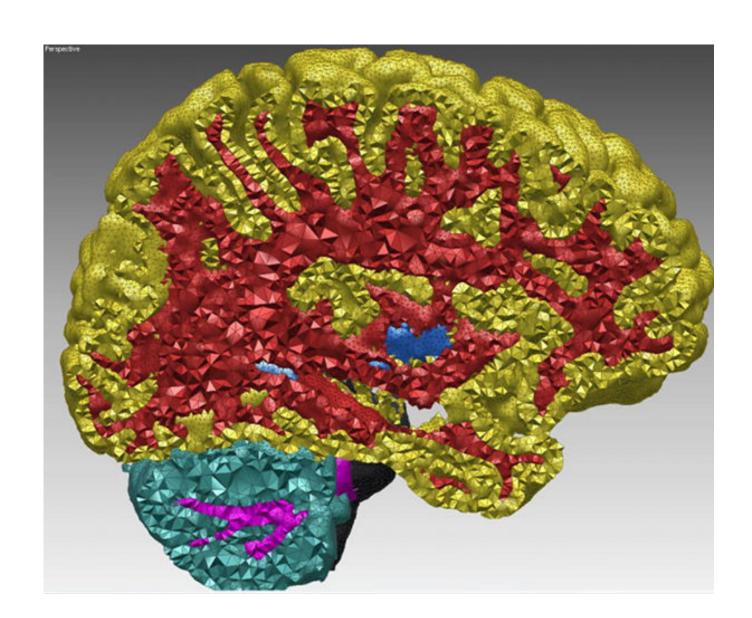
3D

Context

Sensor Point set (no structure or unknown)

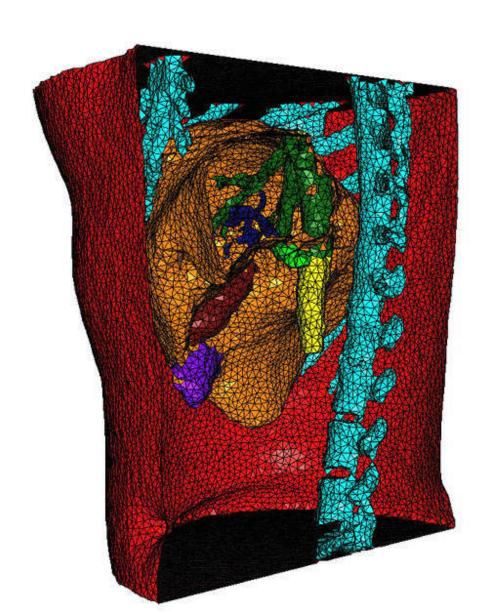
### Context

### Medical Images



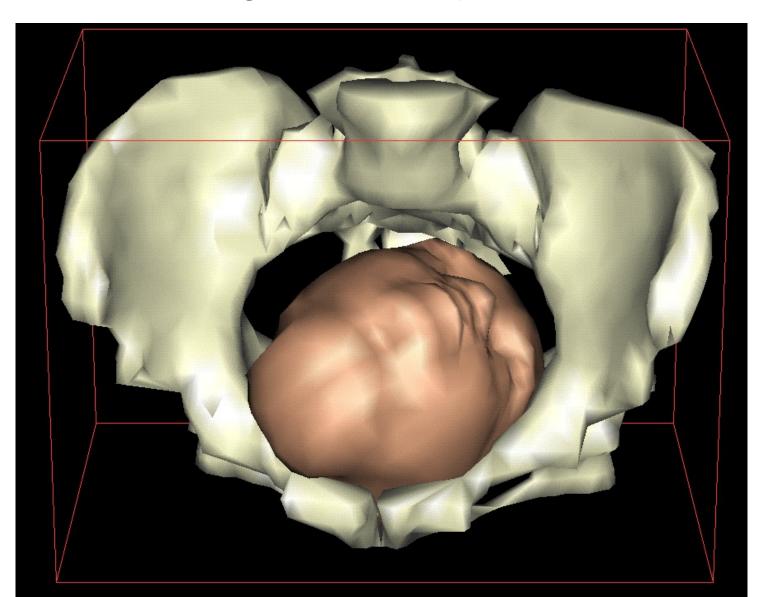
### Context

Medical Images



### Context

### Childbirth simulation



#### Context

Childbirth simulation

Surgery planning

Radiotherapy planing

**Endoscopy simulation** 

• • •

### Context

Sensor Point set (no structure or unknown)

### Scanner



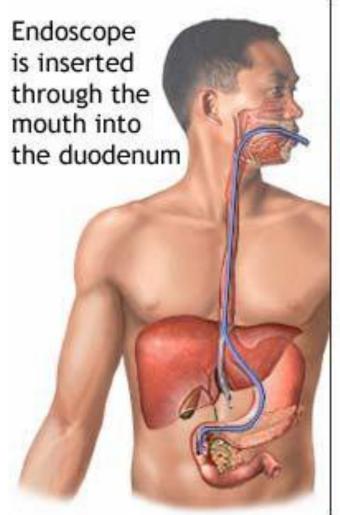
#### Context

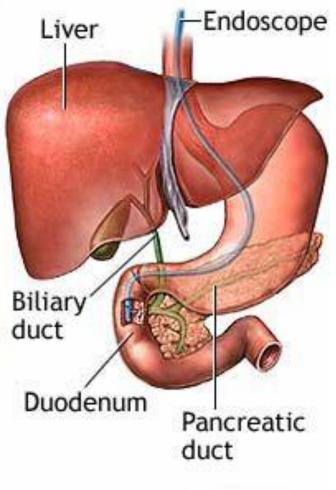


Scanner

Endoscope

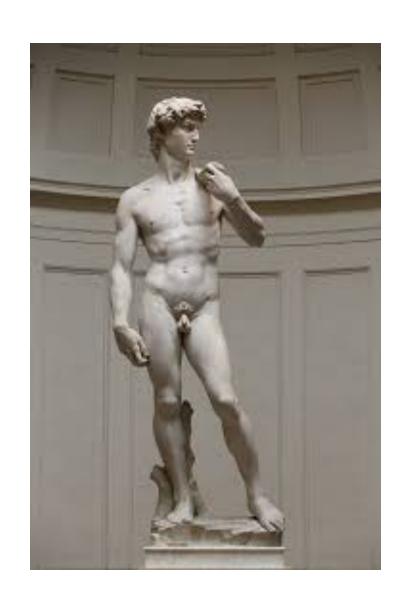






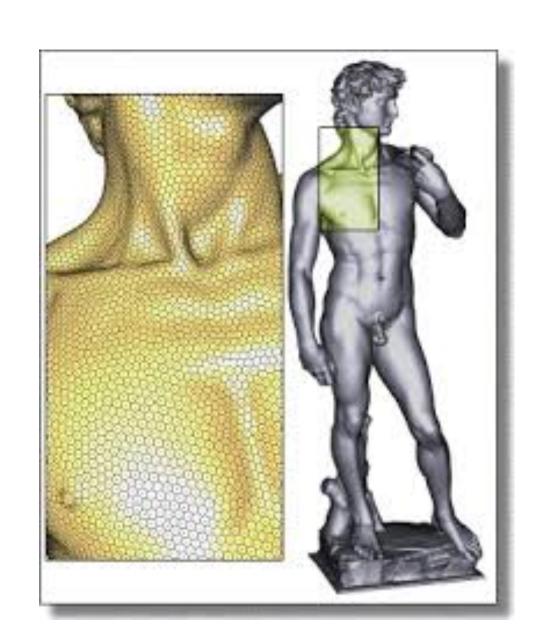
Context

Cultural heritage



### Context

Cultural heritage



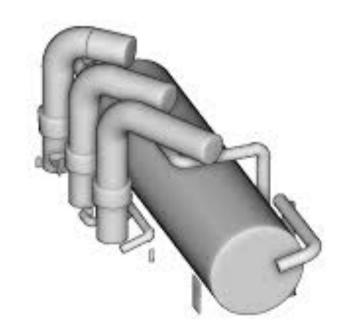






Context

Reverse engineering



#### Context

### Reverse engineering

Prototyping (3D print)

Quality control

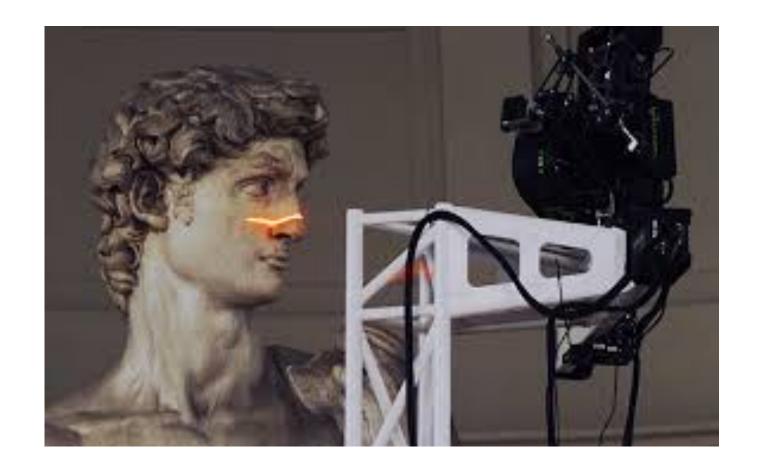


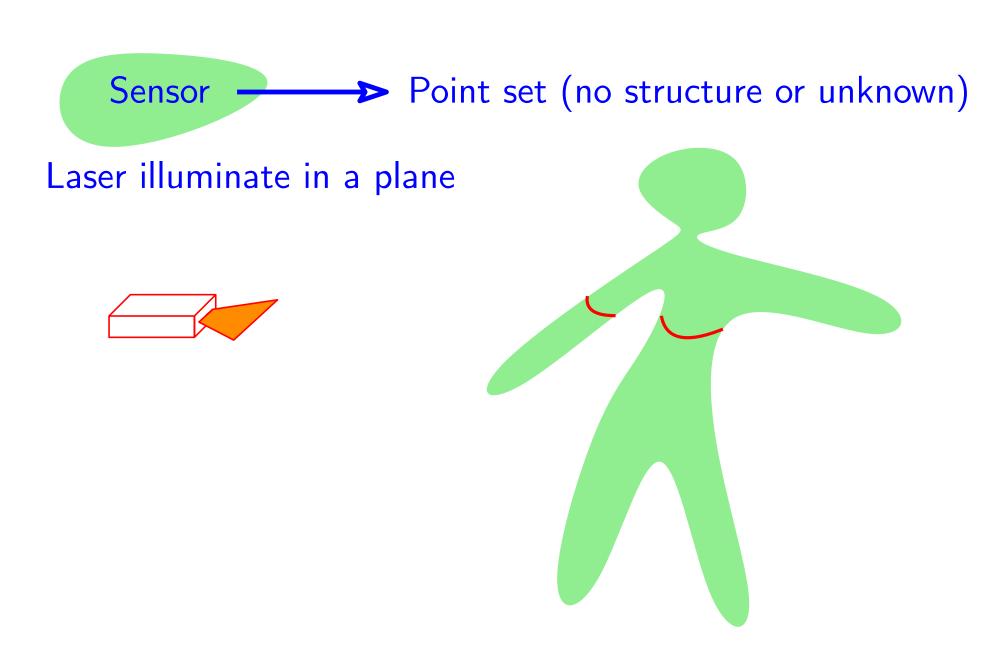


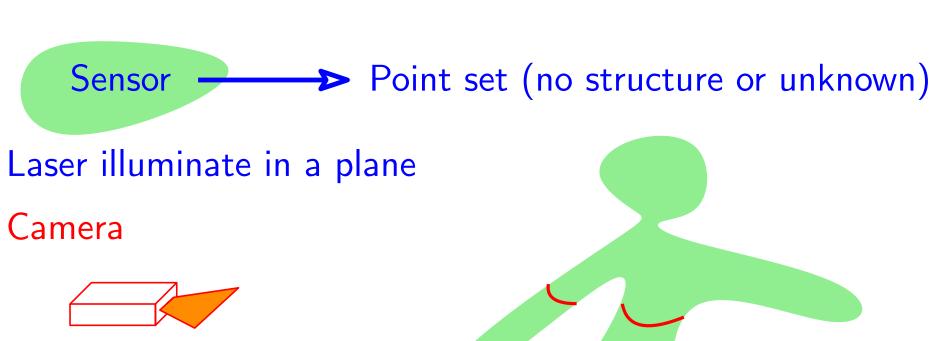


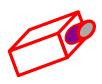
### Context

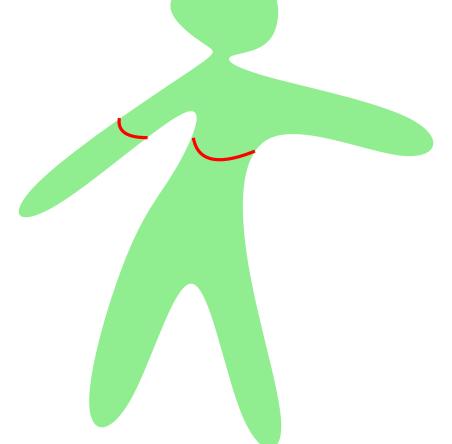
Sensor Point set (no structure or unknown)

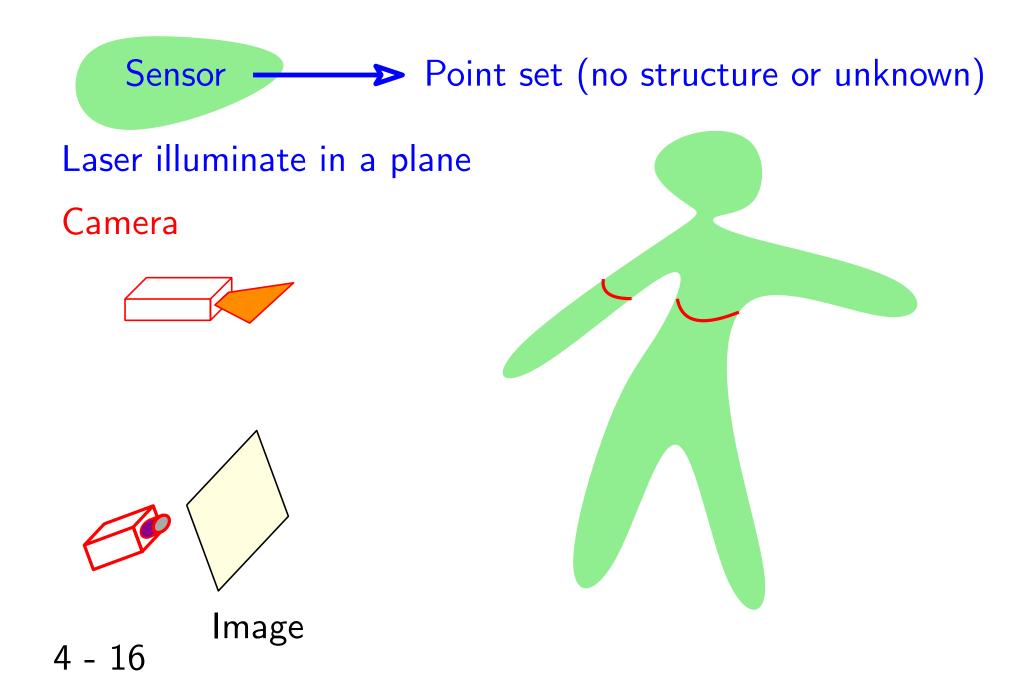


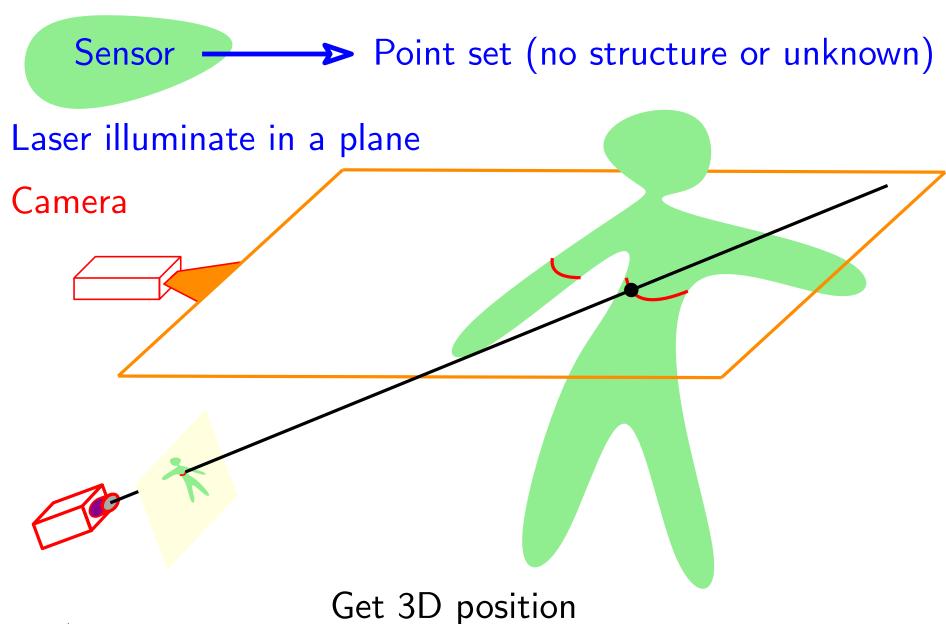






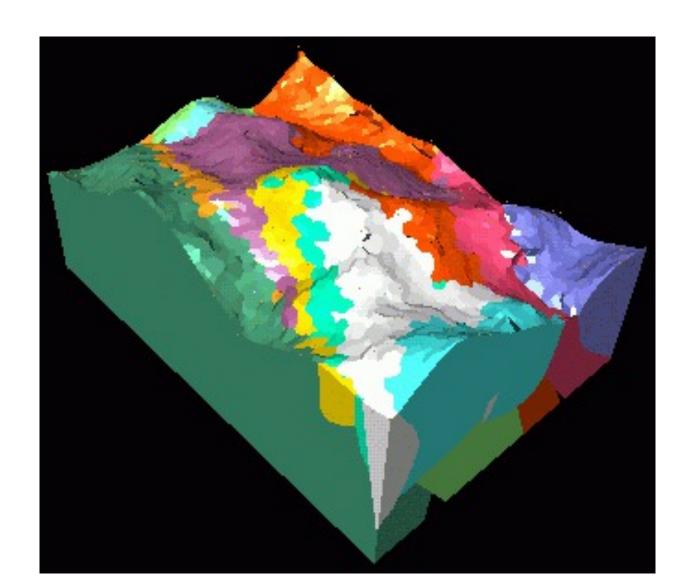






### Context

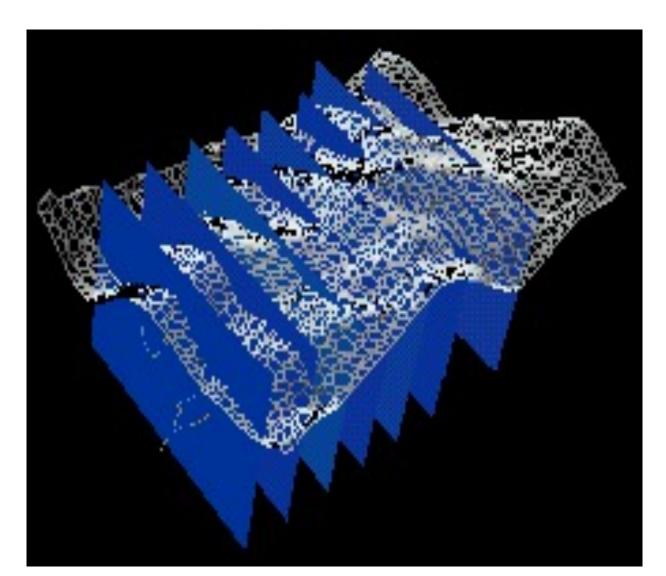
Geology



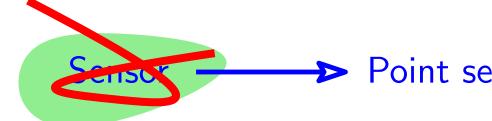
### Context

Sensor Point set (no structure or unknown)

Geology

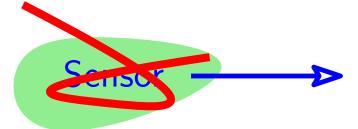


#### Context

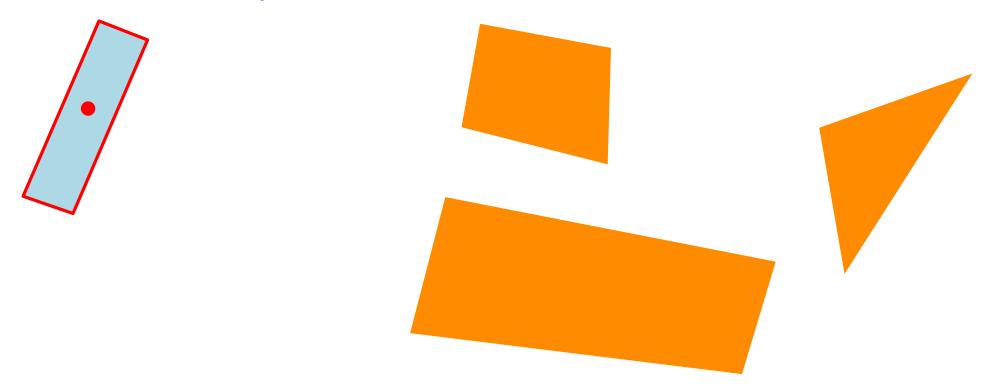


→ Point set (no structure or unknown)

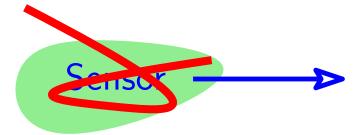
#### Context



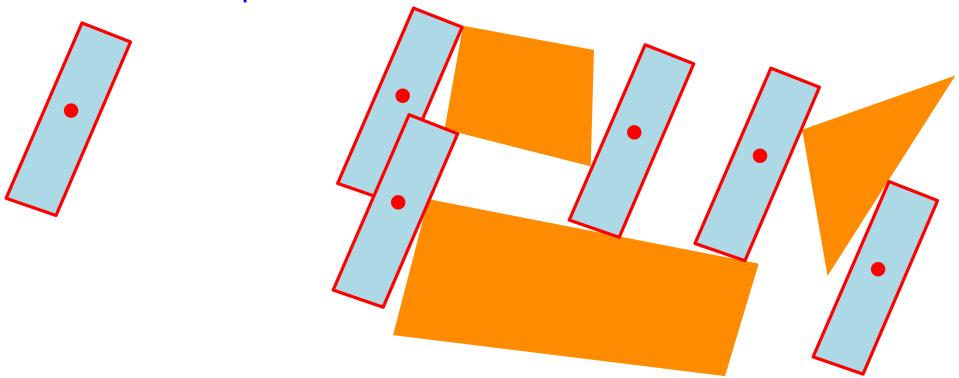
→ Point set (no structure or unknown)

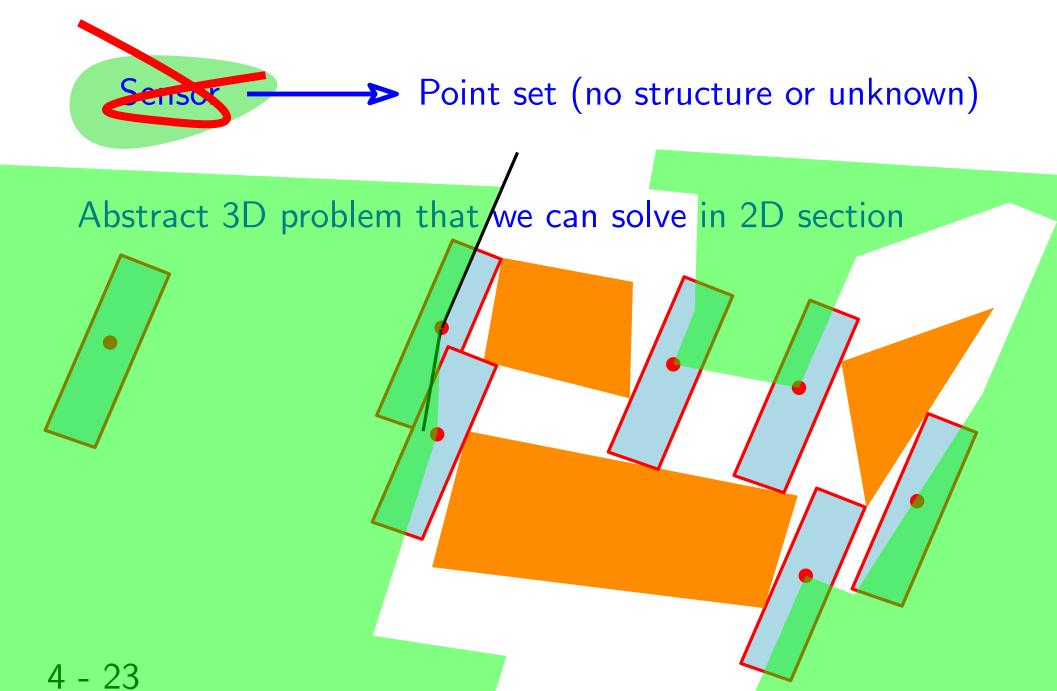


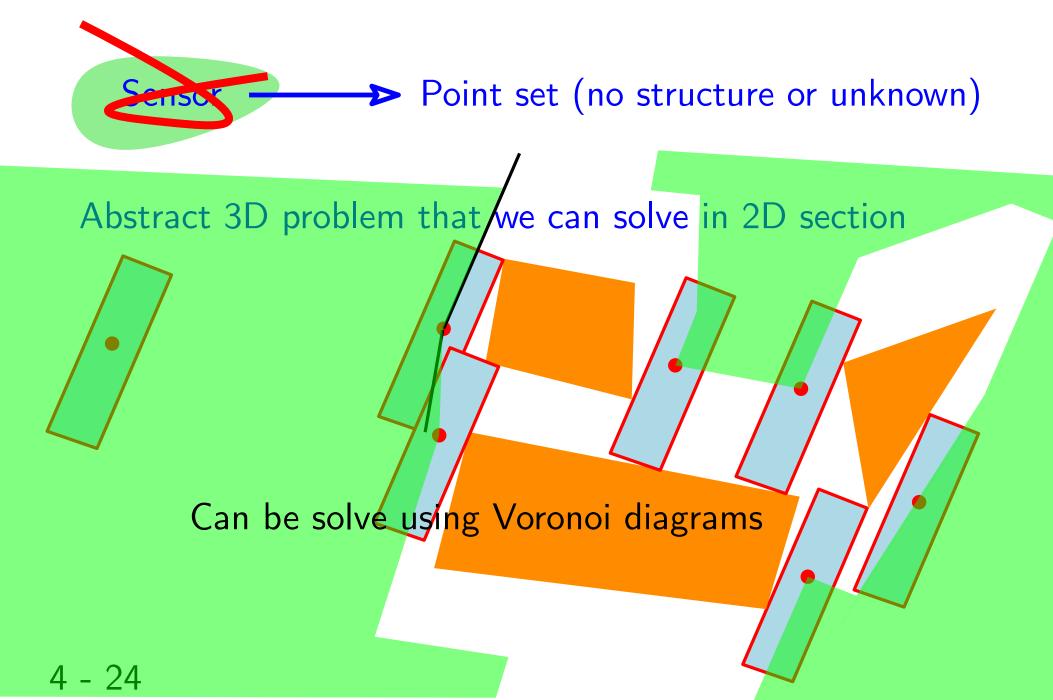
#### Context



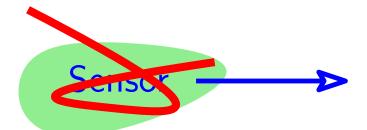
→ Point set (no structure or unknown)



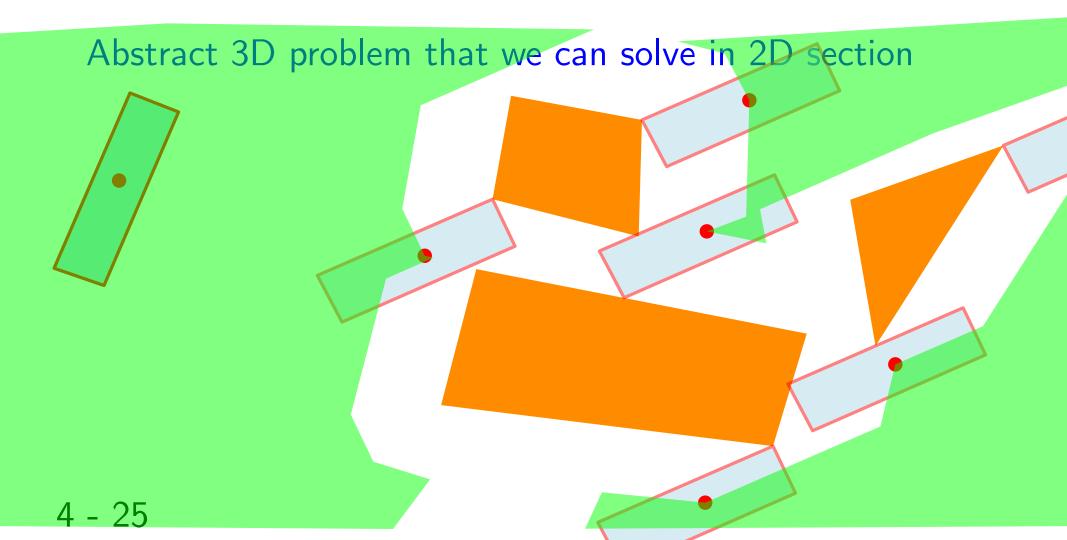




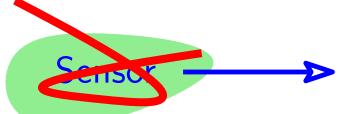
Context



→ Point set (no structure or unknown)



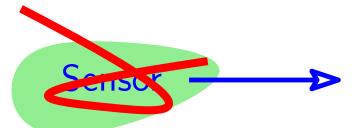
Context



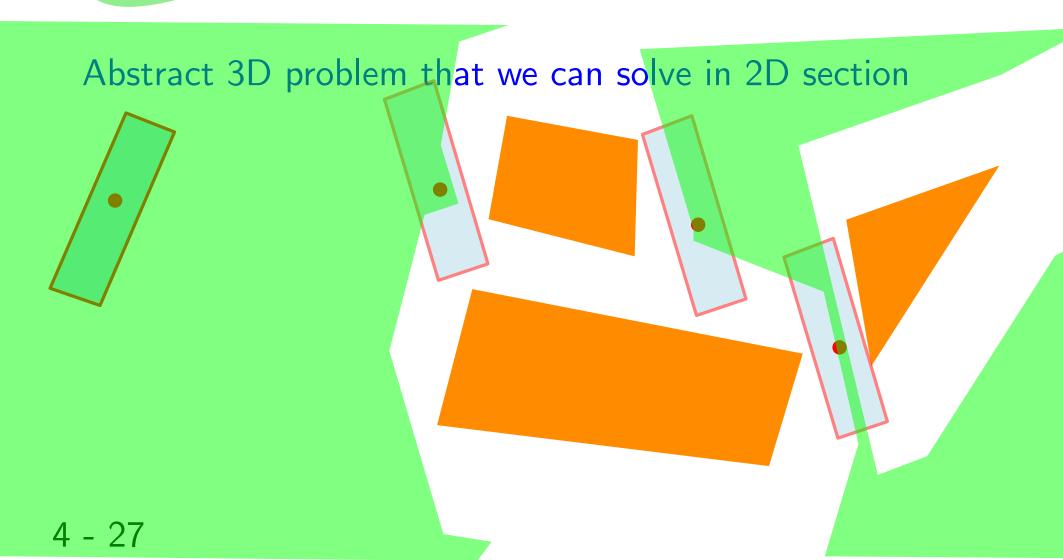
→ Point set (no structure or unknown)



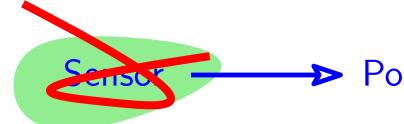
Context



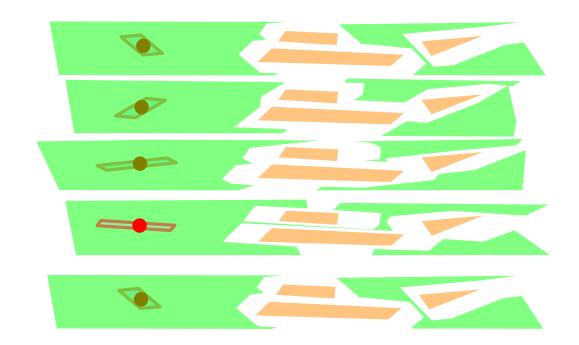
→ Point set (no structure or unknown)



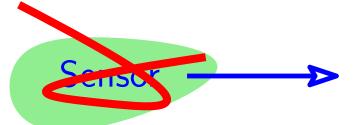
#### Context



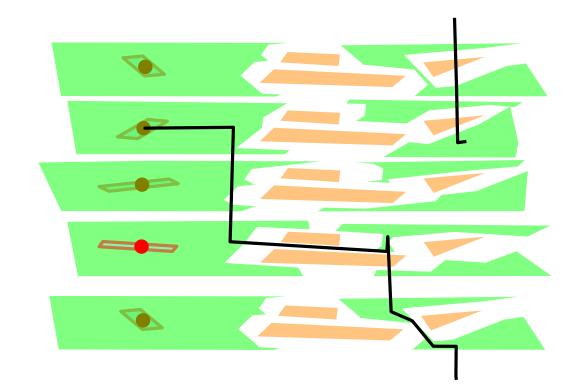
→ Point set (no structure or unknown)



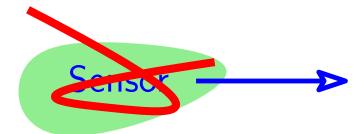
#### Context



→ Point set (no structure or unknown)

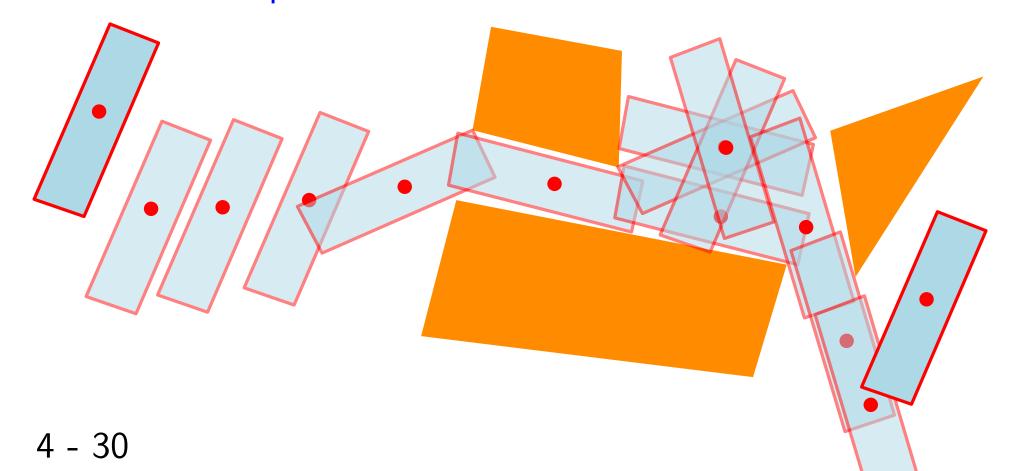


#### Context



→ Point set (no structure or unknown)

Abstract 3D problem that we can solve in 2D section

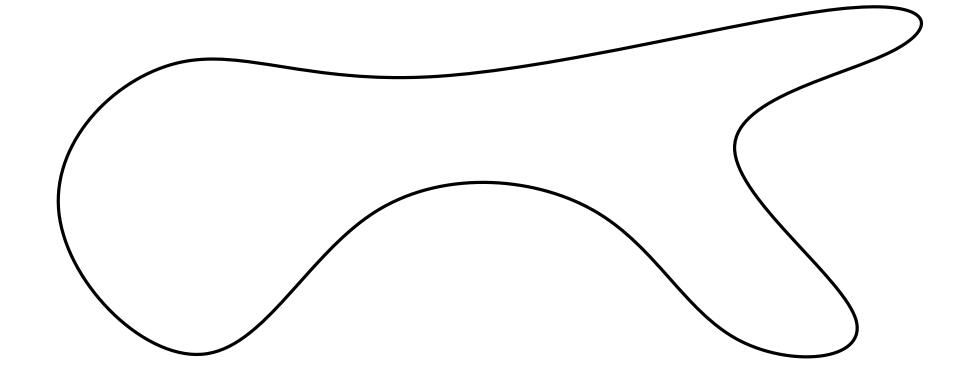


Delaunay is a good start

Medial axis of a curve (surface in 3D)

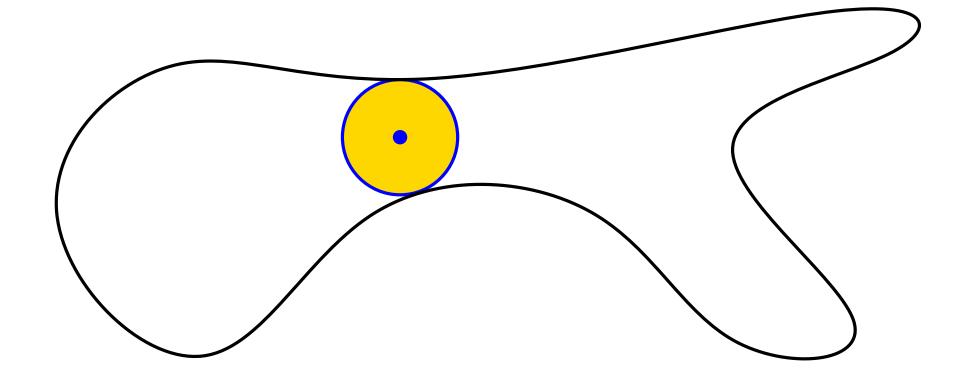
#### Delaunay is a good start

Medial axis of a curve (surface in 3D)



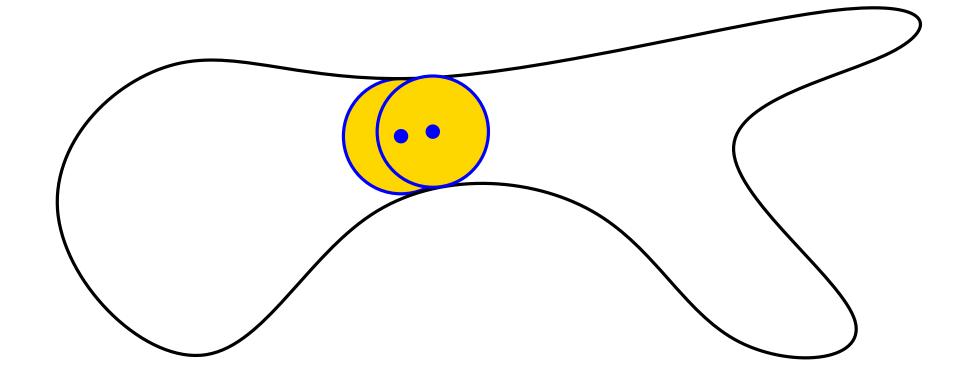
#### Delaunay is a good start

Medial axis of a curve (surface in 3D)



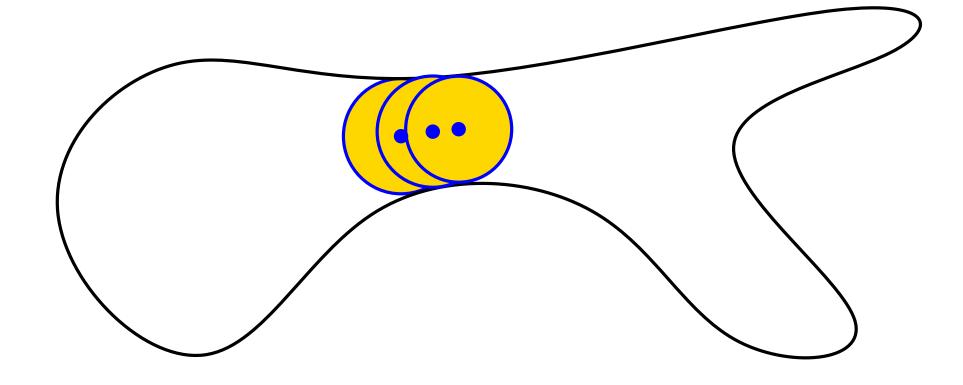
#### Delaunay is a good start

Medial axis of a curve (surface in 3D)



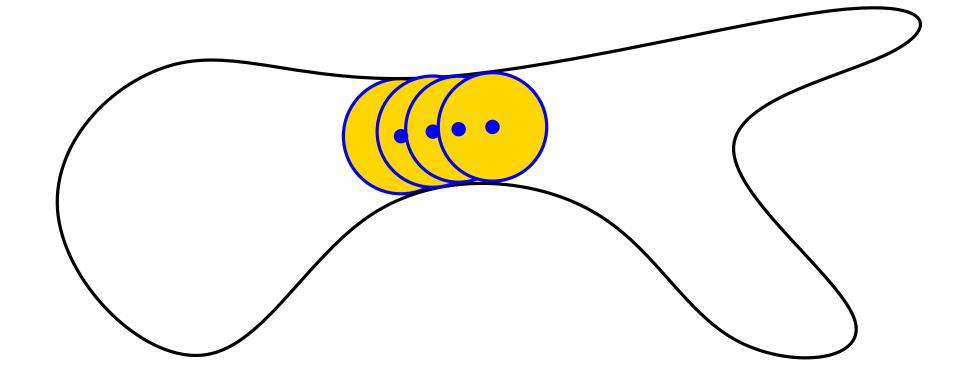
#### Delaunay is a good start

Medial axis of a curve (surface in 3D)



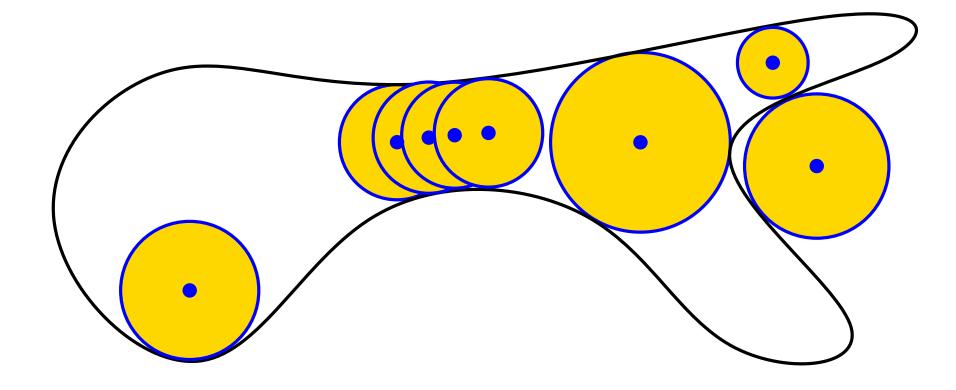
#### Delaunay is a good start

Medial axis of a curve (surface in 3D)



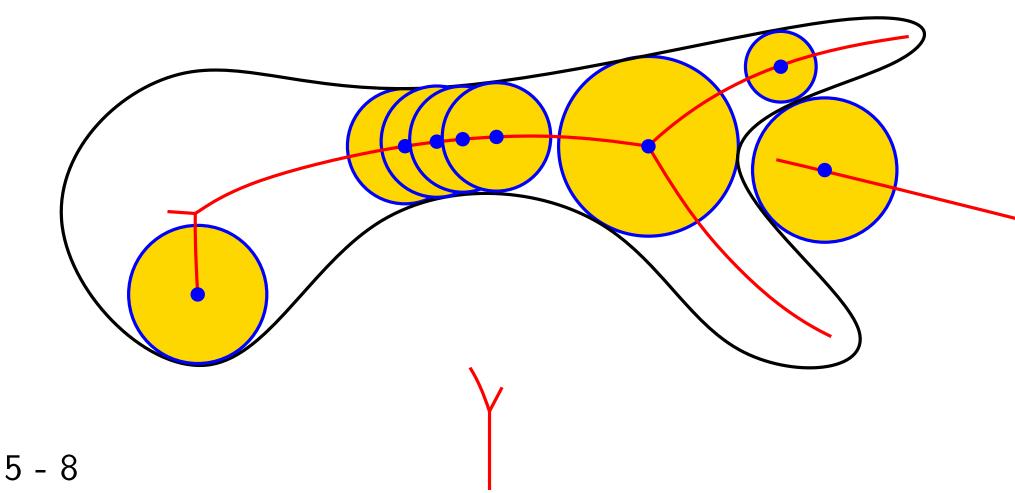
#### Delaunay is a good start

Medial axis of a curve (surface in 3D)



#### Delaunay is a good start

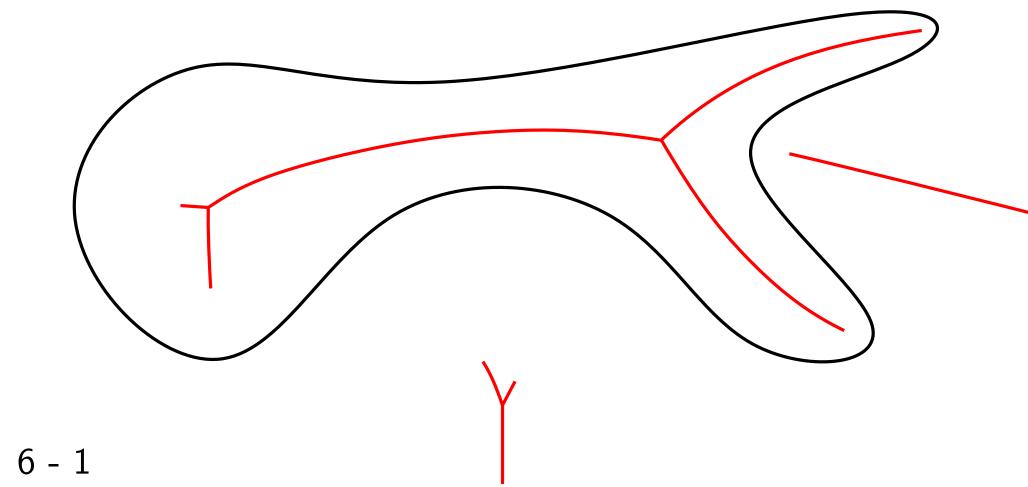
Medial axis of a curve (surface in 3D)



## Delaunay is a good start

 $\epsilon$ -sample of a curve

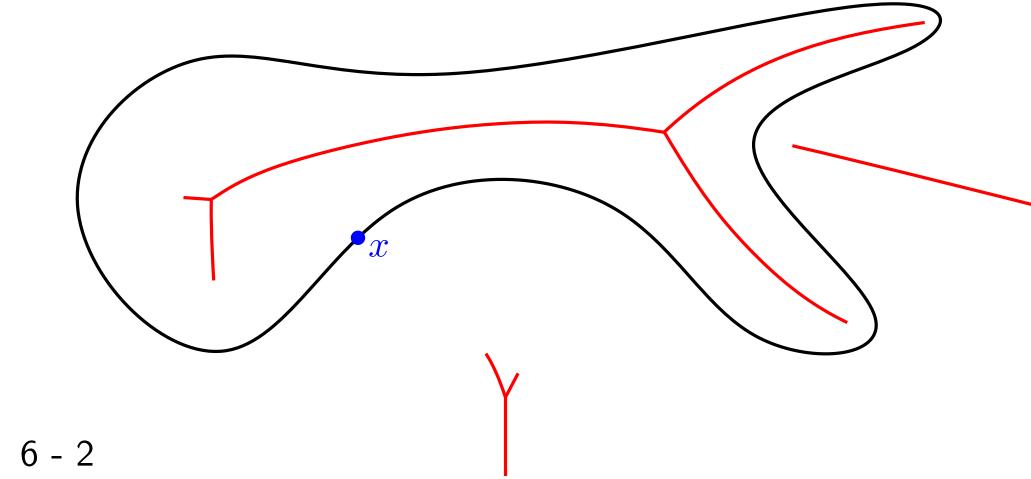
Local feature size:



## Delaunay is a good start

 $\epsilon$ -sample of a curve

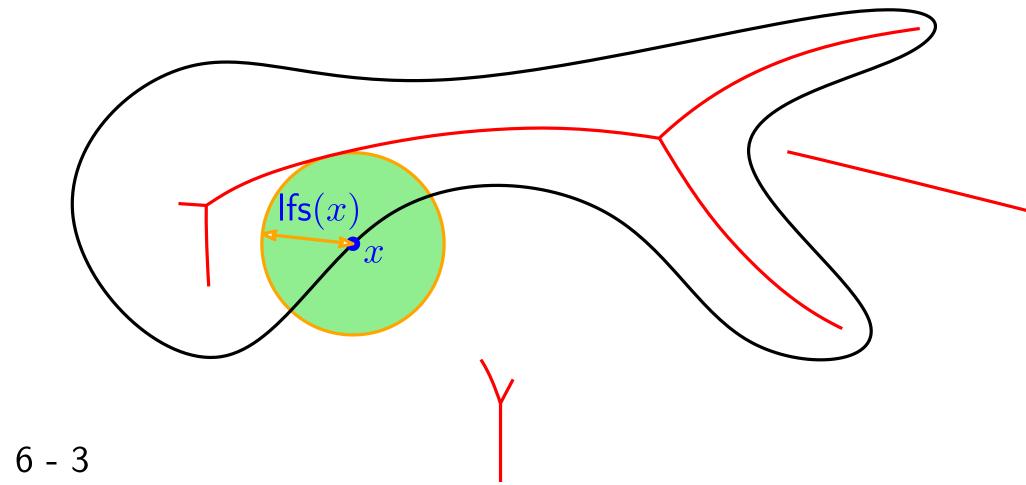
Local feature size: lfs(x) =



#### Delaunay is a good start

 $\epsilon$ -sample of a curve

Local feature size: lfs(x) = distance(x, medial axis)

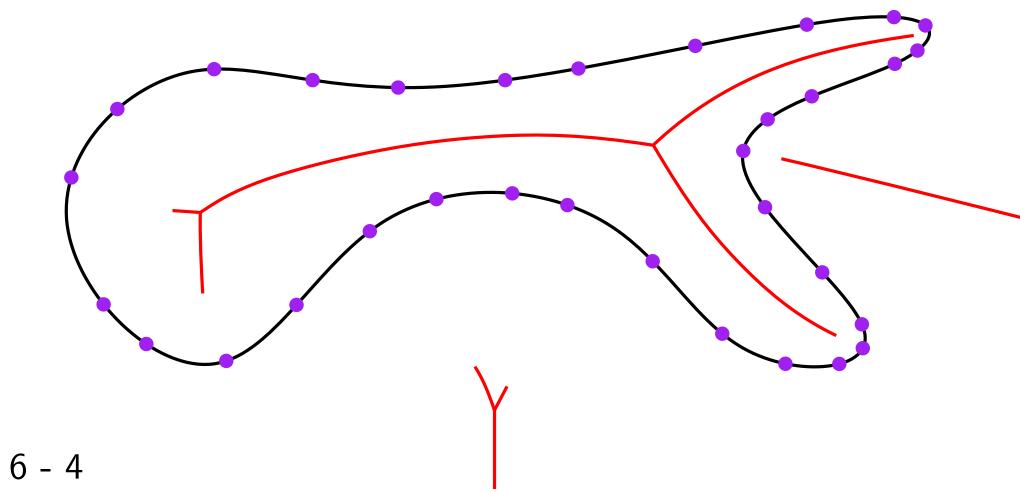


Delaunay is a good start

Sample is an

 $\epsilon$ -sample of a curve

Local feature size:

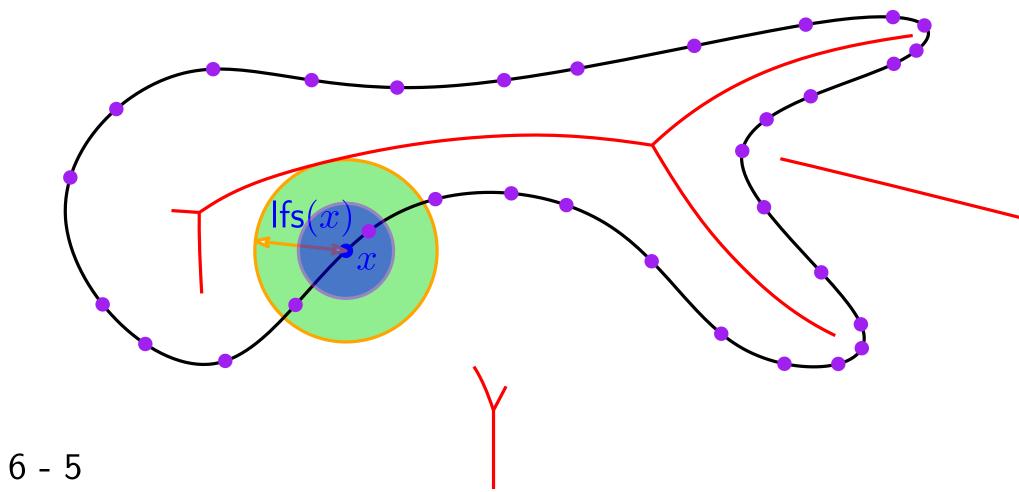


Delaunay is a good start

Sample is an

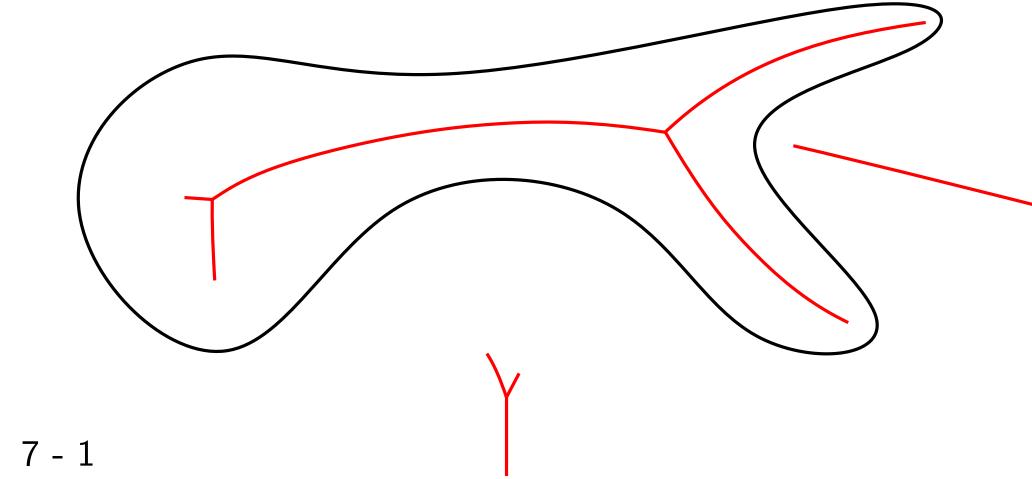
 $\epsilon$ -sample of a curve if  $\forall x$ ,  $\mathsf{Disk}(x, \epsilon \cdot \mathsf{lfs}(x)) \cap \mathsf{Sample} \neq \emptyset$ 

Local feature size: lfs(x) = distance(x, medial axis)



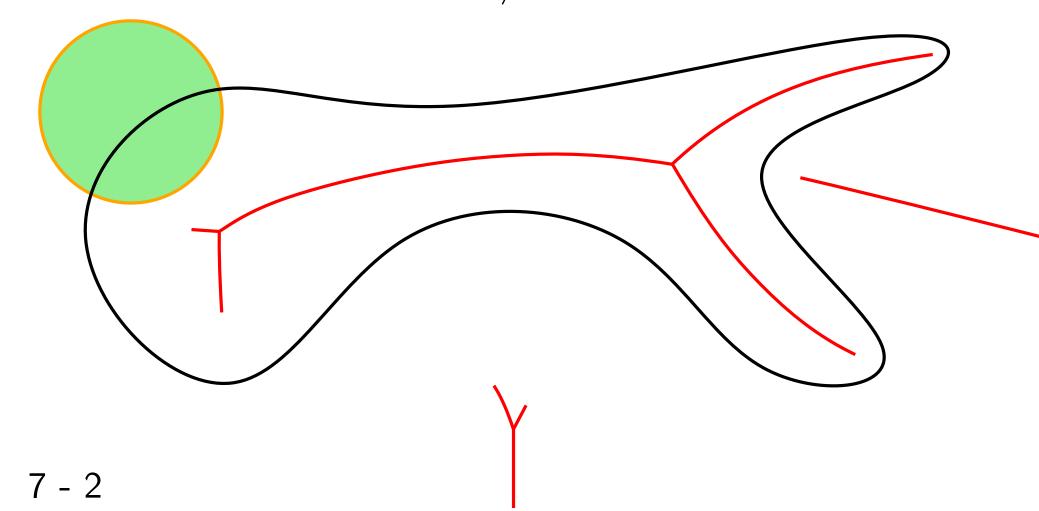
Delaunay is a good start

Lemma:



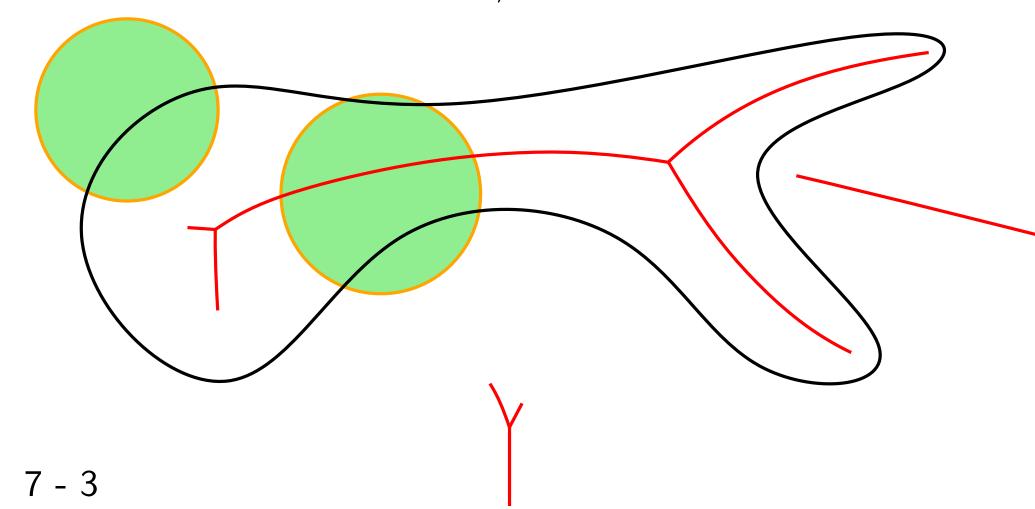
#### Delaunay is a good start

#### Lemma:



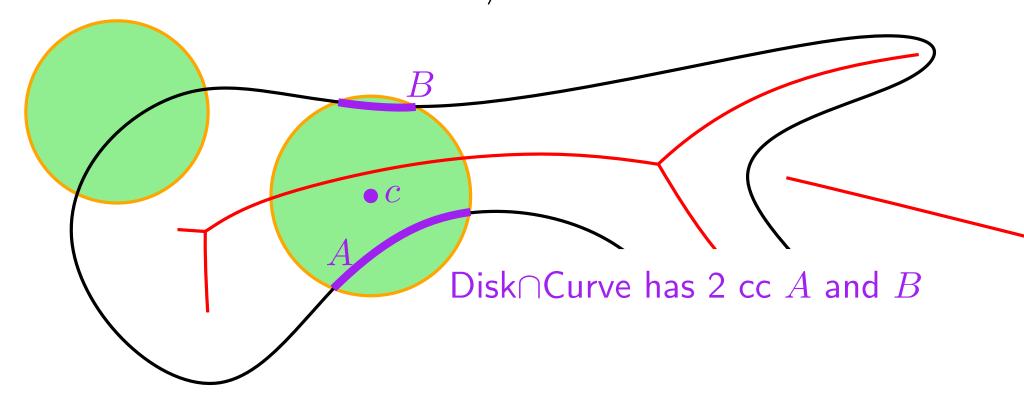
#### Delaunay is a good start

#### Lemma:



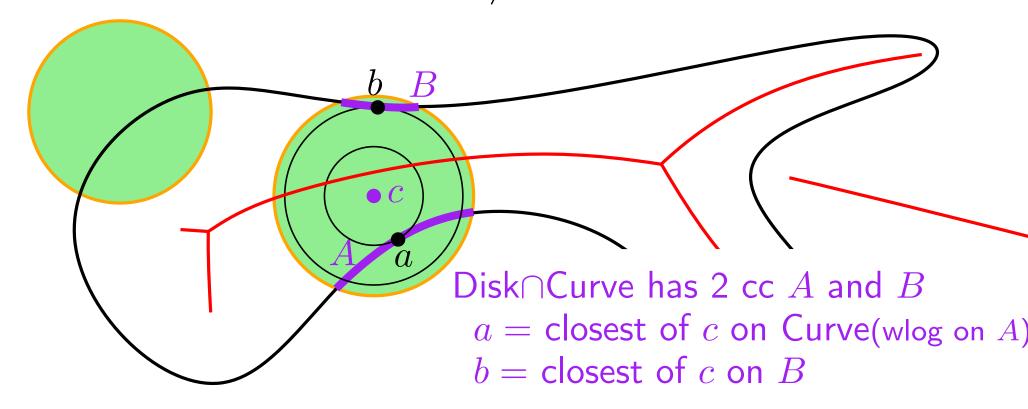
#### Delaunay is a good start

#### Lemma:



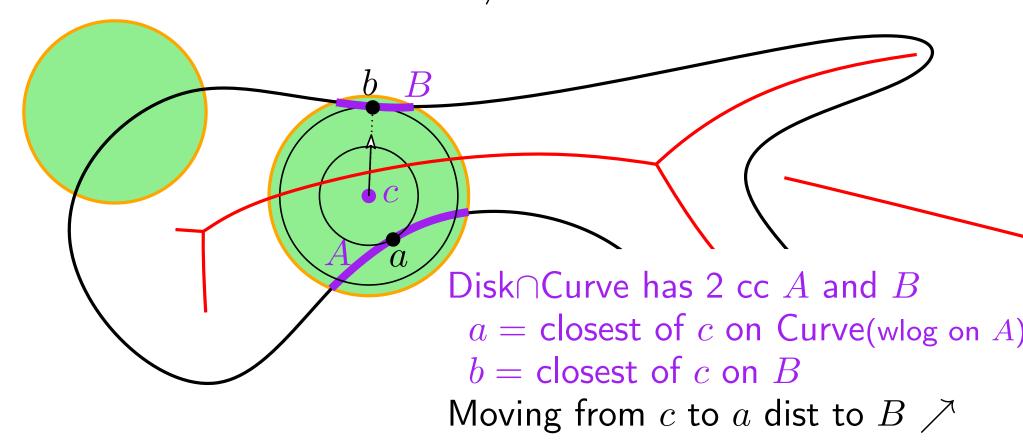
#### Delaunay is a good start

#### Lemma:



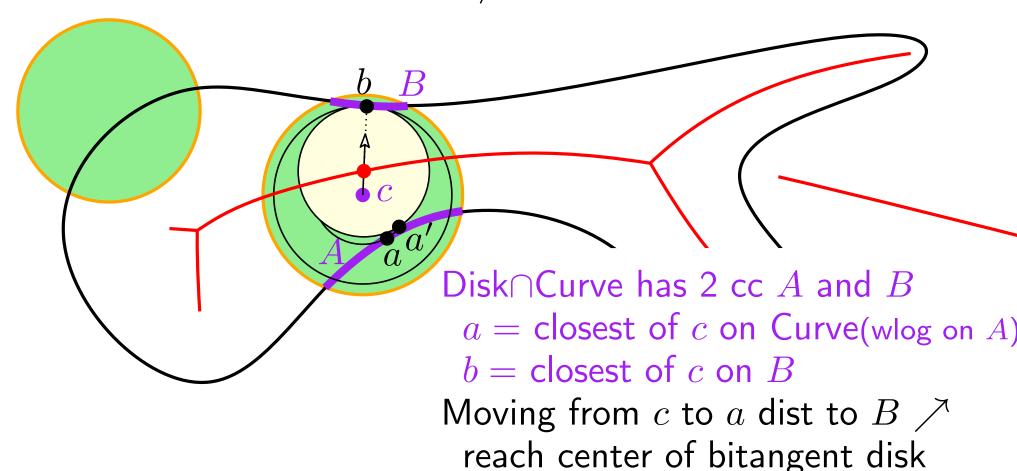
#### Delaunay is a good start

#### Lemma:

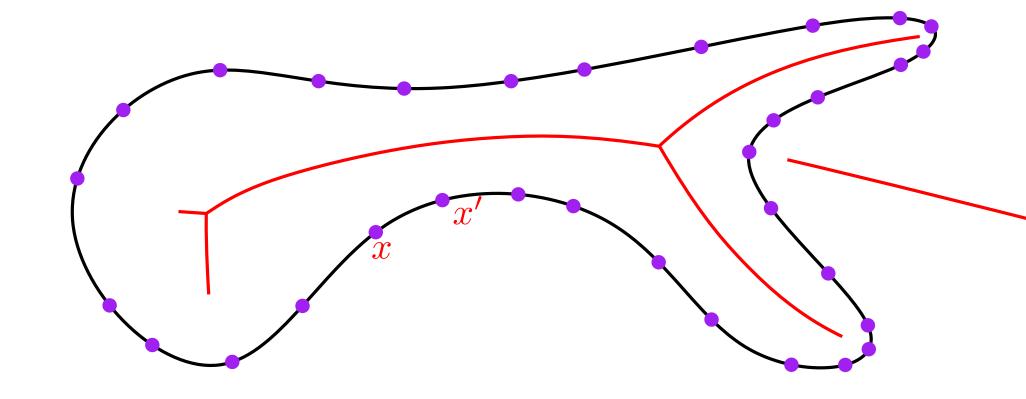


#### Delaunay is a good start

#### Lemma:

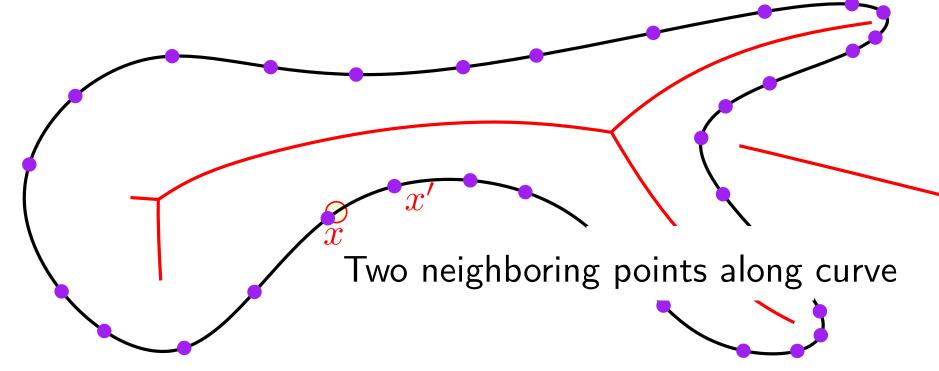


#### Delaunay is a good start



#### Delaunay is a good start

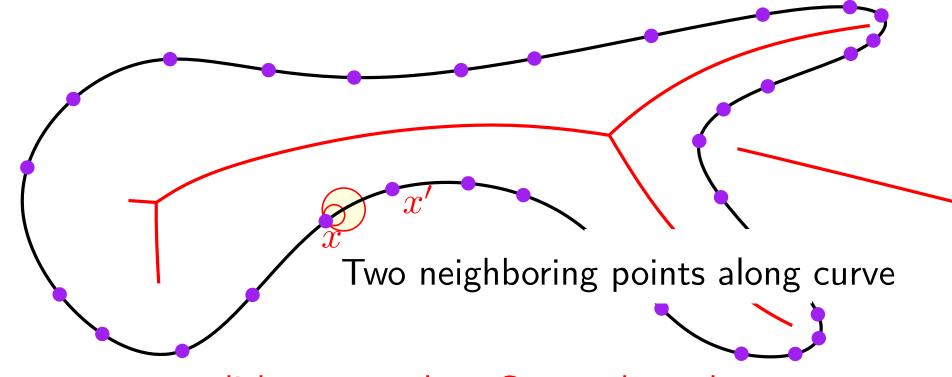
Theorem If Sample is a  $\epsilon$ -sample,  $\epsilon < 1$  neighboring points along Curve are Delaunay neighbors



disks centered on Curve, through x

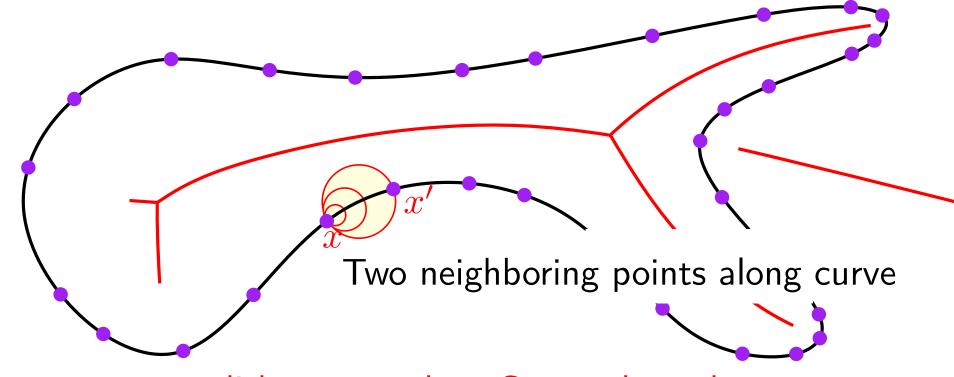
#### Delaunay is a good start

Theorem If Sample is a  $\epsilon$ -sample,  $\epsilon < 1$  neighboring points along Curve are Delaunay neighbors

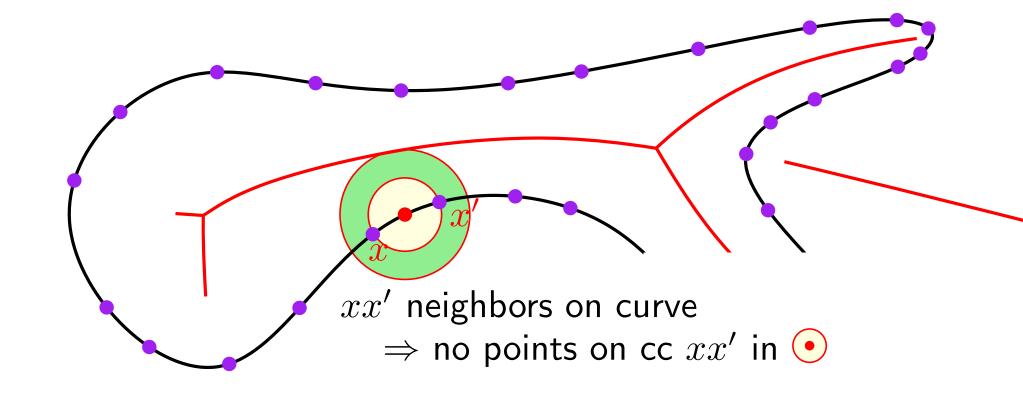


disks centered on Curve, through  $\boldsymbol{x}$ 

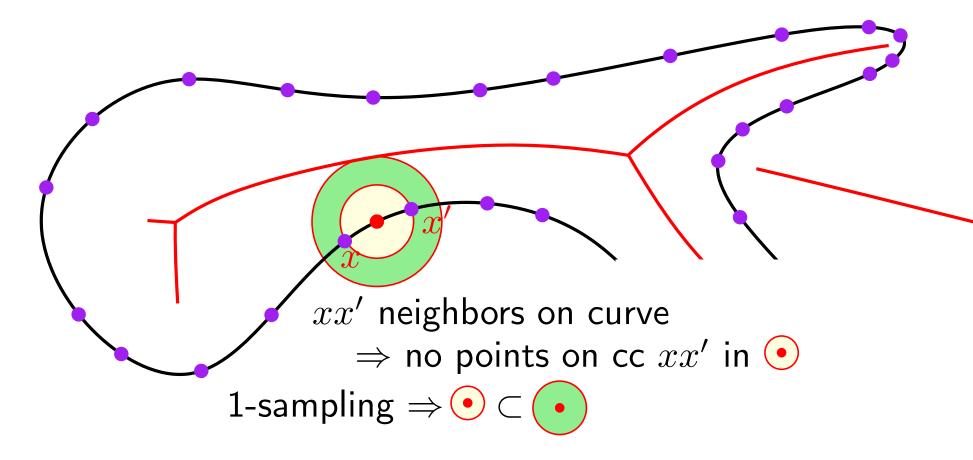
#### Delaunay is a good start



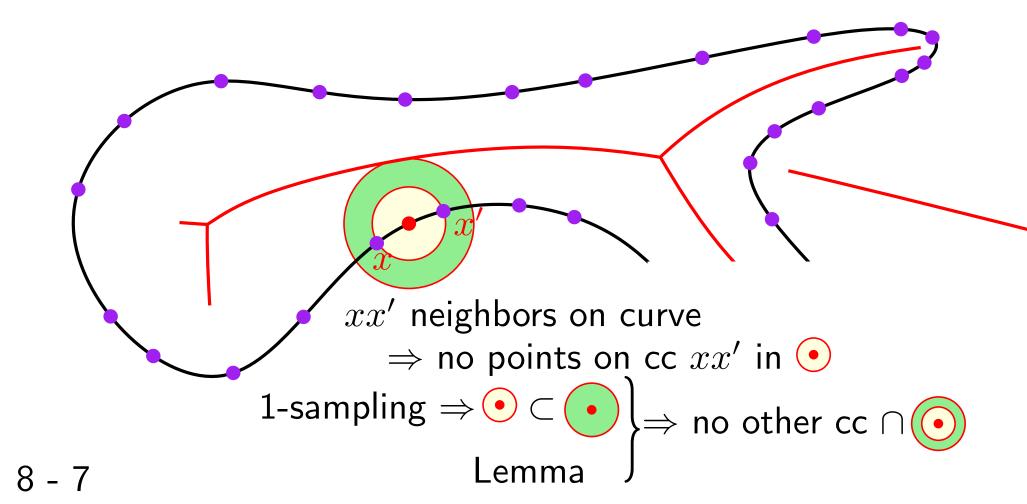
#### Delaunay is a good start



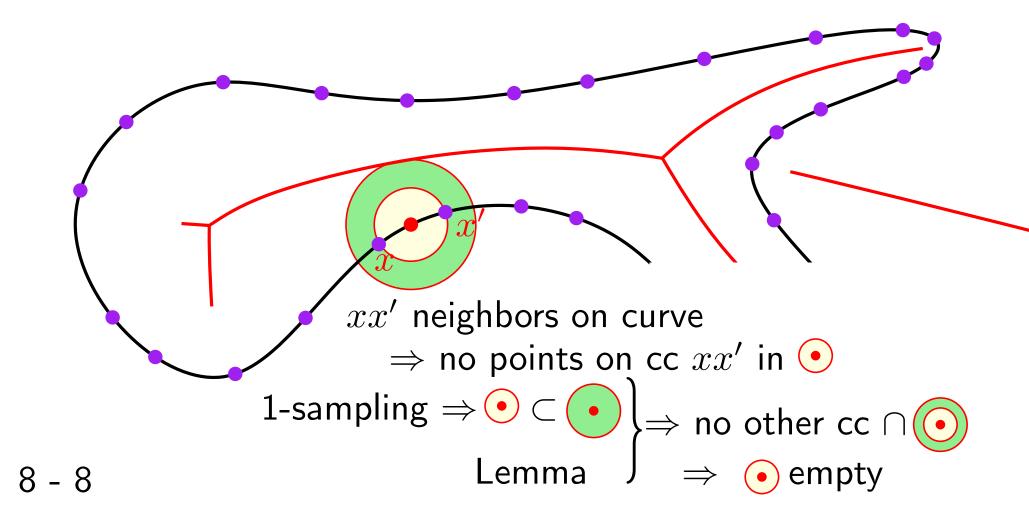
## Delaunay is a good start



## Delaunay is a good start

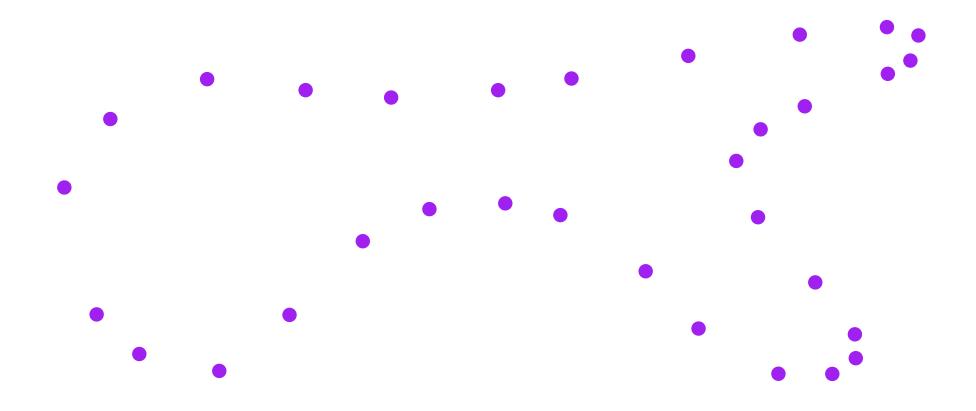


## Delaunay is a good start



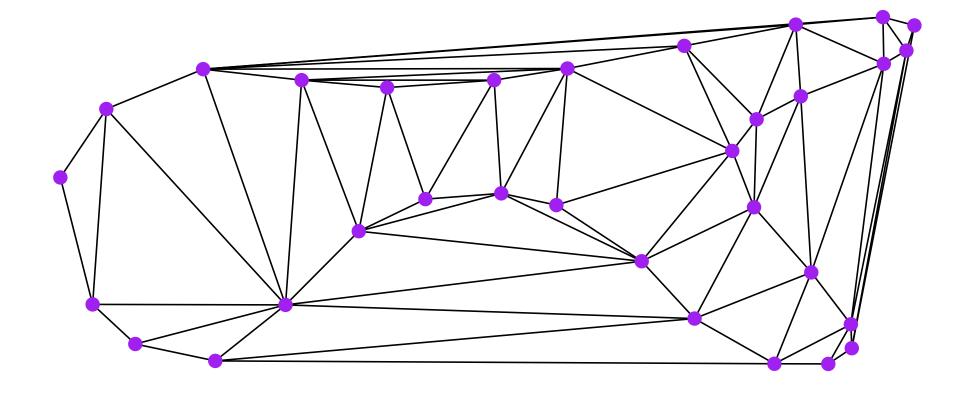
## Delaunay is a good start

Given a sampling



## Delaunay is a good start

Given a sampling Compute Delaunay



## Delaunay is a good start

Given a sampling

Compute Delaunay

Search the good sequence of edges there

Delaunay is a good start

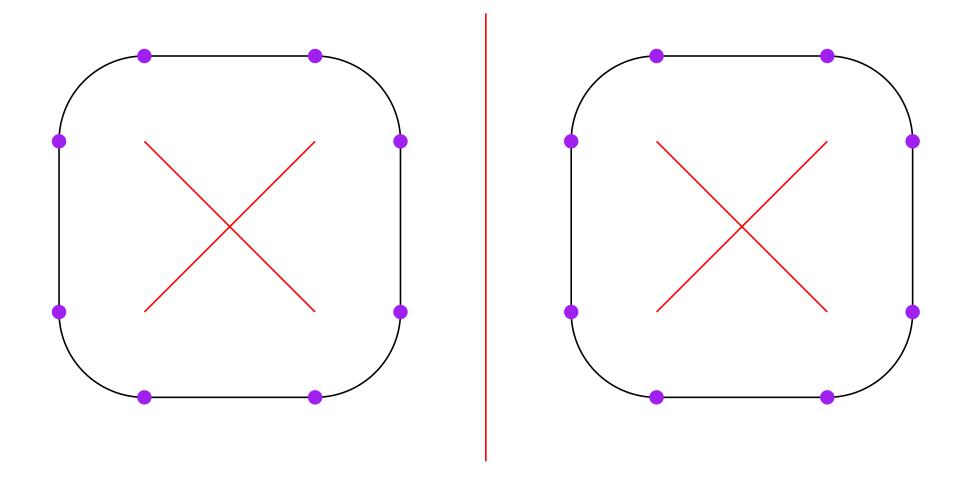
1-sample is not enough

## Delaunay is a good start

1-sample is not enough

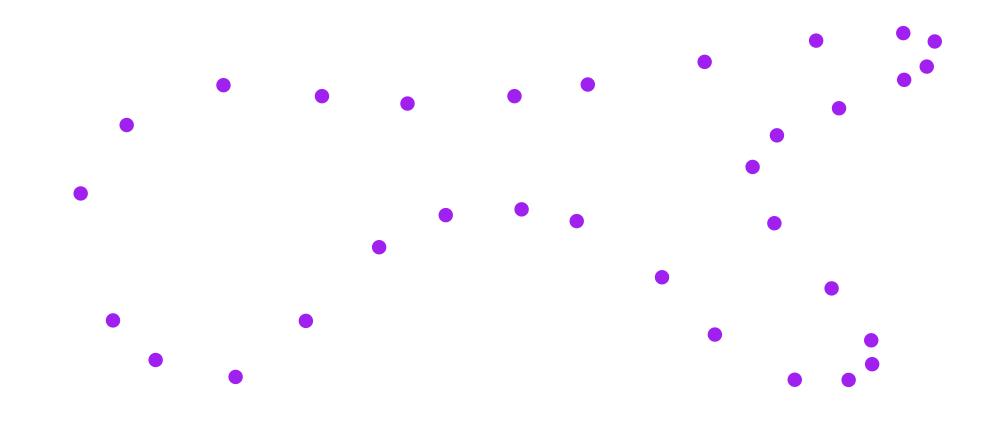
## Delaunay is a good start

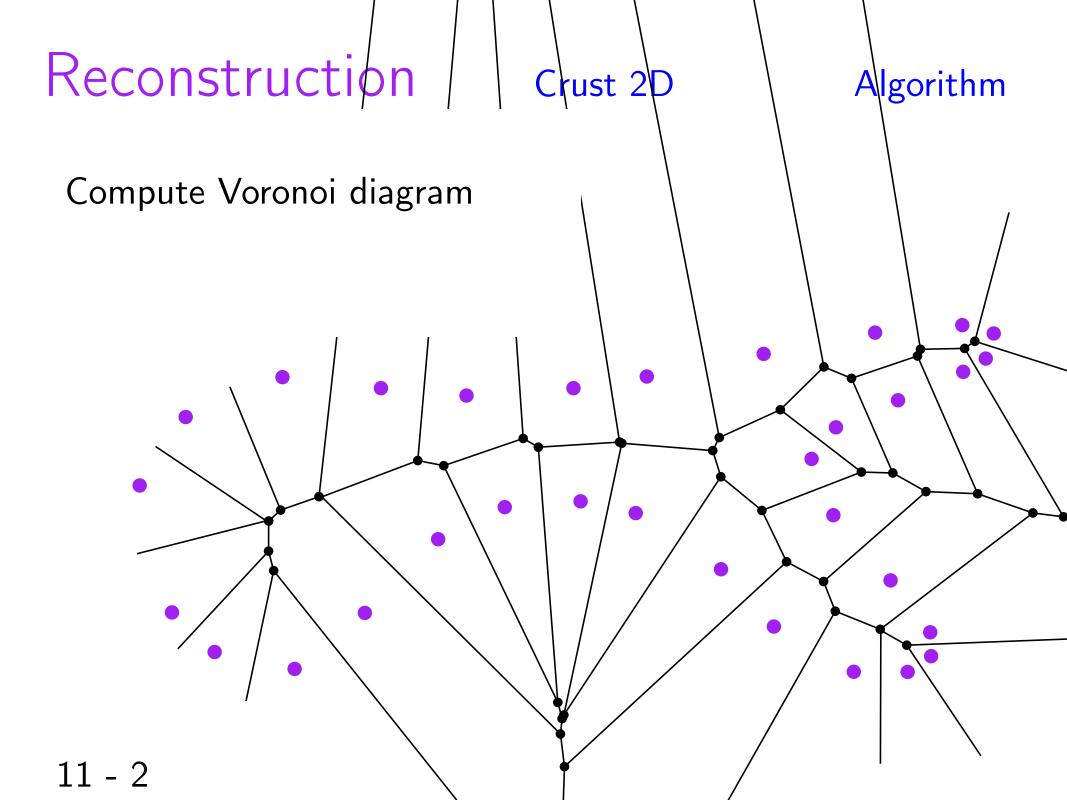
1-sample is not enough



# Reconstruction Delaunay is a good start 1-sample is not enough

Crust 2D

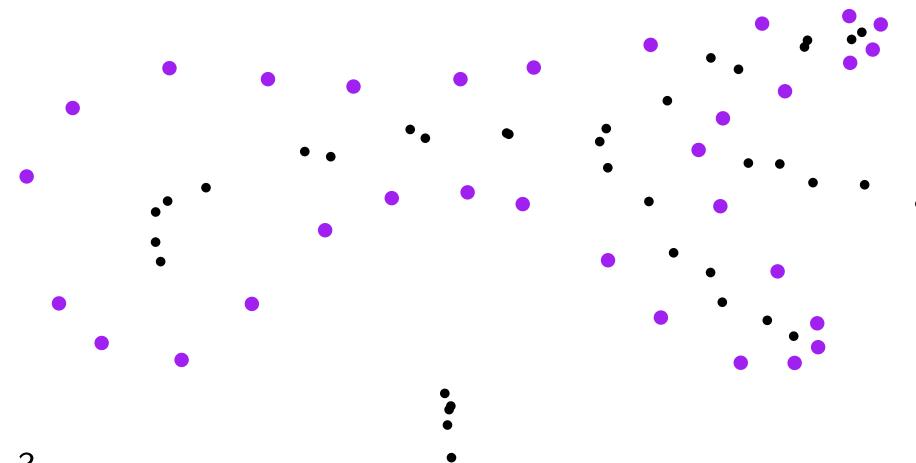


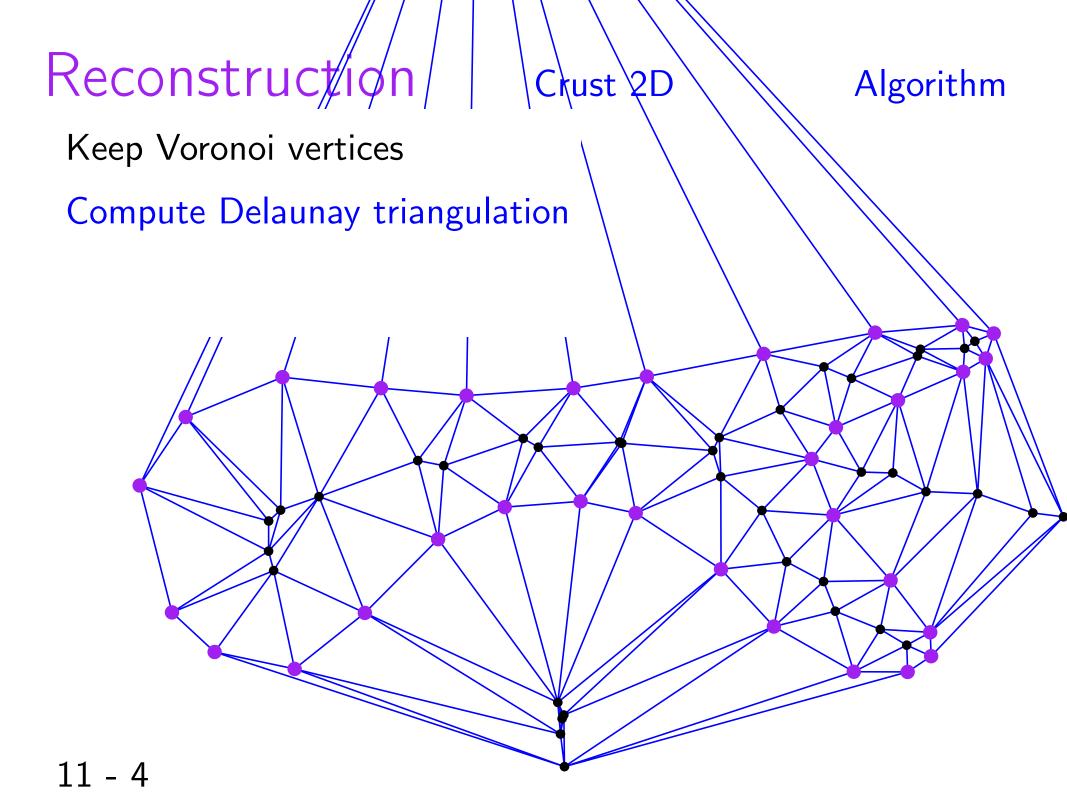


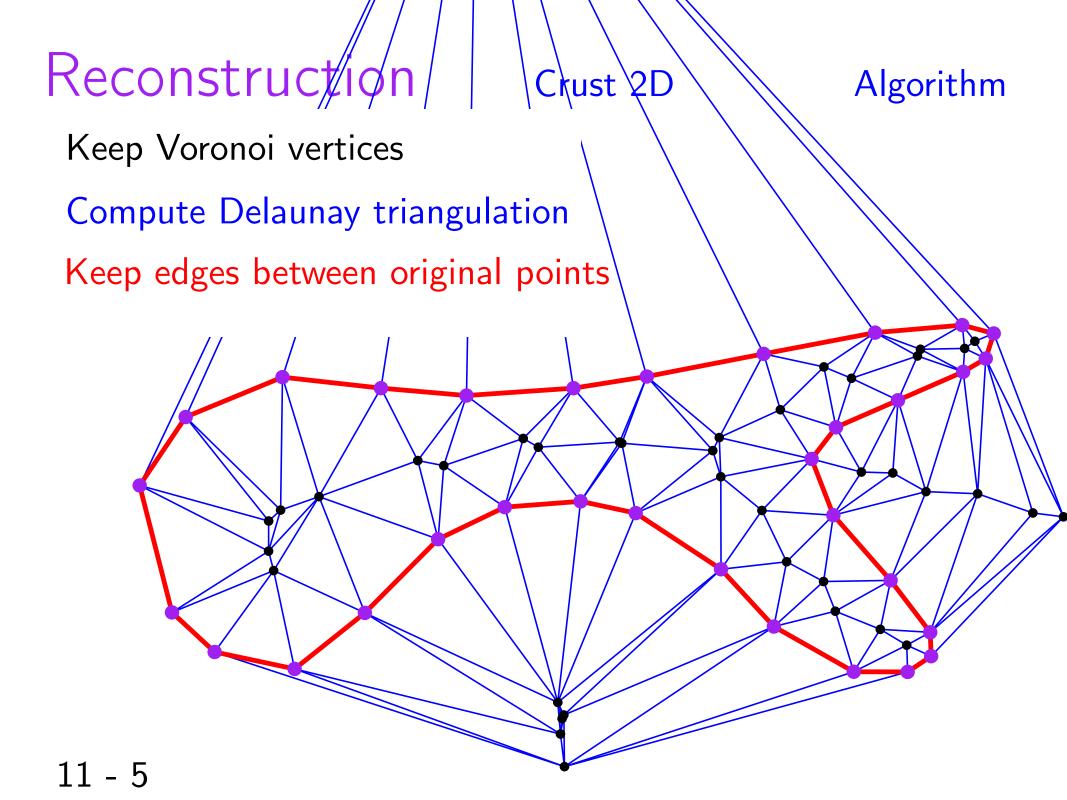
Crust 2D

Algorithm

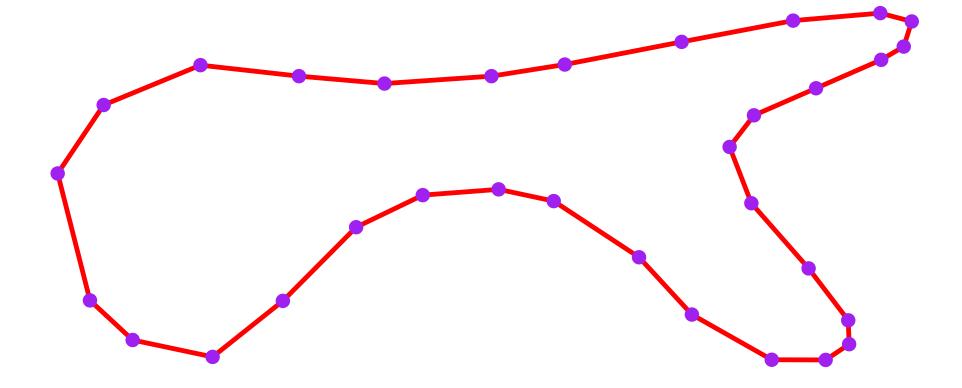
Keep Voronoi vertices



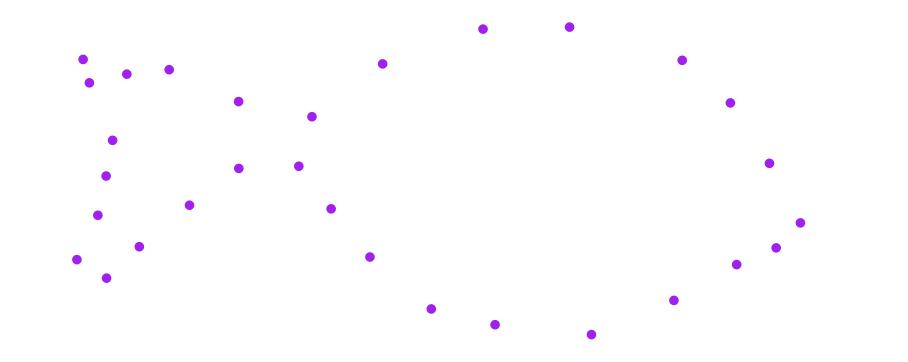


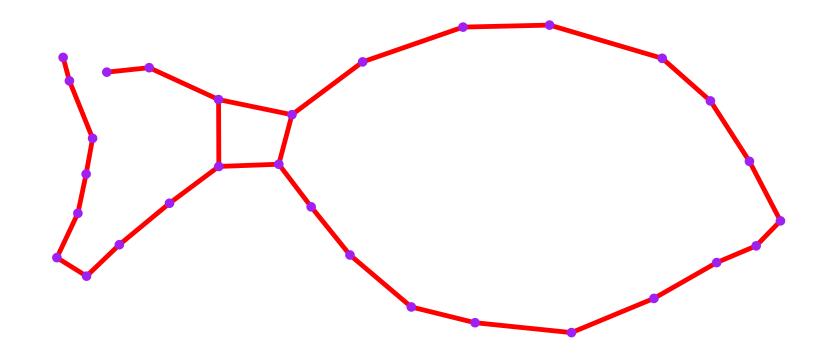


Keep edges between original points



Crust 2D

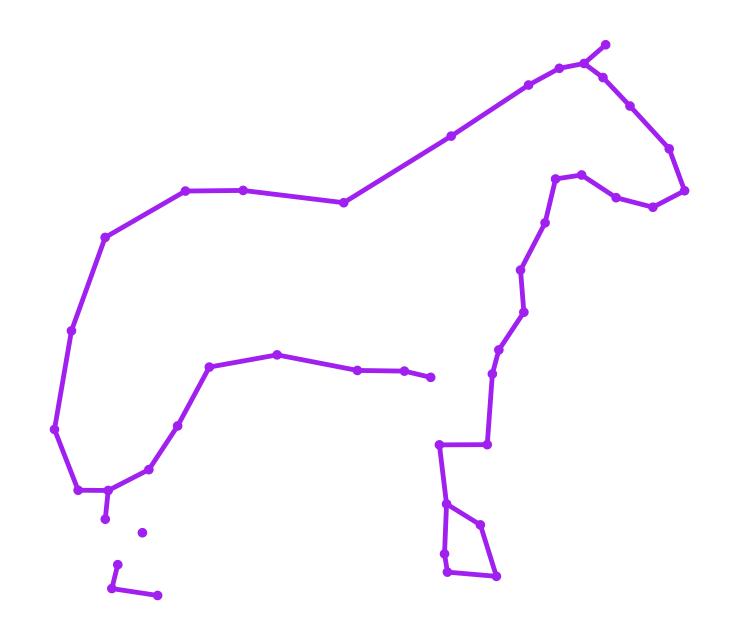






Crust 2D

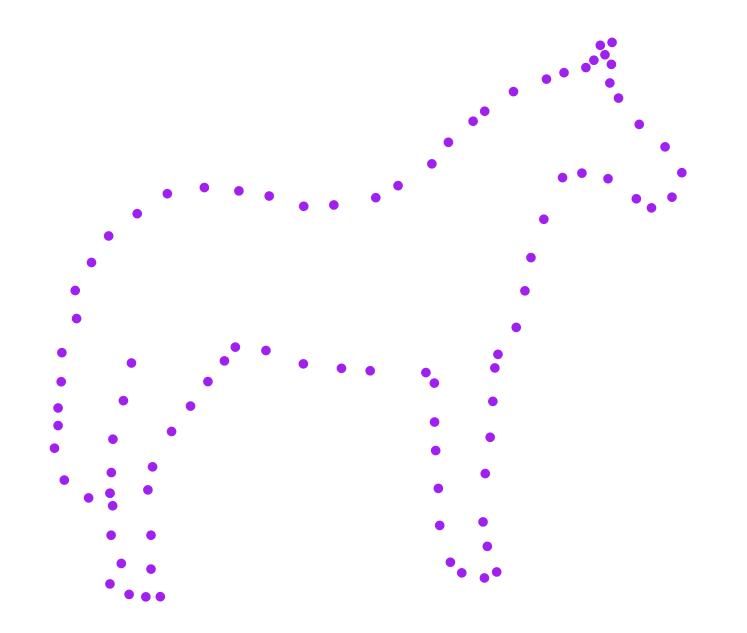




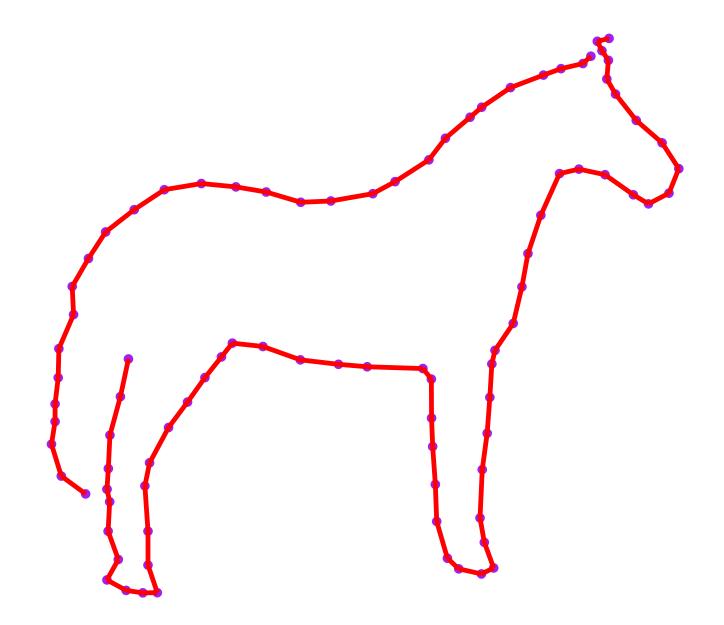
Crust 2D



Crust 2D



Crust 2D



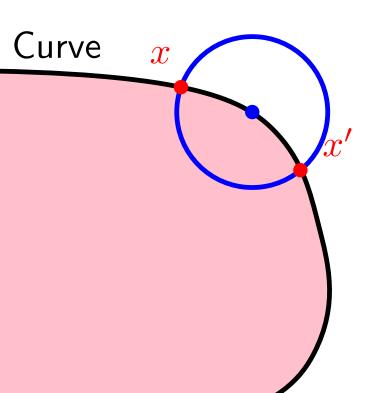
# $Reconstruction \qquad \qquad \text{Crust 2D} \quad \text{0.4 sample} \Rightarrow \text{wanted result} \subset \text{crust}$

Theorem:  $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ 

# $Reconstruction \qquad \qquad \text{Crust 2D} \quad \text{0.4 sample} \Rightarrow \text{wanted result} \subset \text{crust}$

Theorem:  $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ 

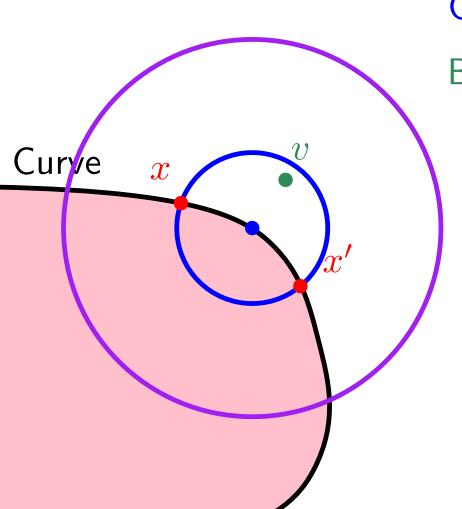
x, x' two neighboring points on Curve Circle thru x and x' centered on Curve



 $\begin{array}{ccc} \text{Crust } 2D & \text{0.4 sample} \Rightarrow \mathsf{wanted} \ \mathsf{result} \subset \mathsf{crust} \end{array}$ 

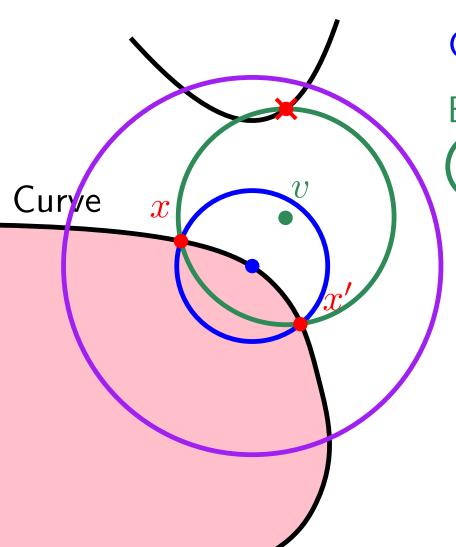
Theorem:  $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ 

 $x, \ x'$  two neighboring points on Curve Circle thru x and x' centered on Curve By contradiction assume  $v \in oldsymbol{oldsymbol{oldsymbol{c}}}$ 



 $\begin{array}{ccc} \text{Crust } 2D & \text{0.4 sample} \Rightarrow \mathsf{wanted} \ \mathsf{result} \subset \mathsf{crust} \end{array}$ 

Theorem:  $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ 



x, x' two neighboring points on Curve

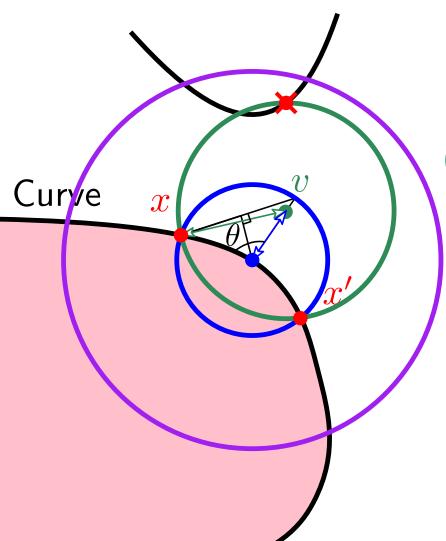
Circle thru x and x' centered on Curve

By contradiction assume  $v \in \bullet$ 

• intersects another cc of curve (by Lemma)

 $\begin{array}{ccc} \text{Crust } 2D & \text{0.4 sample} \Rightarrow \mathsf{wanted} \ \mathsf{result} \subset \mathsf{crust} \end{array}$ 

Theorem:  $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ 



x, x' two neighboring points on Curve

Circle thru x and x' centered on Curve

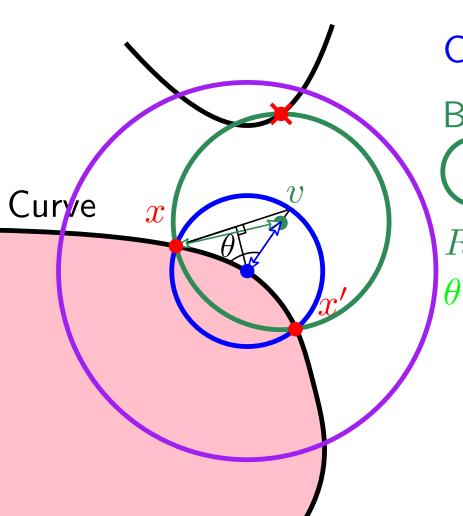
By contradiction assume  $v \in \bullet$ 

• intersects another cc of curve (by Lemma)

 $R \le 2r \sin \frac{\theta}{2}$ 

 $\begin{array}{ccc} \text{Crust } 2D & \text{0.4 sample} \Rightarrow \text{wanted result} \subset \text{crust} \end{array}$ 

Theorem:  $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ 



x, x' two neighboring points on Curve

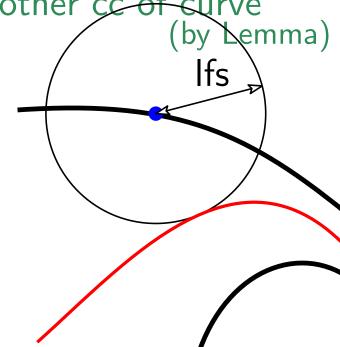
Circle thru x and x' centered on Curve

By contradiction assume  $v \in \bullet$ 



 $R \le 2r \sin \frac{\theta}{2}$ 

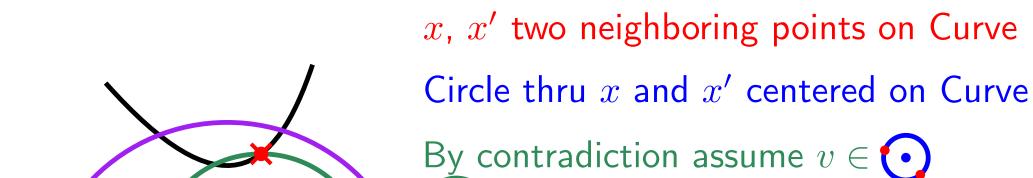




Curye

 $\begin{array}{ccc} \text{Crust } 2D & \text{0.4 sample} \Rightarrow \mathsf{wanted} \ \mathsf{result} \subset \mathsf{crust} \end{array}$ 

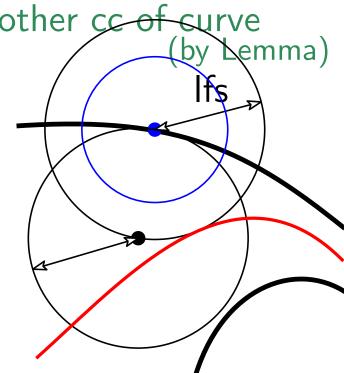
Theorem:  $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ 



• intersects another cc of curve

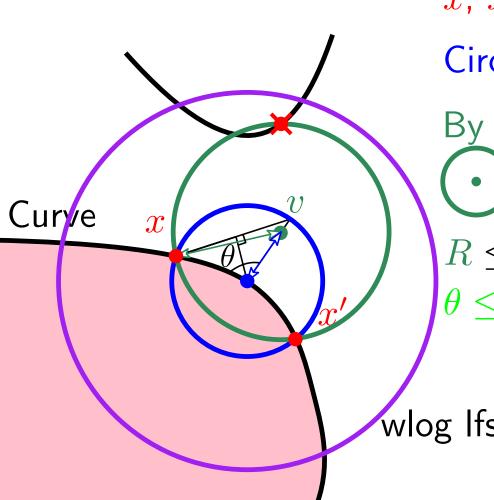
 $R \le 2r \sin \frac{\theta}{2}$ 

tangent disk is empty



 $\begin{array}{ccc} \text{Crust } 2D & \text{0.4 sample} \Rightarrow \mathsf{wanted} \ \mathsf{result} \subset \mathsf{crust} \end{array}$ 

 $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ Theorem:



x, x' two neighboring points on Curve

Circle thru x and x' centered on Curve

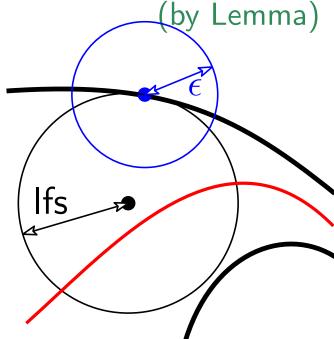
By contradiction assume  $v \in (\bullet)$ 



 $R \leq 2r\sin\frac{\theta}{2}$ 

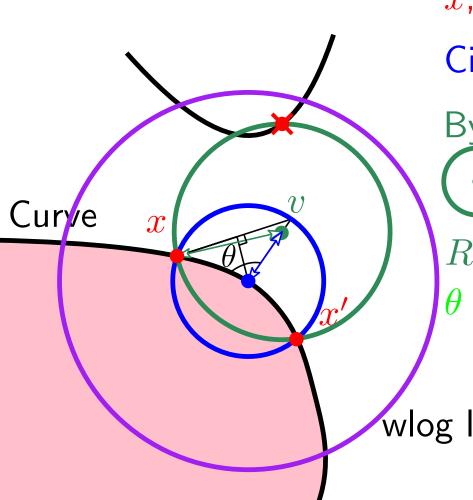
$$\theta \leq$$

wlog lfs=1 and  $r \leq \epsilon$ 



 $\begin{array}{ccc} \text{Crust } 2D & \text{0.4 sample} \Rightarrow \mathsf{wanted} \ \mathsf{result} \subset \mathsf{crust} \end{array}$ 

 $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ Theorem:



x, x' two neighboring points on Curve

Circle thru x and x' centered on Curve

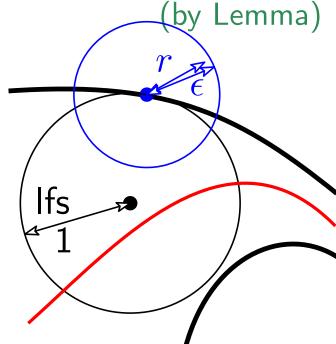
By contradiction assume  $v \in (\bullet)$ 



 $R \leq 2r\sin\frac{\theta}{2}$ 

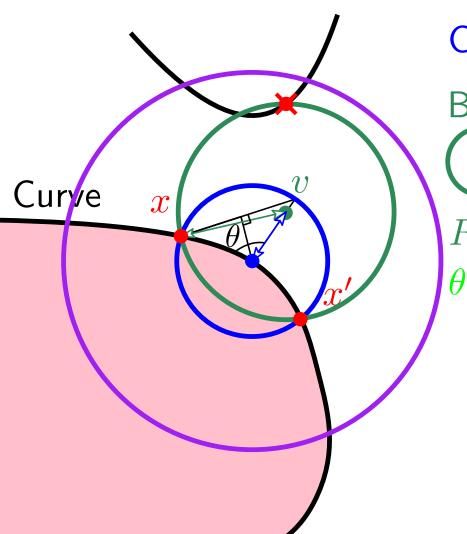
$$\theta \leq$$

wlog lfs=1 and  $r \leq \epsilon$ 



 $\begin{array}{ccc} \text{Crust } 2D & \text{0.4 sample} \Rightarrow \mathsf{wanted} \ \mathsf{result} \subset \mathsf{crust} \end{array}$ 

Theorem:  $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ 



x, x' two neighboring points on Curve

Circle thru x and x' centered on Curve

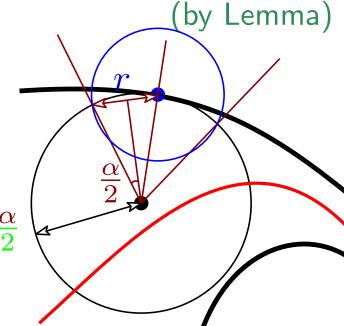
By contradiction assume  $v \in \bullet$ 



 $R \le 2r \sin \frac{\theta}{2}$ 

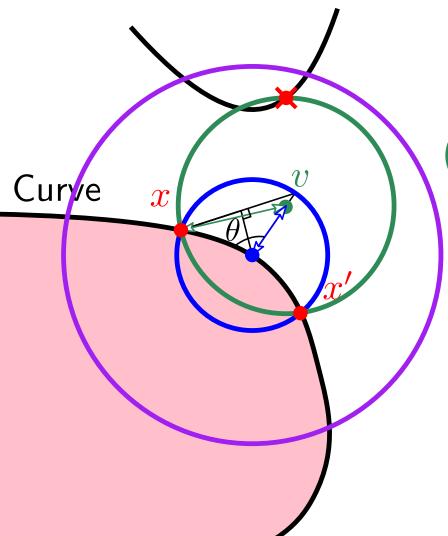
$$\theta \leq$$

$$r = 2\sin\frac{\alpha}{2}$$



 $\begin{array}{ccc} \text{Crust } 2D & \text{0.4 sample} \Rightarrow \mathsf{wanted} \ \mathsf{result} \subset \mathsf{crust} \end{array}$ 

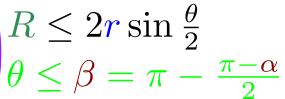
Theorem:  $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ 



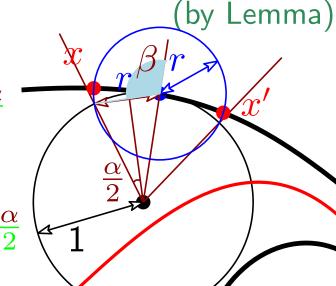
x, x' two neighboring points on Curve

Circle thru x and x' centered on Curve



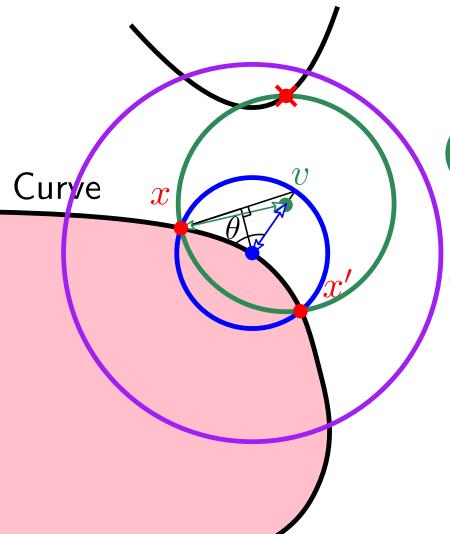


$$r=2\sinrac{lpha}{2}$$



#### $\begin{array}{ccc} \text{Crust } 2D & \text{0.4 sample} \Rightarrow \mathsf{wanted} \ \mathsf{result} \subset \mathsf{crust} \end{array}$

Theorem:  $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ 



x, x' two neighboring points on Curve

Circle thru x and x' centered on Curve

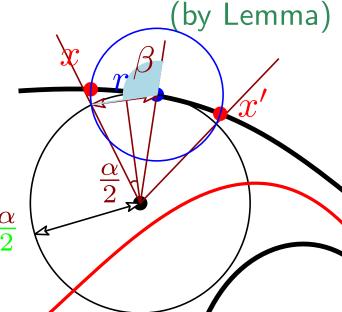


$$R \le 2r \sin \frac{\theta}{2}$$

$$\theta \le \beta = \pi - \frac{\pi - \alpha}{2}$$

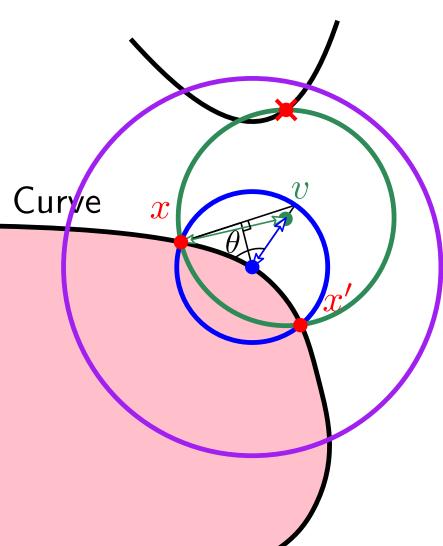
$$\leq \frac{\pi}{2} + \arcsin \frac{r}{2}$$

$$r=2\sin\frac{\alpha}{2}$$



 $\begin{array}{ccc} Crust & 2D & \text{0.4 sample} \Rightarrow \mathsf{wanted} \ \mathsf{result} \subset \mathsf{crust} \end{array}$ 

Theorem:  $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ 



x, x' two neighboring points on Curve

Circle thru x and x' centered on Curve



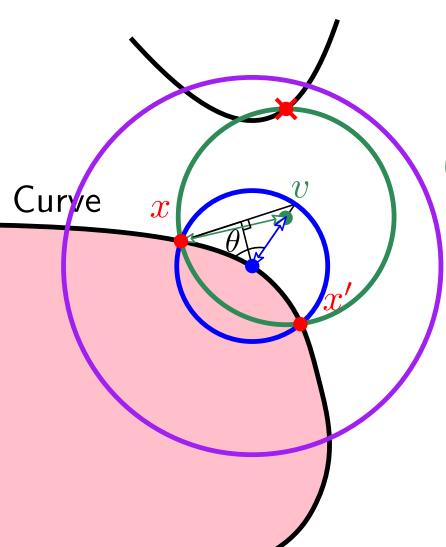
$$R \le 2r \sin \frac{\theta}{2}$$

$$\theta \le \frac{\pi}{2} + \arcsin \frac{r}{2}$$

$$\|\bullet \times \| \leq \|\bullet \bullet\| + \|\bullet \times\|$$

#### $\begin{array}{ccc} Crust & 2D & \text{0.4 sample} \Rightarrow \mathsf{wanted} \ \mathsf{result} \subset \mathsf{crust} \end{array}$

Theorem:  $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ 



x, x' two neighboring points on Curve

Circle thru x and x' centered on Curve



$$R \le 2r \sin \frac{\theta}{2}$$

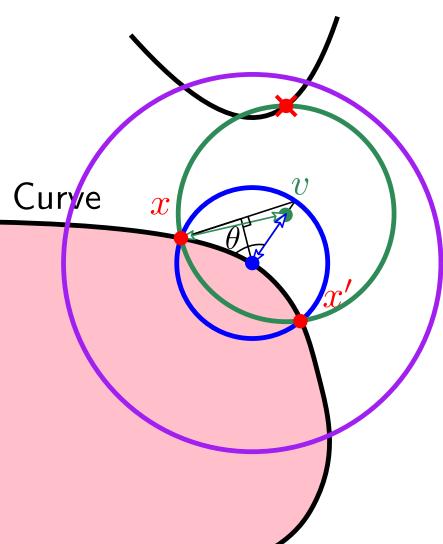
$$\theta \le \frac{\pi}{2} + \arcsin \frac{r}{2}$$

$$\|\bullet \times \| \le \|\bullet \bullet\| + \|\bullet \times\|$$

$$\le r + 2r \sin\left(\frac{\pi}{4} + \frac{1}{2}\arcsin\frac{r}{2}\right)$$

#### $\begin{array}{ccc} Crust & 2D & \text{0.4 sample} \Rightarrow \mathsf{wanted} \ \mathsf{result} \subset \mathsf{crust} \end{array}$

Theorem:  $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ 



x, x' two neighboring points on Curve

Circle thru x and x' centered on Curve



$$R \le 2r \sin \frac{\theta}{2}$$

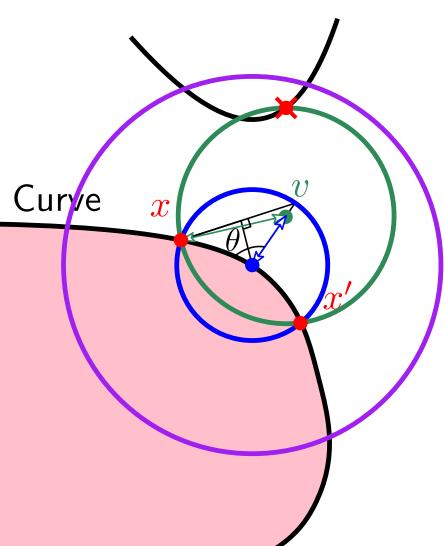
$$\theta \le \frac{\pi}{2} + \arcsin \frac{r}{2}$$

$$\leq r + 2r\sin\left(\frac{\pi}{4} + \frac{1}{2}\arcsin\frac{r}{2}\right)$$

if 
$$| \bullet \times | \le | \le 1$$
 contradiction is reached

 $\begin{array}{ccc} \text{Crust } 2D & \text{0.4 sample} \Rightarrow \mathsf{wanted} \ \mathsf{result} \subset \mathsf{crust} \end{array}$ 

 $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ Theorem:



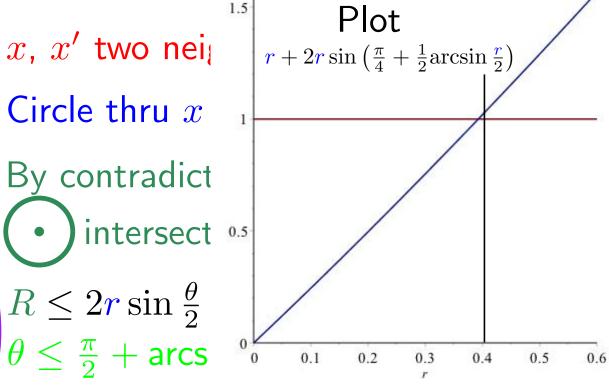
Circle thru x

By contradict



$$R \leq 2r\sin\frac{\theta}{2}$$

$$\theta \leq \frac{\pi}{2} + arcs$$



$$\leq r + 2r\sin\left(\frac{\pi}{4} + \frac{1}{2}\arcsin\frac{r}{2}\right)$$

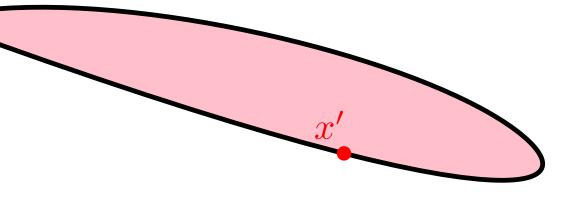
if 
$$| \bullet \times | \le | \le 1$$
 contradiction is reached

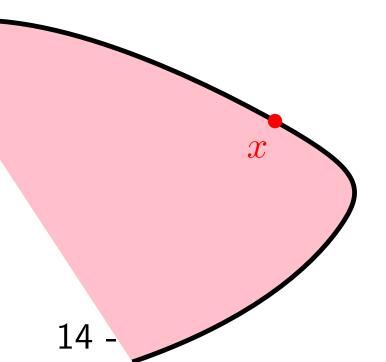
## $Reconstruction \qquad \qquad \text{Crust 2D} \quad \text{0.4 sample} \Rightarrow \text{wanted result} \subset \text{crust}$

Theorem:  $0.4 \text{ sample} \Rightarrow \text{wanted result} \subset \text{crust}$ 

Theorem:  $0.25 \text{ sample} \Rightarrow \text{crust} \subset \text{wanted result}$ 

Theorem:  $0.25 \text{ sample} \Rightarrow \text{crust} \subset \text{wanted result}$ 

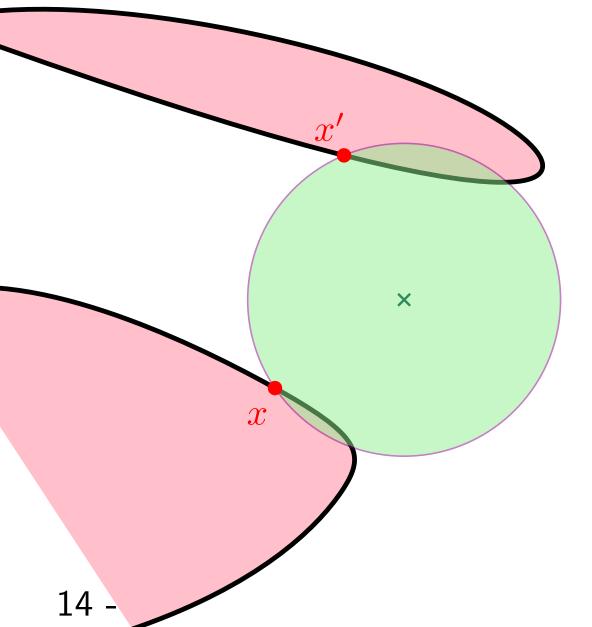




Theorem:  $0.25 \text{ sample} \Rightarrow \text{crust} \subset \text{wanted result}$ 

Assume empty circle

Theorem:  $0.25 \text{ sample} \Rightarrow \text{crust} \subset \text{wanted result}$ 

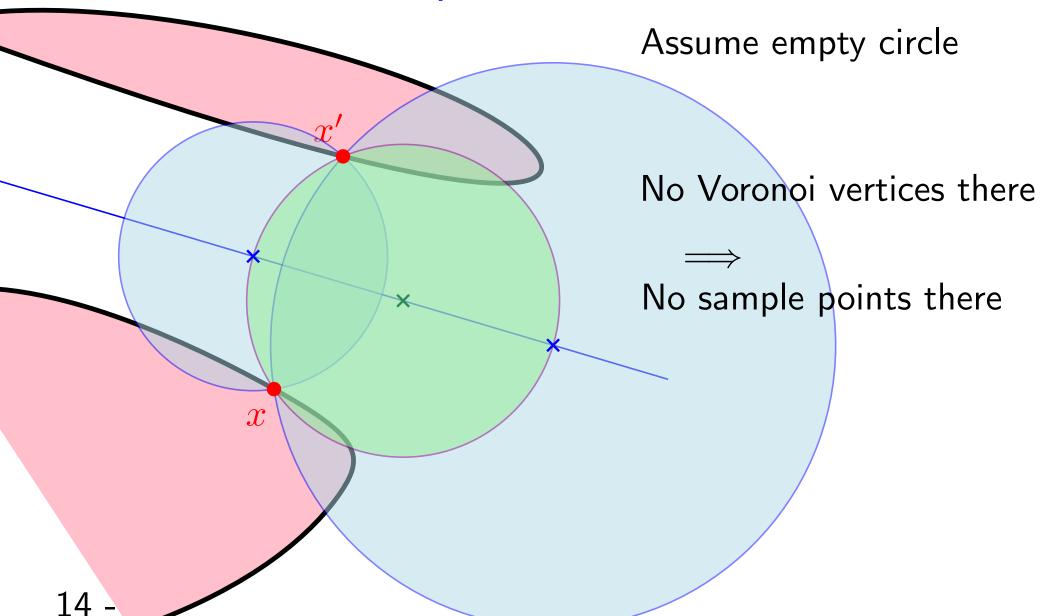


Assume empty circle

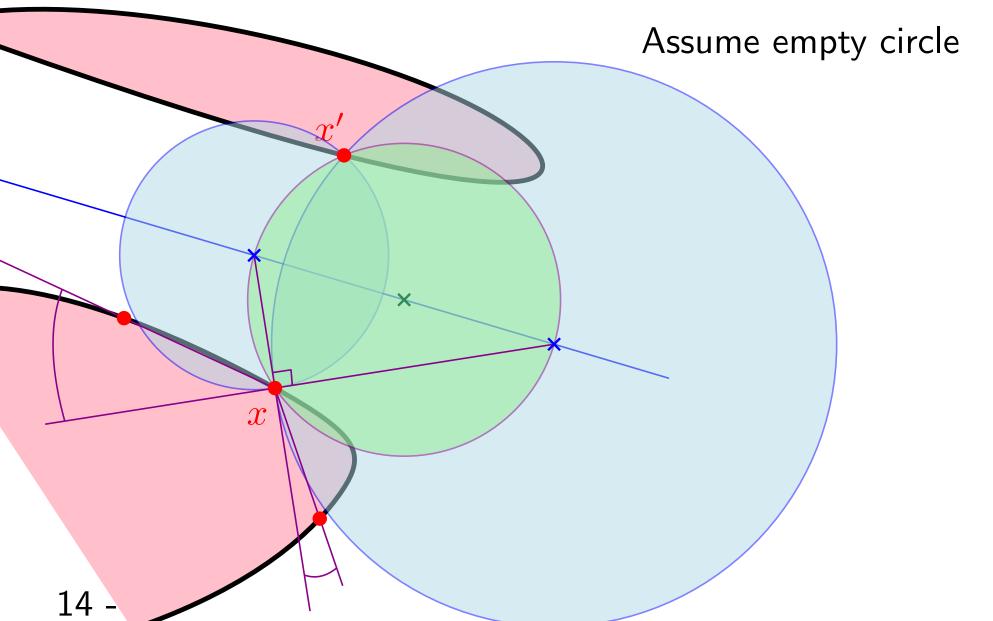
No Voronoi vertices there



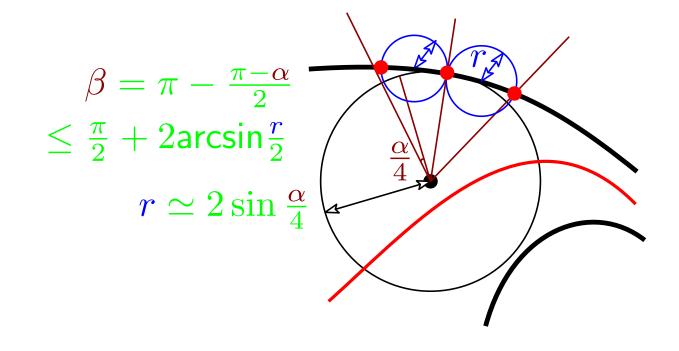
Theorem:  $0.25 \text{ sample} \Rightarrow \text{crust} \subset \text{wanted result}$ 



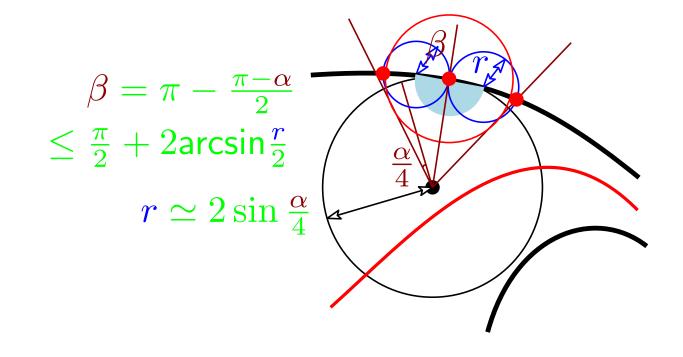
# $Reconstruction \qquad \qquad \text{Crust 2D} \quad \text{0.25 sample} \Rightarrow \text{crust} \subset \text{wanted result}$



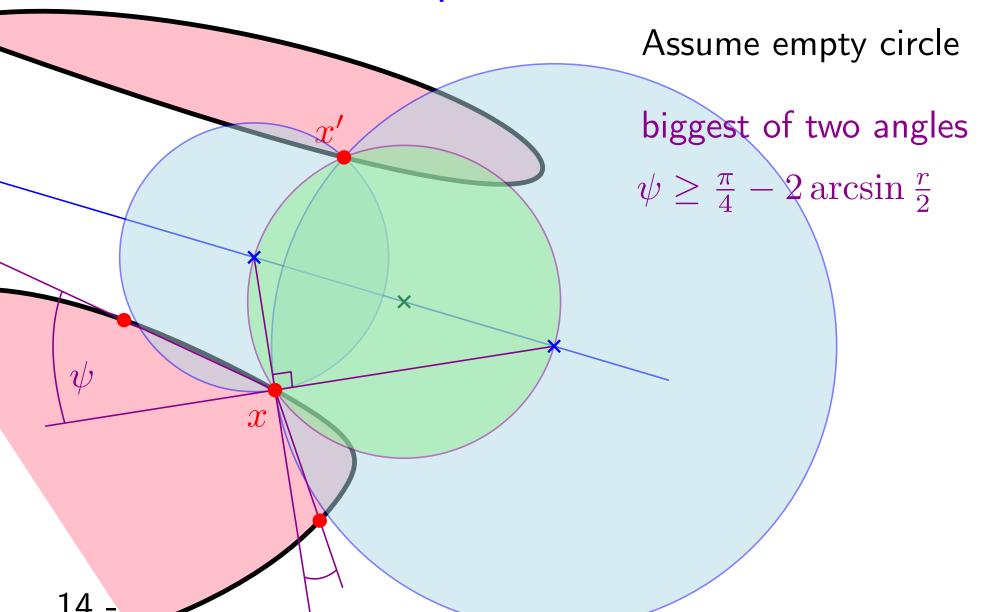
 $Crust\ 2D \qquad \text{0.25 sample} \Rightarrow crust \subset wanted\ result$ 



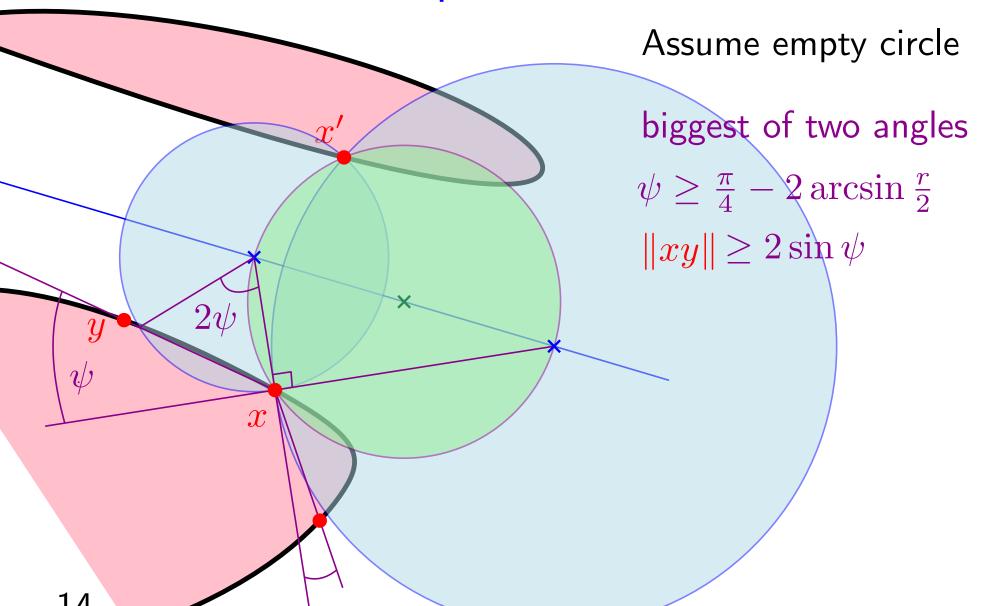
 $Crust \ 2D \qquad \text{0.25 sample} \Rightarrow crust \subset wanted \ result$ 



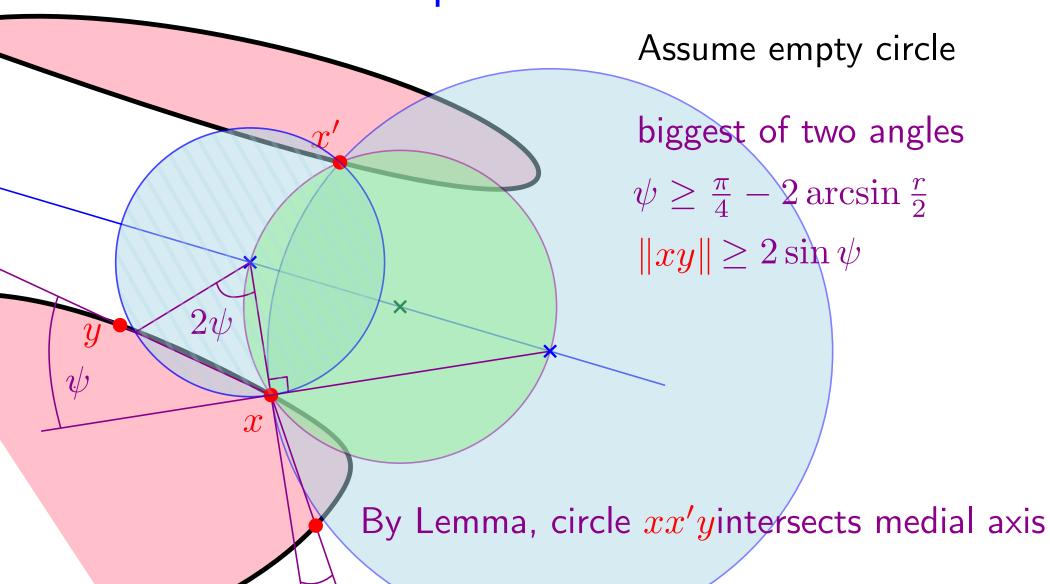
# $Reconstruction \qquad \qquad \text{Crust 2D} \quad \text{0.25 sample} \Rightarrow \text{crust} \subset \text{wanted result}$



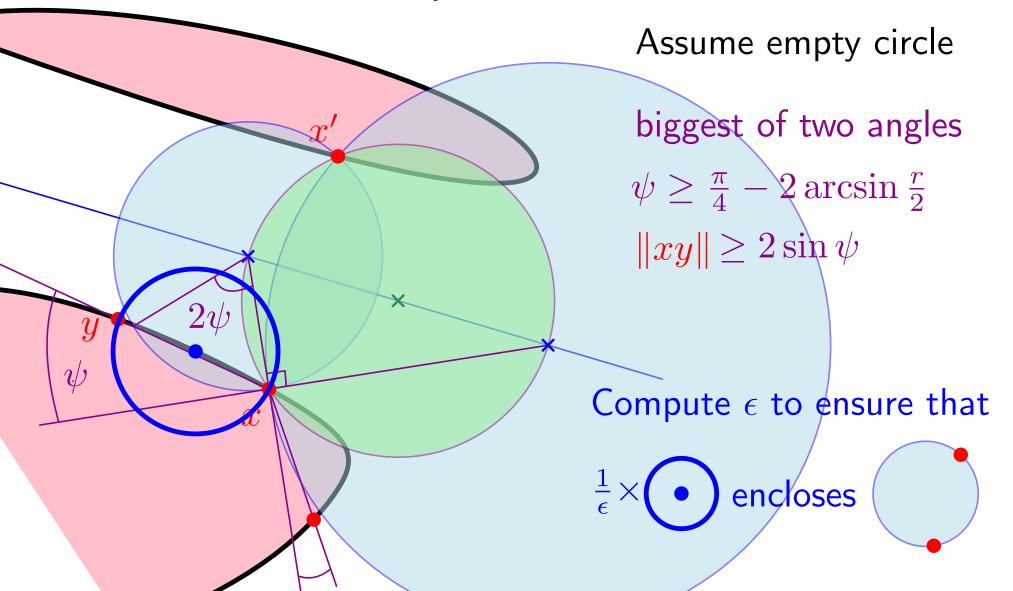
# $Reconstruction \qquad \qquad \text{Crust 2D} \quad \text{0.25 sample} \Rightarrow \text{crust} \subset \text{wanted result}$

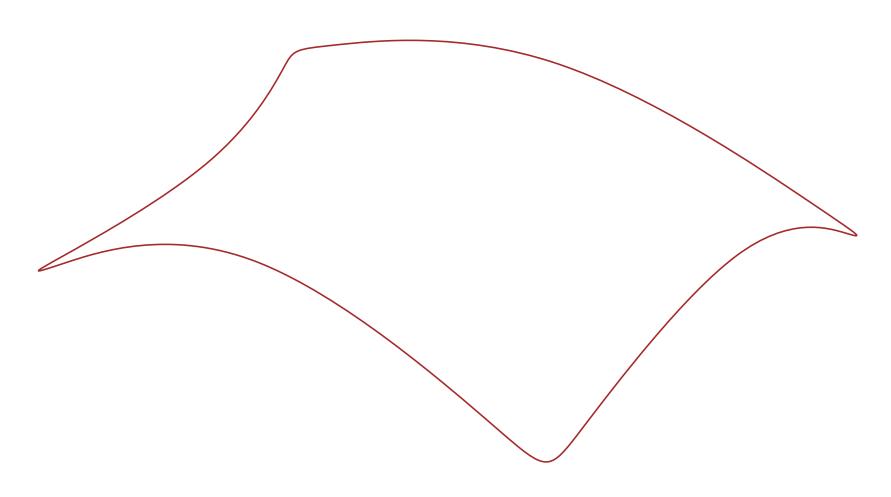


 $\begin{array}{ll} Crust \ 2D & \text{0.25 sample} \Rightarrow crust \subset \mathsf{wanted} \ \mathsf{result} \end{array}$ 

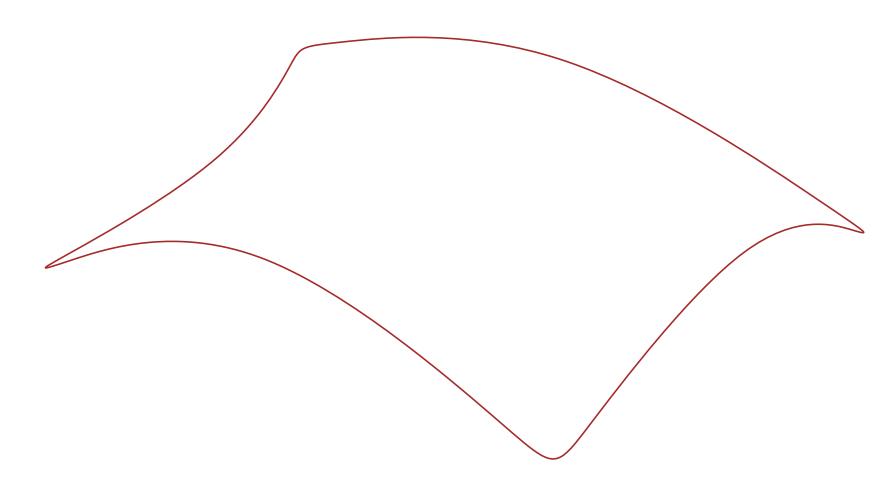


# $Reconstruction \qquad \qquad \text{Crust 2D} \quad \text{0.25 sample} \Rightarrow \text{crust} \subset \text{wanted result}$

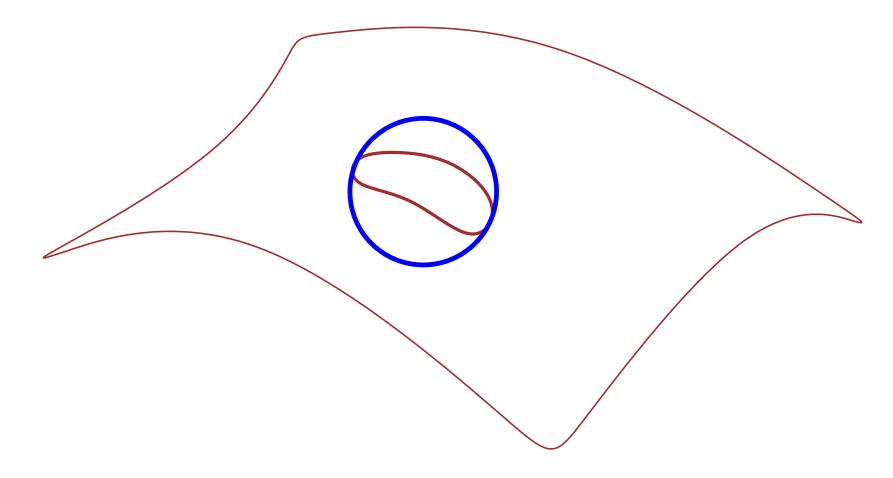




Difficulty: sliver

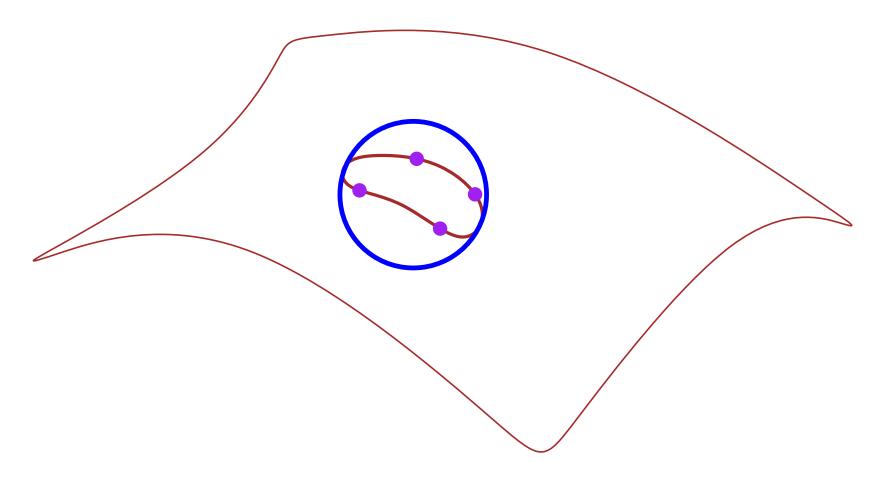


Difficulty: sliver small sphere



Difficulty: sliver

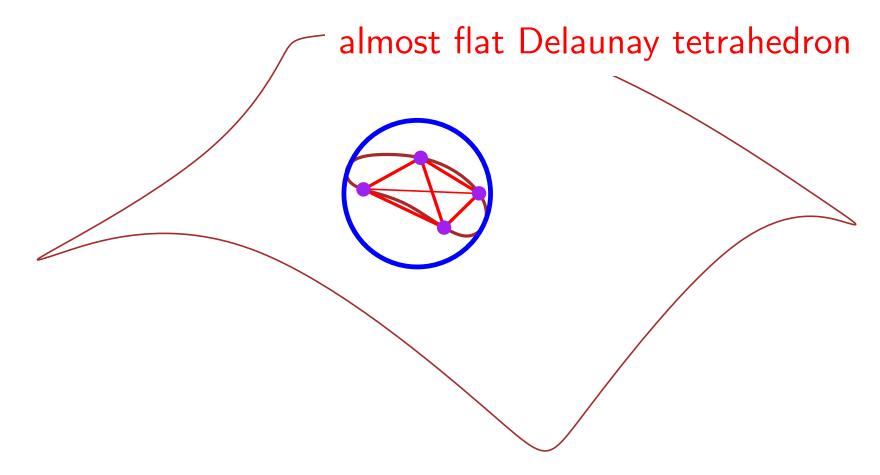
small sphere four sample points



3D

Difficulty: sliver

small sphere four sample points

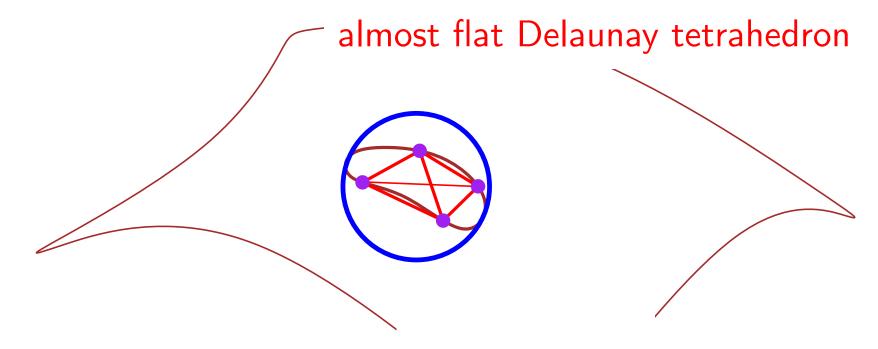


Difficulty: sliver small sphere four sample points almost flat Delaunay tetrahedron

Which triangle belongs to reconstruction?

Difficulty: sliver

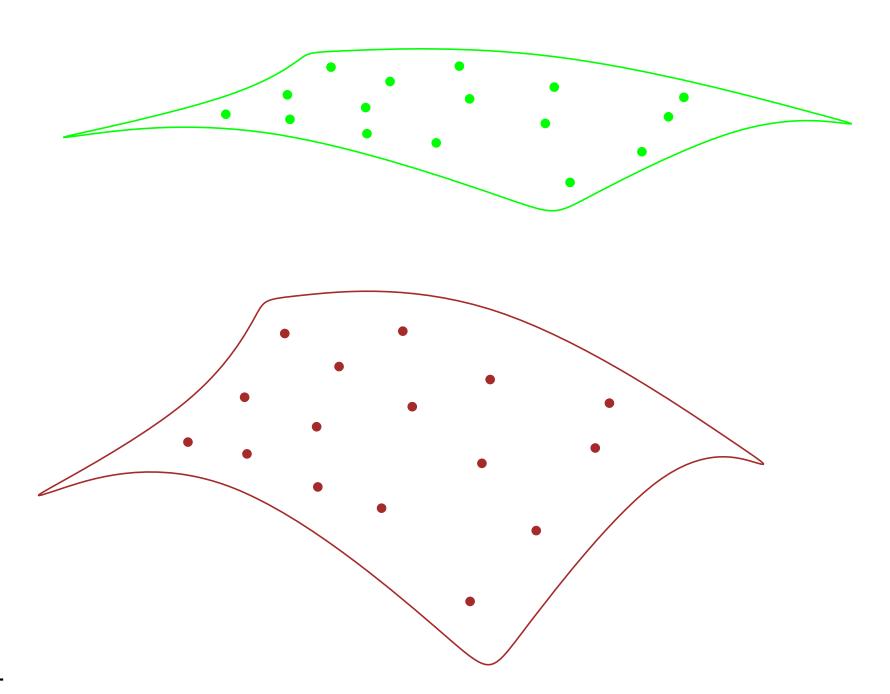
small sphere four sample points



Which triangle belongs to reconstruction?

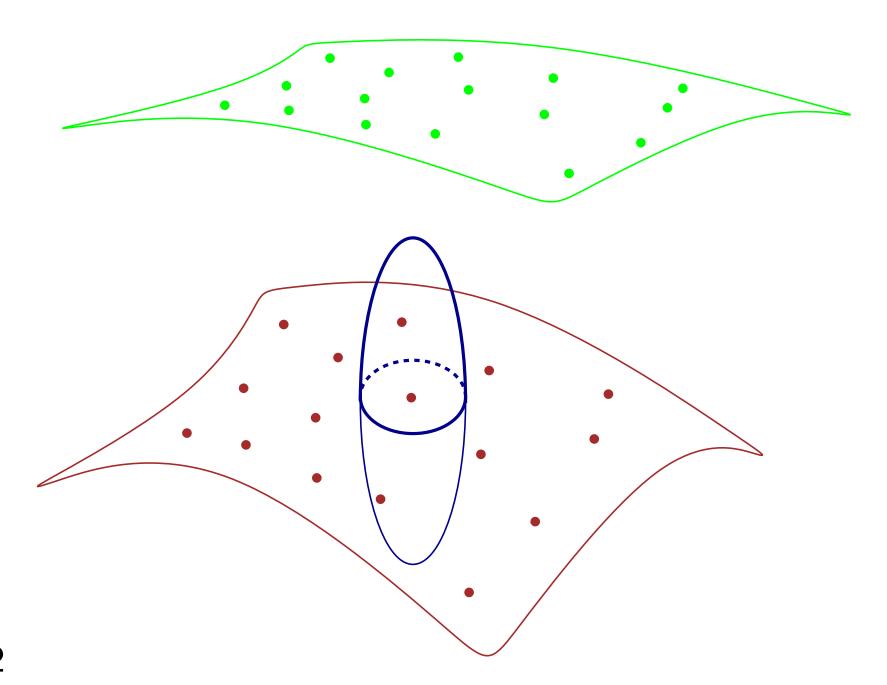
Crust: Voronoi vertices may kill useful triangles





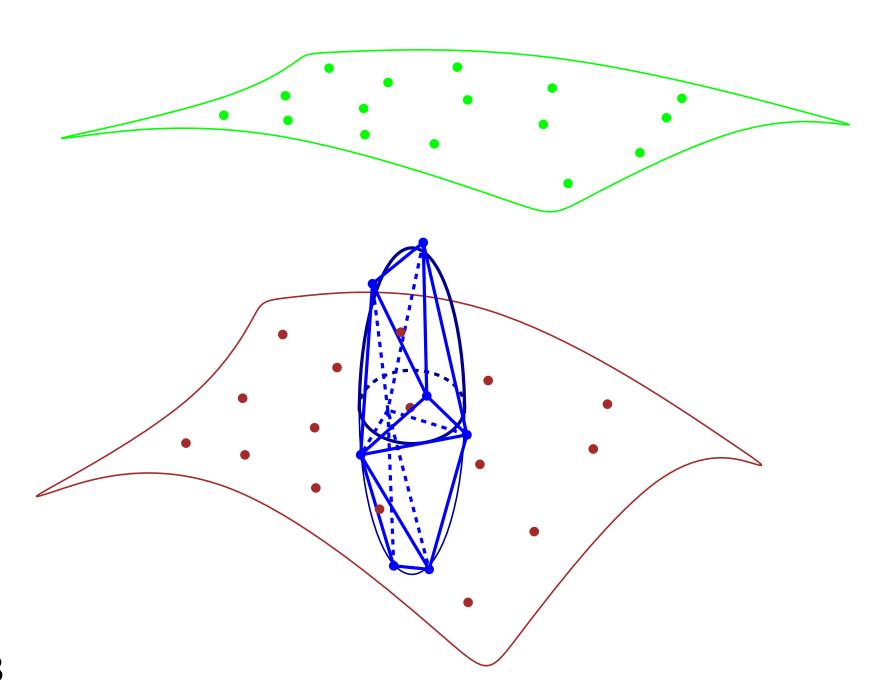
16 - 1





16 - 2

3D



16 - 3



