

# From Point Clouds to tessellated surfaces *explicit methods*

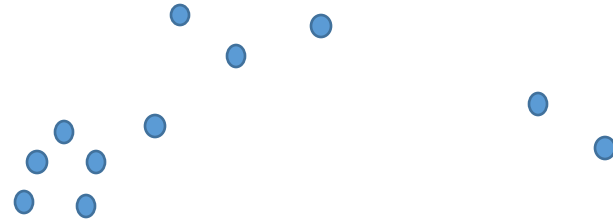


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Consiglio Nazionale delle Ricerche



# Problem Statement

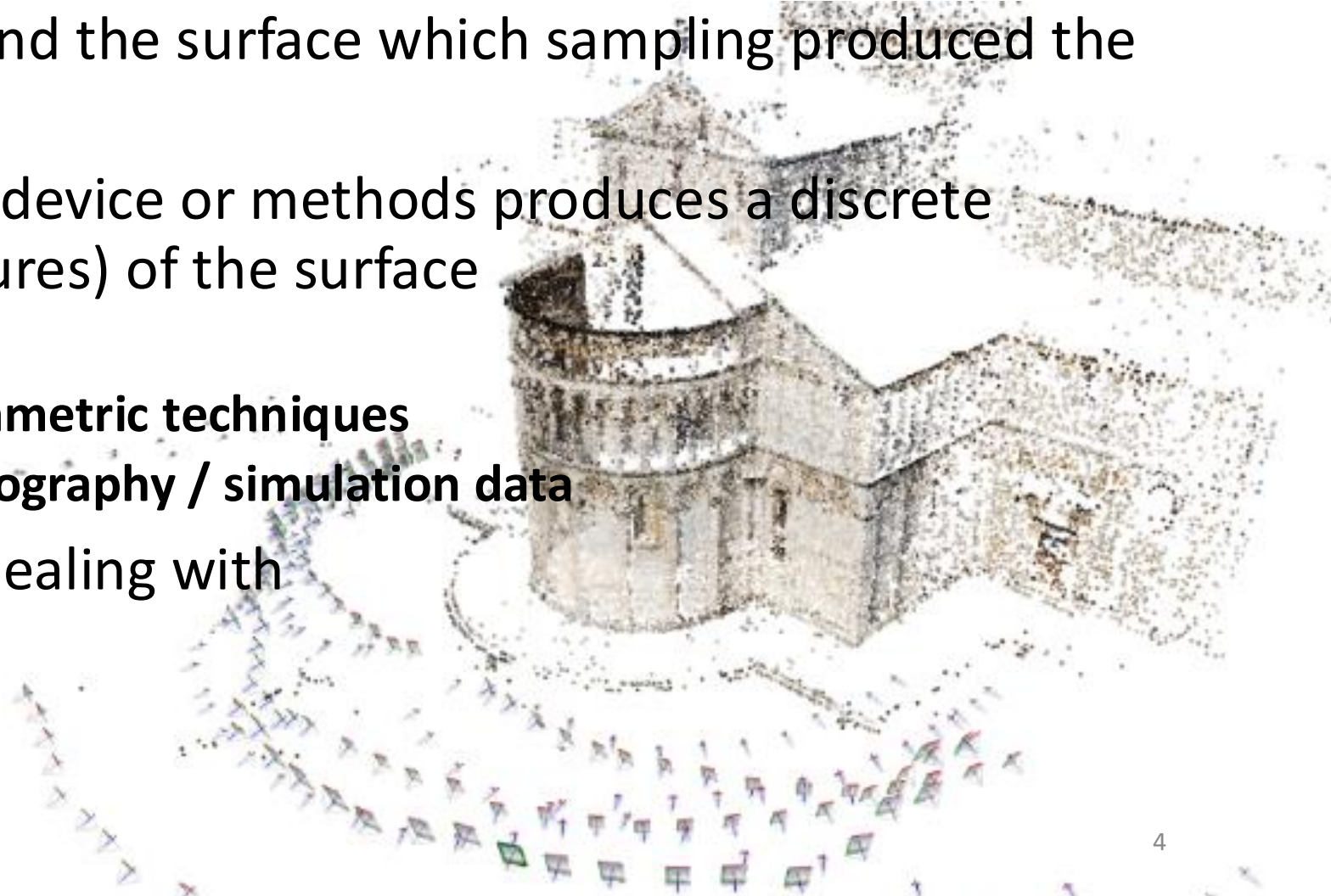
Given a Point cloud  $P = \{p_0, \dots, p_n\}$ ,  $p_i \in \mathbb{R}^3$ , find the mesh  $M$  that it *represents*



- Q1: It is a very ill posed problem, what does *represents* means?
- Q2: why do we care about this problem?

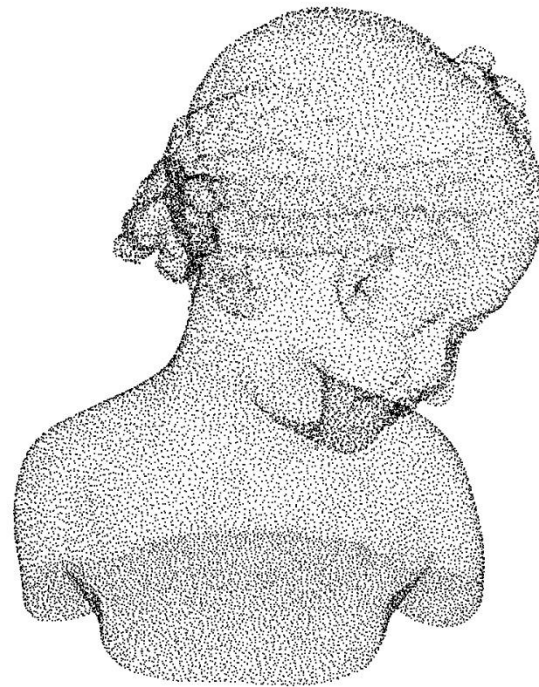
# Motivations

- A1: Ideally, we want to find the surface which sampling produced the input problem
  - A2: Every 3D acquisition device or methods produces a discrete puntual sampling (measures) of the surface
    - **Laser scanning**
    - **Image based/photogrammetric techniques**
    - **Computerized Axial Tomography / simulation data**
- ... So that is what we are dealing with



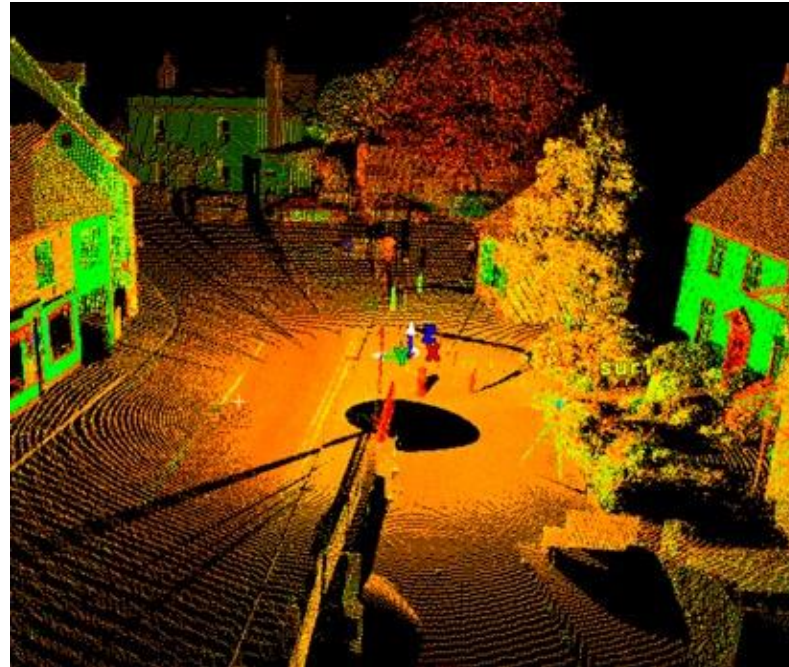
# Data sources

- Laser scanning with a turntable



# Data sources

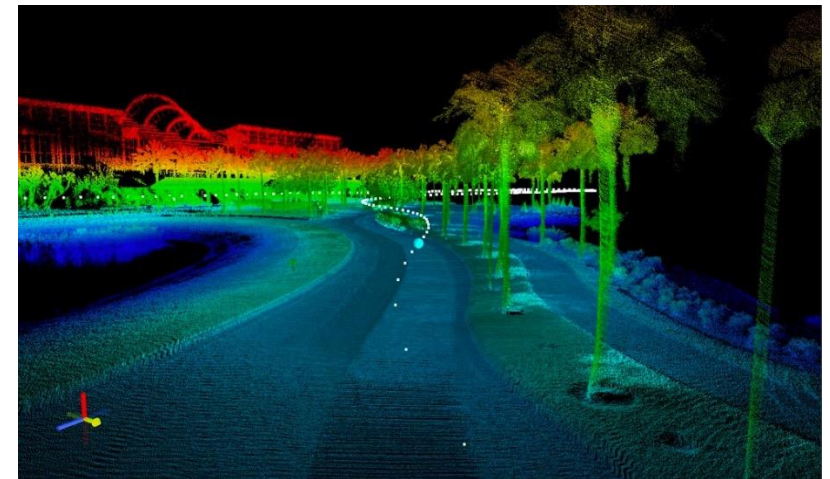
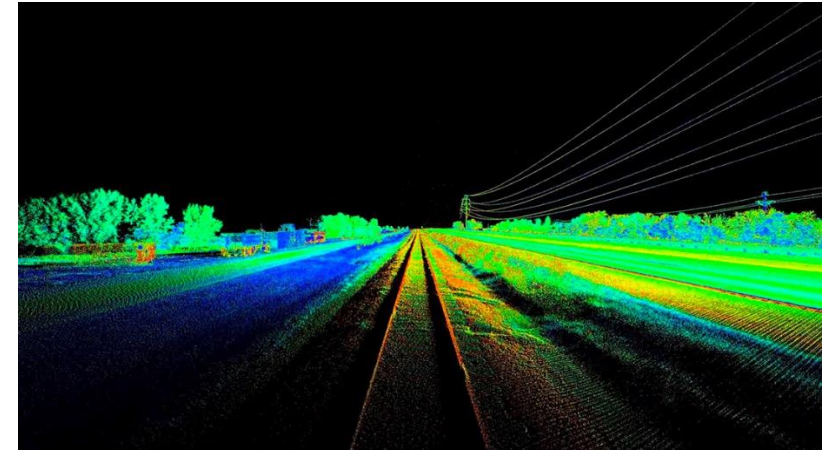
- Laser scanning with static laser scanner (range of 100, 200... meters)





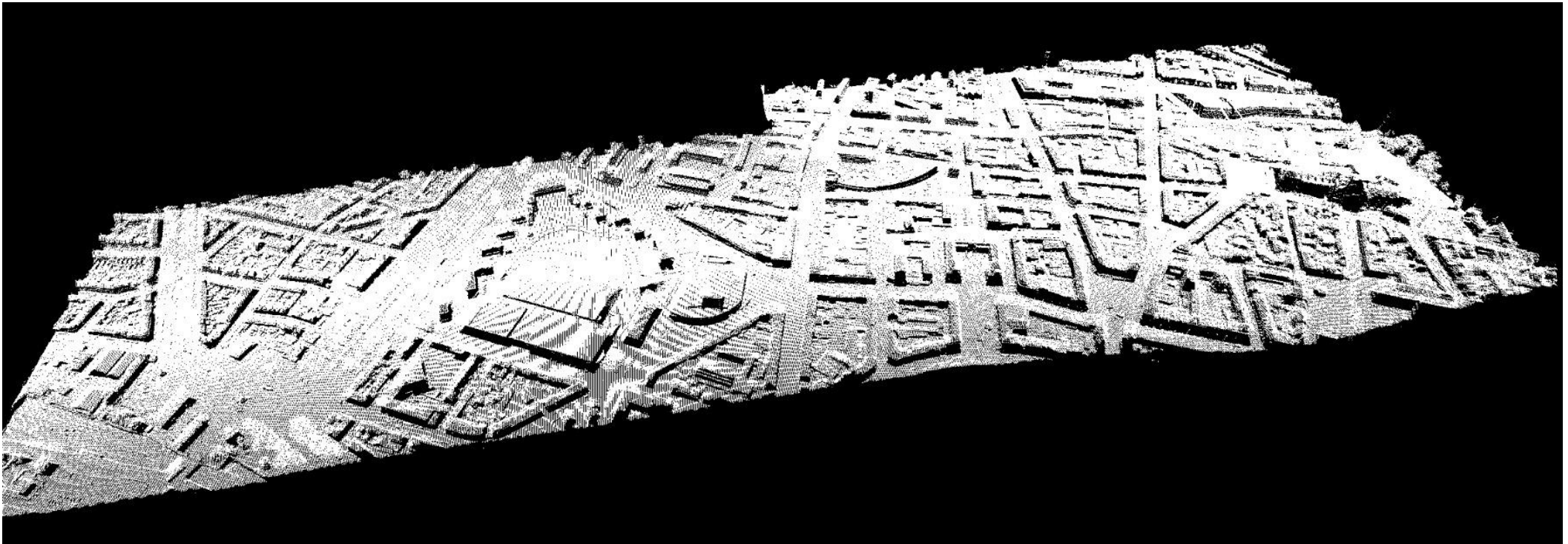
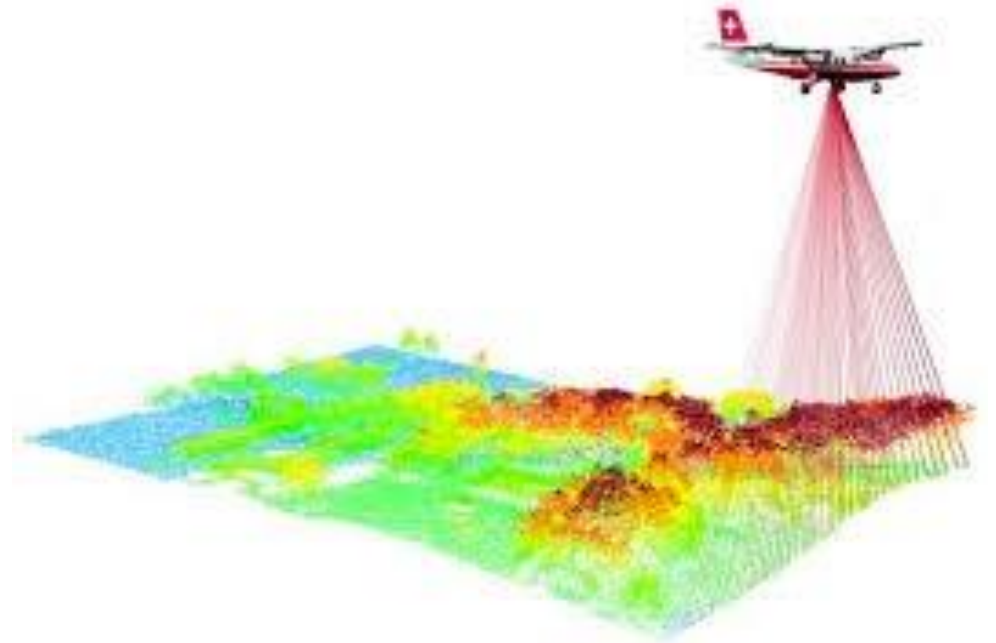
# Data sources

- Laser scanning – mobile scanners



# Data sources

- Laser scanning – airborne LiDAR





# Data sources

- Structure from Motion (SfM) and Multi-view stereo (MVS)

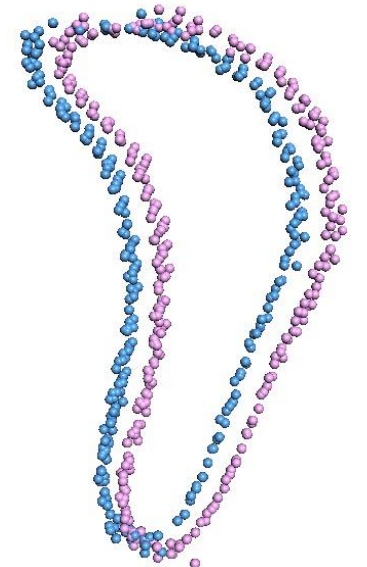
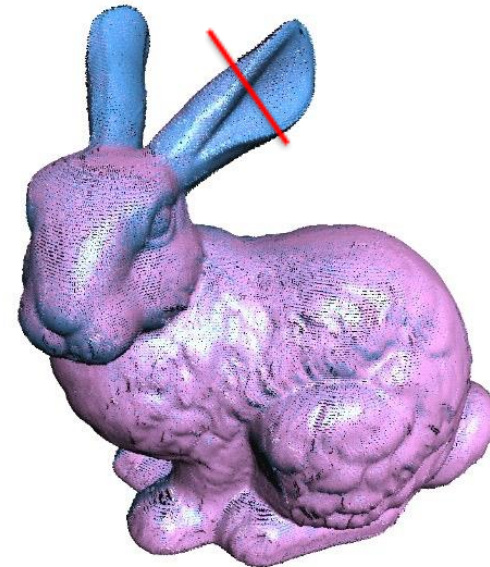
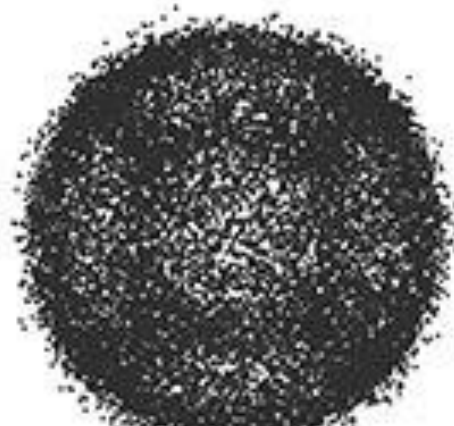
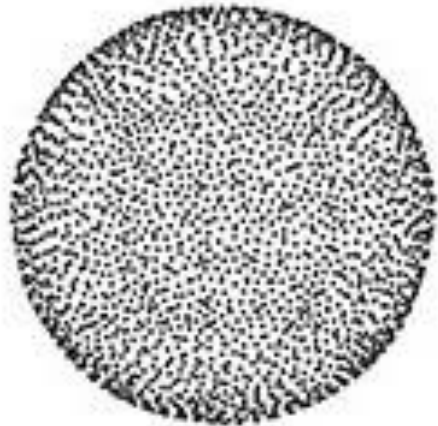




# Challenges

The positions and normals are generally noisy

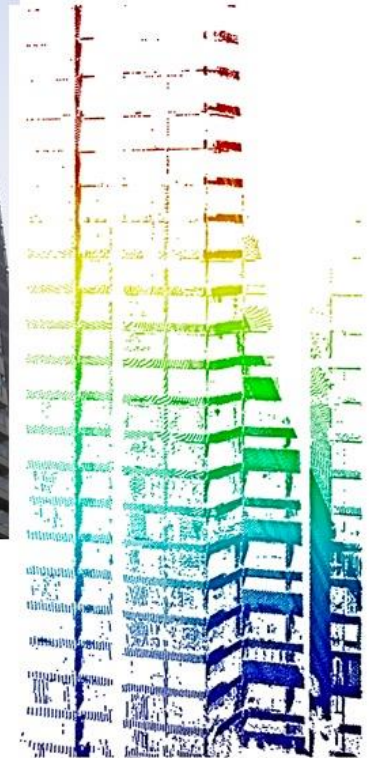
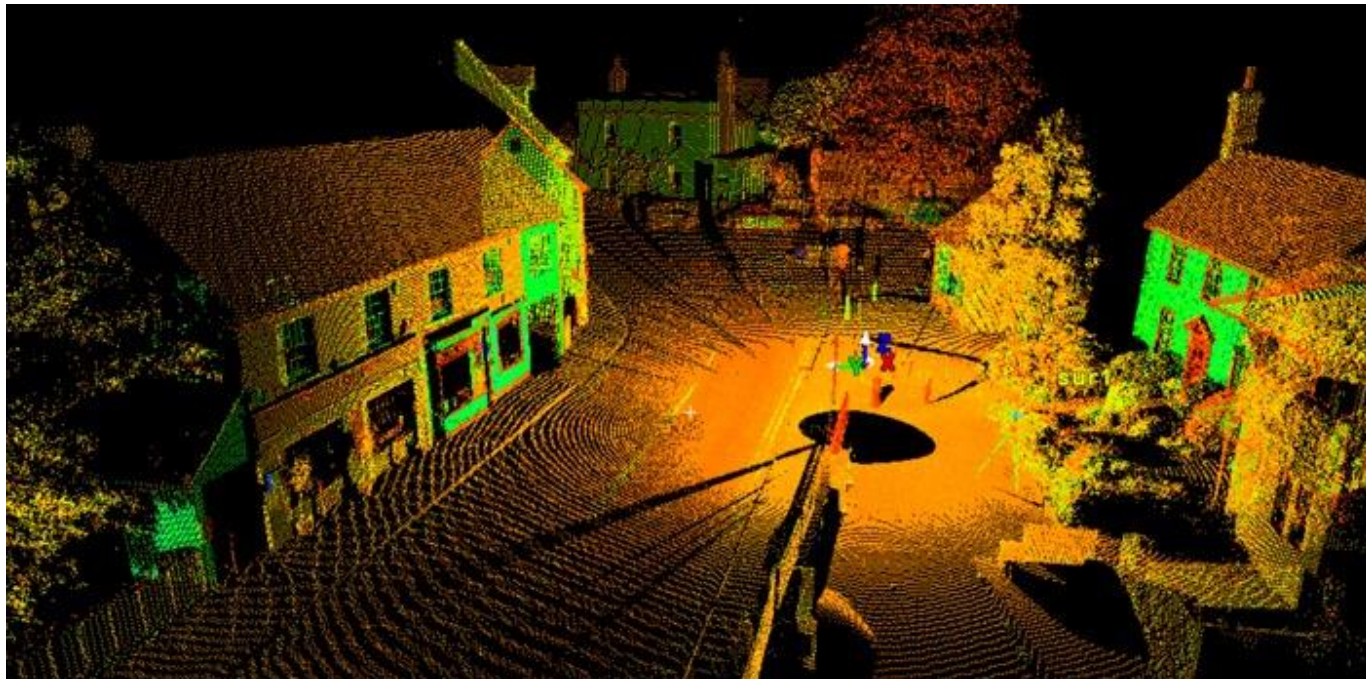
- Sampling inaccuracy
- Scan misregistration



# Challenges

The point samples may not be uniformly distributed

- Oblique scanning angles
- Laser energy attenuation





# Challenges

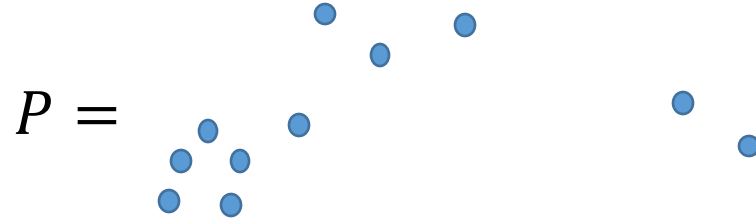
## Missing data

- Material properties, inaccessibility, occlusion, etc.



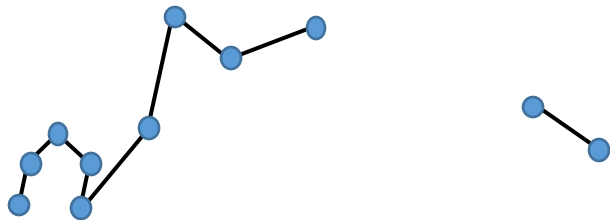


# Explicit and Implicit Methods



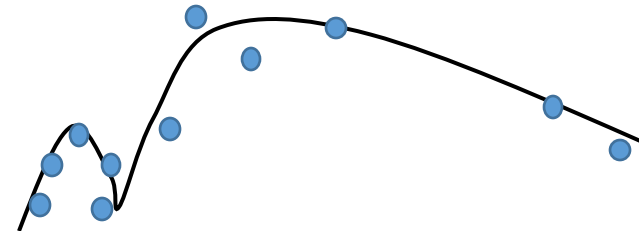
## Explicit methods

Build a tessellation over the point cloud.  
The points become to vertices of the mesh



## Implicit Methods

1. Define the surface implicitly, as the zeroes of a function  $f_P: \mathbb{R}^3 \rightarrow \mathbb{R}^3$
2. Tessellate  $\{f_P(x) = 0\}$



# Explicit and Implicit Methods

## Explicit methods

Build a triangulation over the point cloud. The points map to vertices of the mesh

- less robust to noise
- require a dense and even sampling
- Generally easier to implement

## Implicit Methods

1. Define the surface implicitly, as the zeroes of a function

$$f_P: \mathbb{R}^3 \rightarrow \mathbb{R}$$

2. Tessellate  $\{f_P(x) = 0\}$

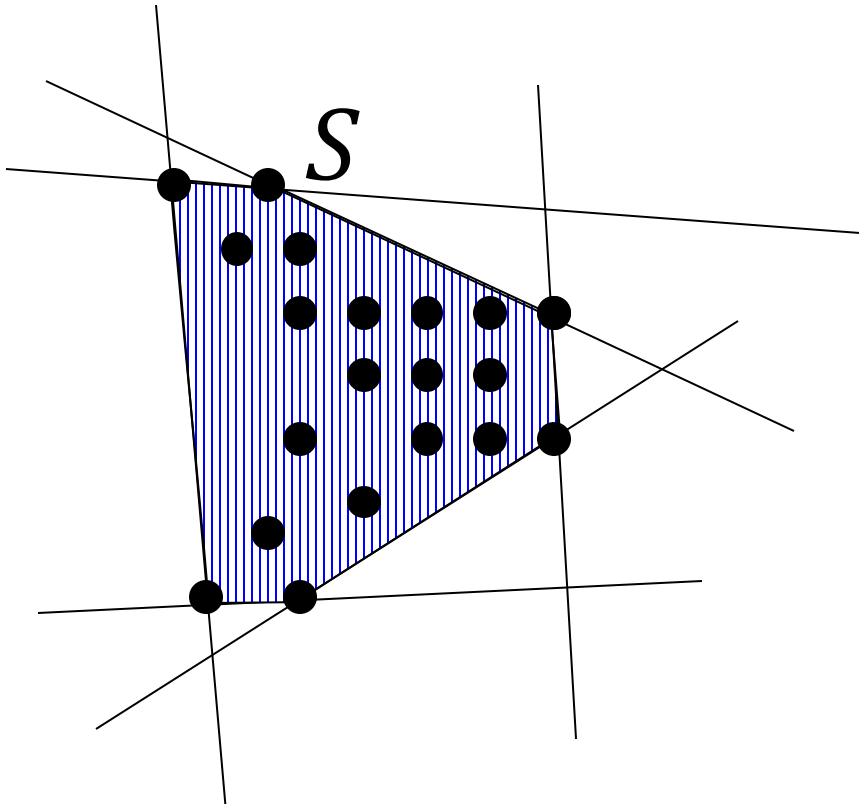
- more robust to noise
- more resilient to noise and uneven sampling

# Alpha Shapes [Edelsbrunner83]

## Convex Hull

$$CH(S) = \mathbb{R}^d \setminus \bigcup EH(S)$$

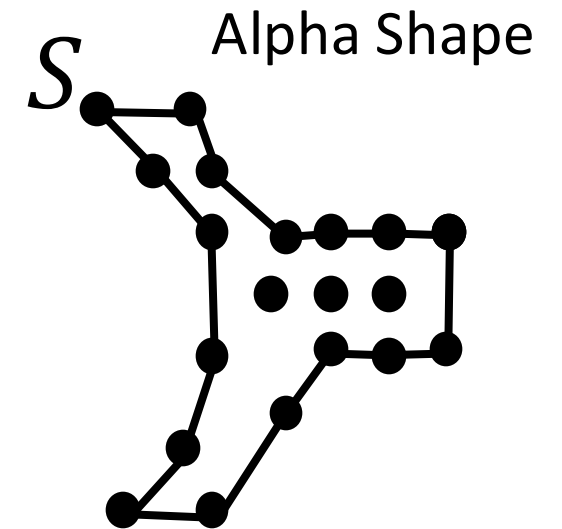
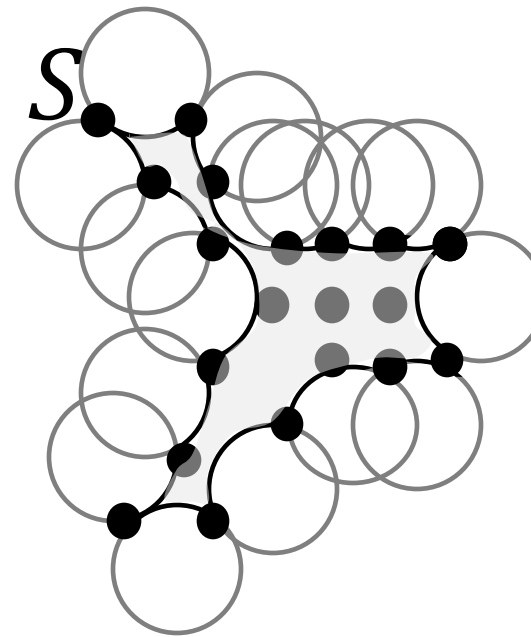
$EH(S)$ : halfspace not containing any point in  $S$



## Alpha Hull

$$\alpha H(S) = \mathbb{R}^d \setminus \bigcup EB_\alpha(S)$$

$EB_\alpha(S)$ : ball with radius  $\alpha$  not containing any point in  $S$





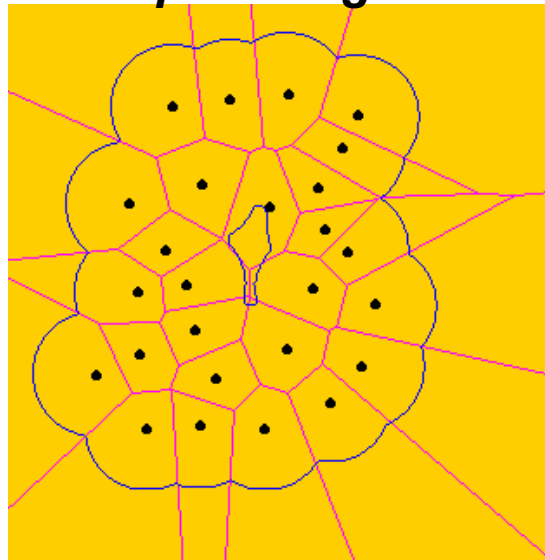
# Computing Alpha Shapes

- **Alpha Diagram:** Voronoi Diagram restricted to space closest than  $\alpha$  to one point in  $S$
- **Alpha Complex:** Subset of Delaunay Triangulation computed as the dual of the alpha diagram

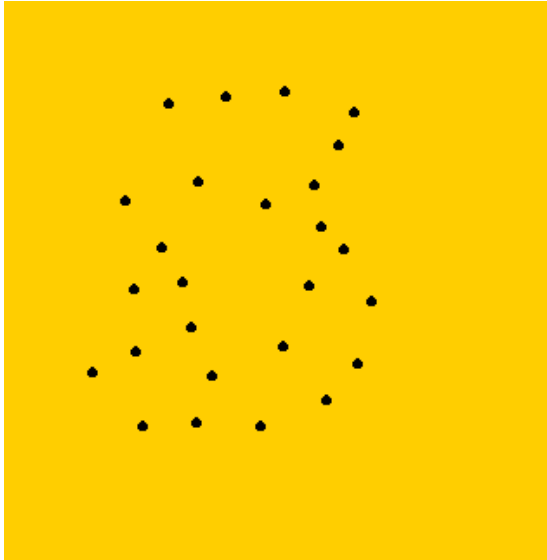
# Computing Alpha Shapes

- **Alpha Diagram:** Voronoi Diagram restricted to space closest than  $\alpha$  to one point in  $S$
- **Alpha Complex:** Subset of Delaunay Triangulation computed as the dual of the alpha diagram

*Alpha Diagram*

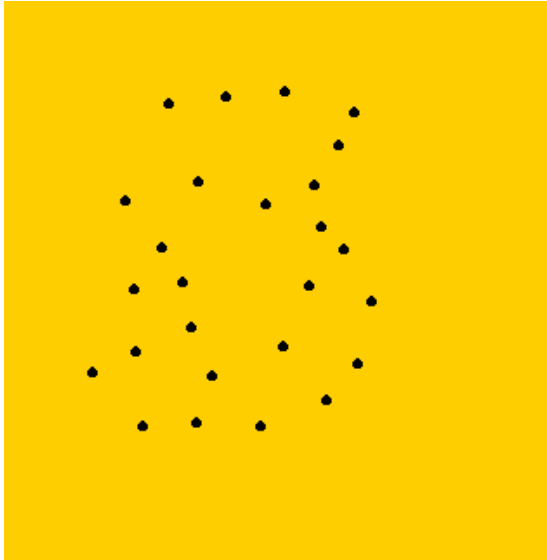


***Point Set***

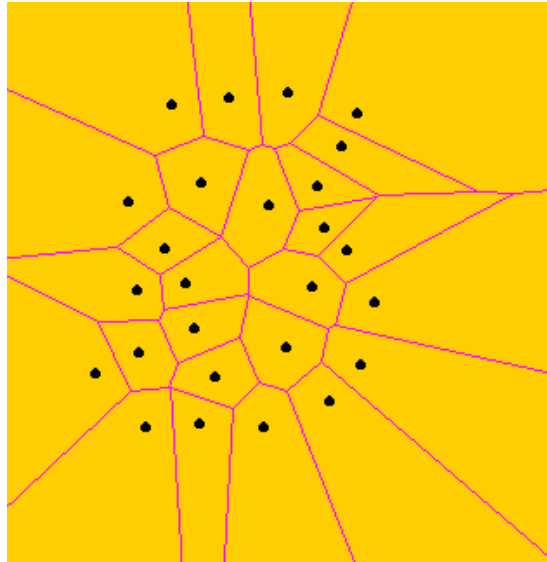




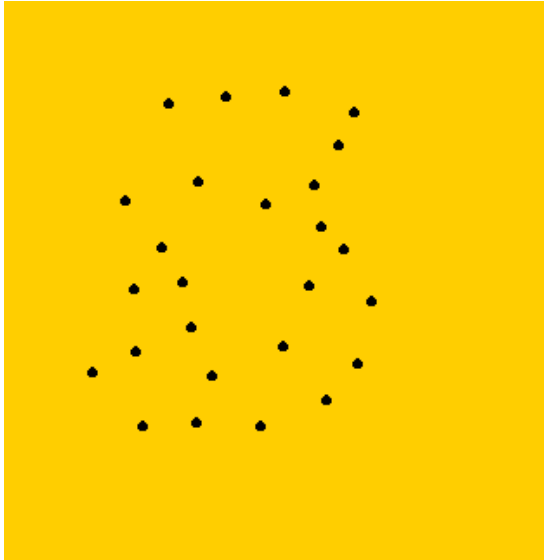
*Point Set*



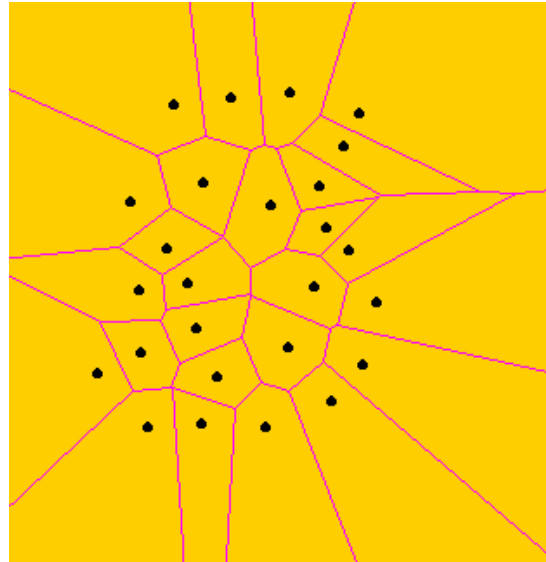
*Voronoi Diagram*



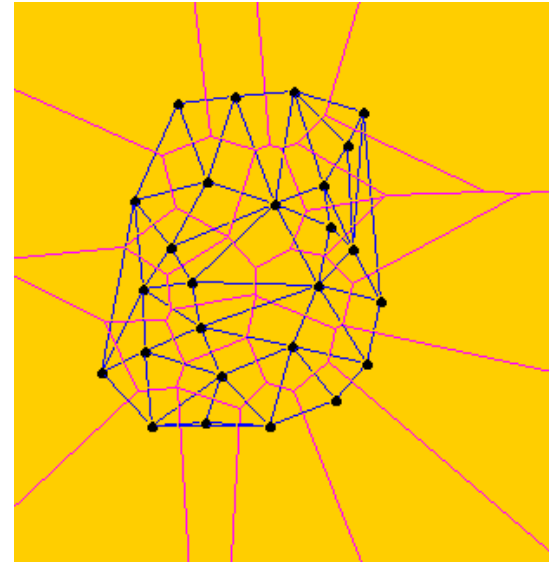
*Point Set*



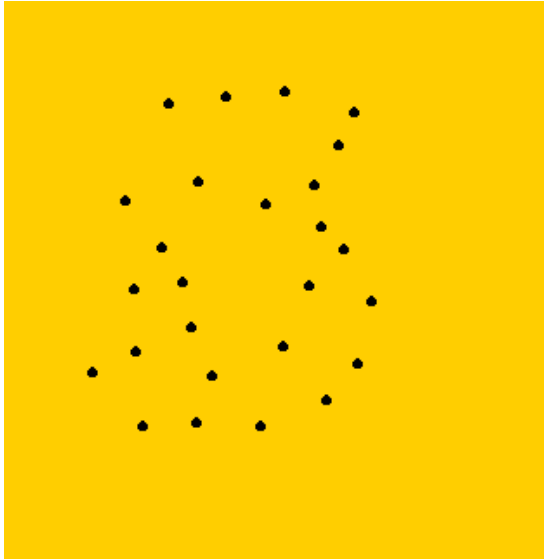
*Voronoi Diagram*



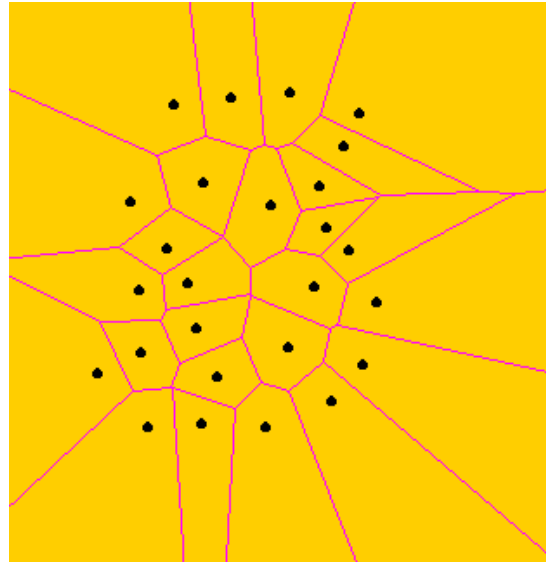
*Delaunay Triangulation*



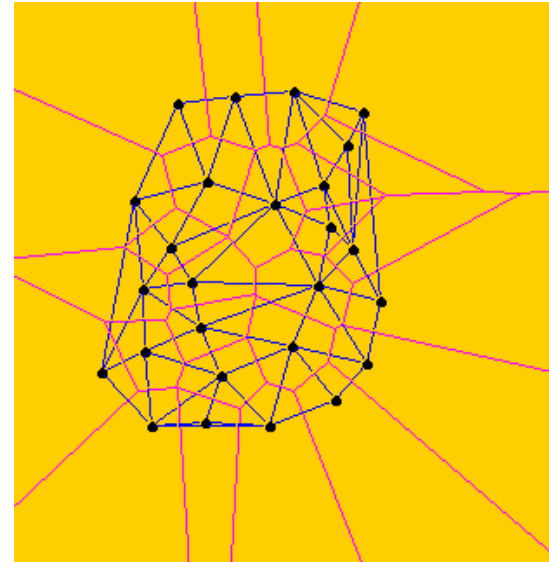
***Point Set***



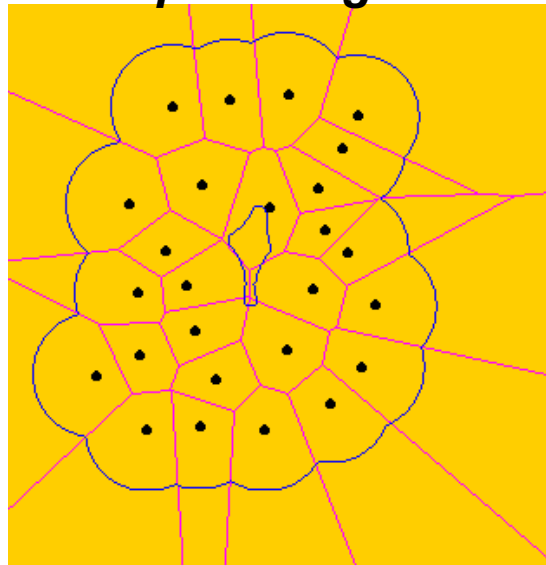
***Voronoi Diagram***



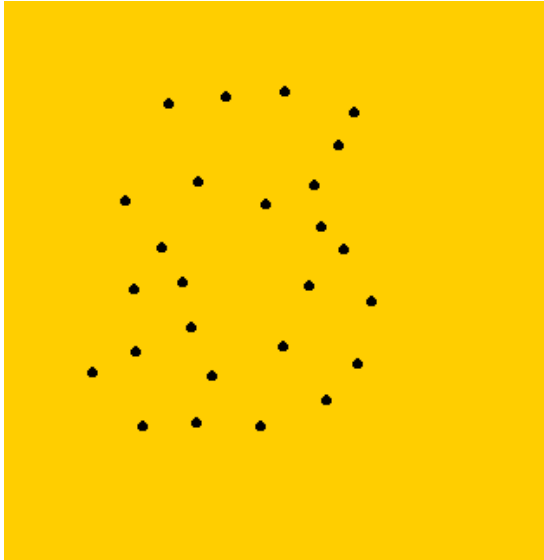
***Delaunay Triangulation***



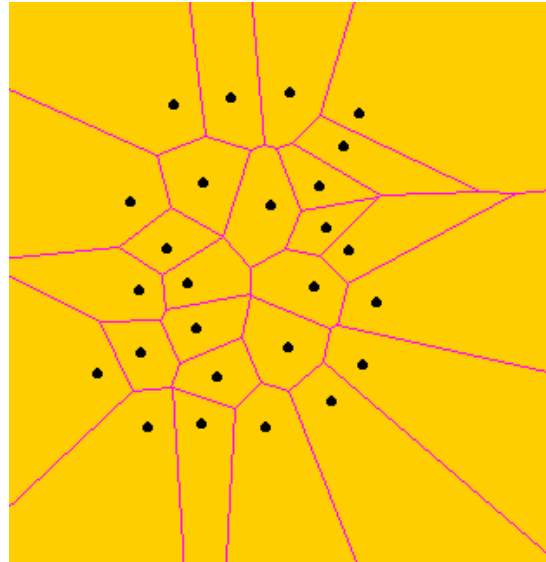
***Alpha Diagram***



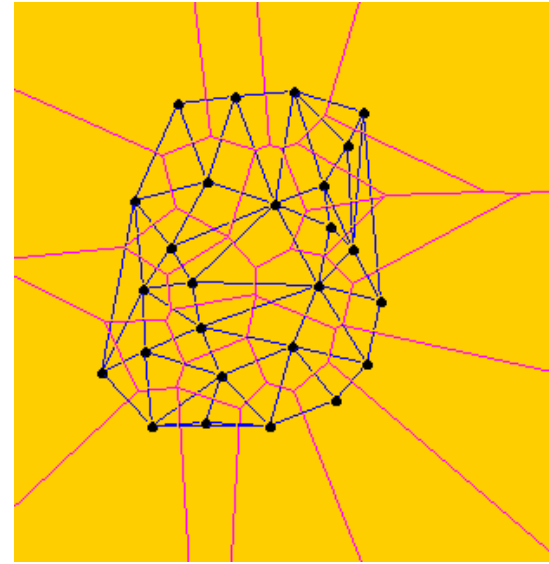
***Point Set***



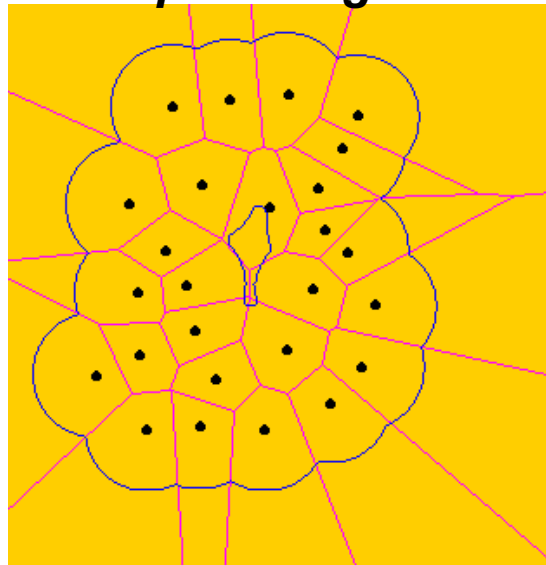
***Voronoi Diagram***



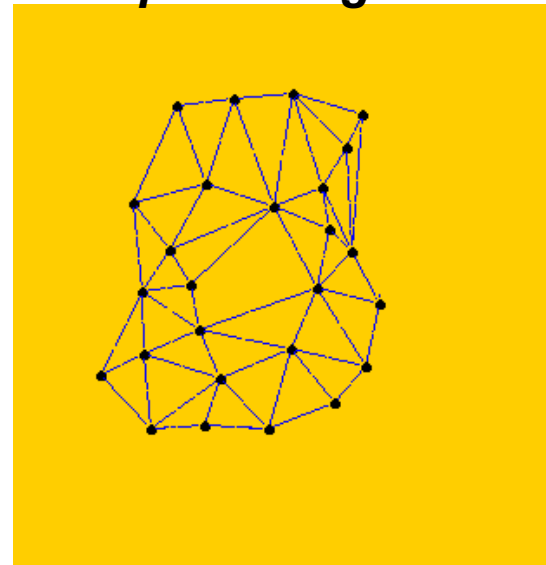
***Delaunay Triangulation***



***Alpha Diagram***

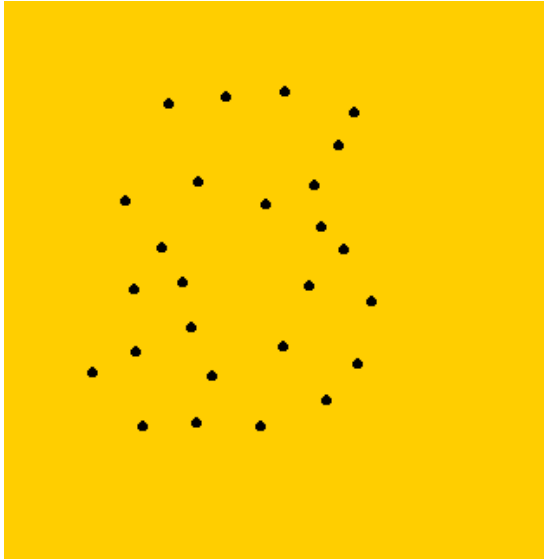


***Alpha triangulation***

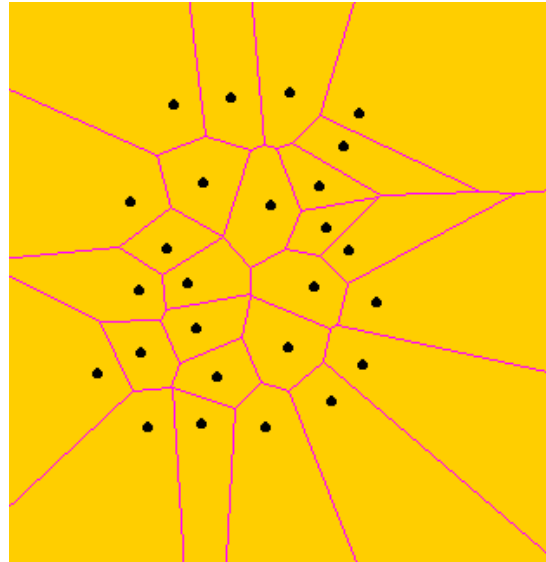




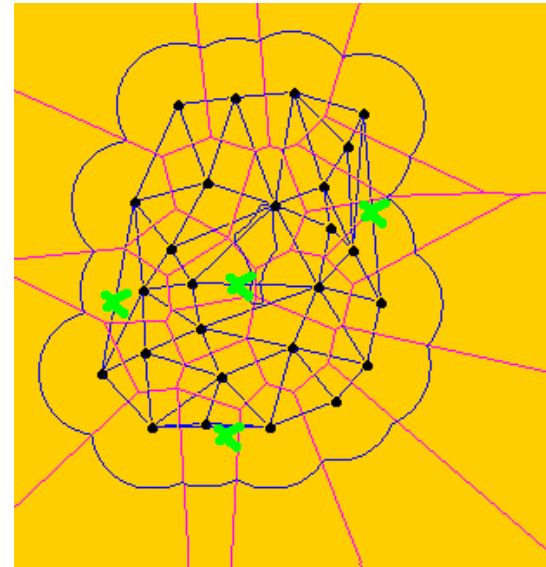
***Point Set***



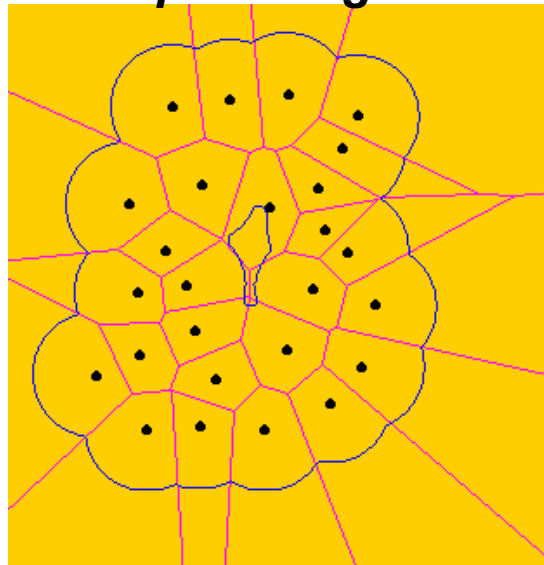
***Voronoi Diagram***



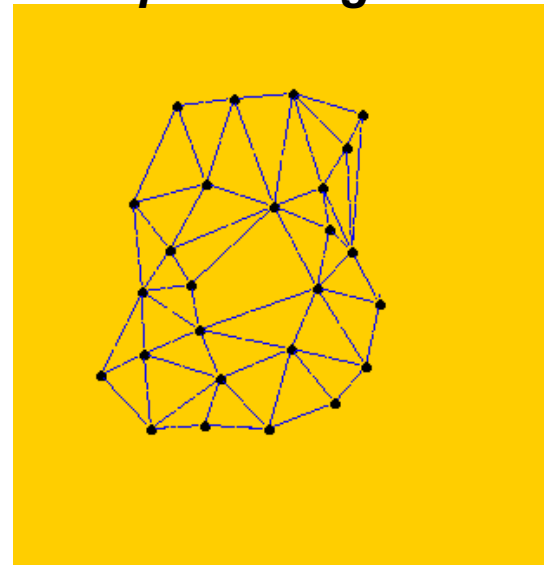
***Delaunay Triangulation***



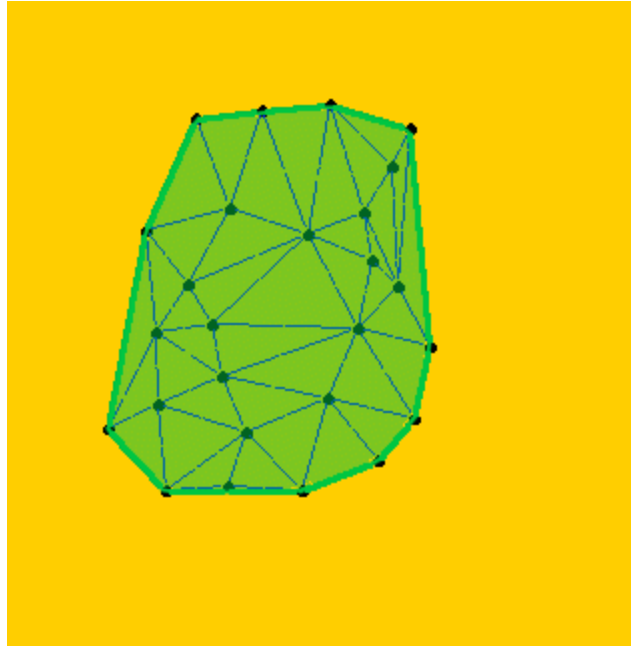
***Alpha Diagram***



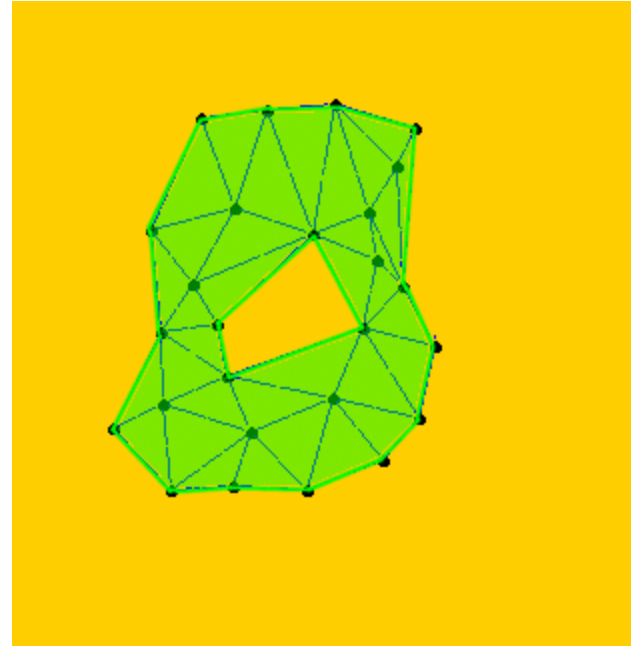
***Alpha triangulation***



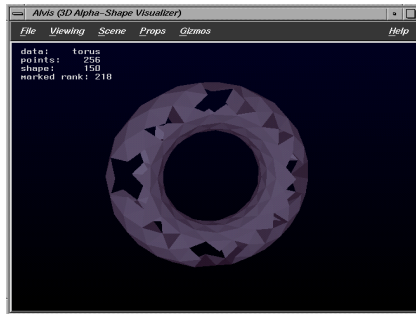
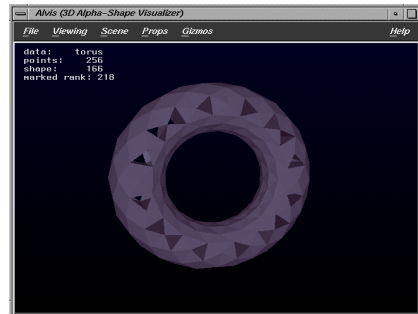
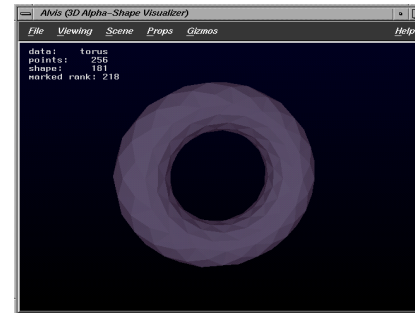
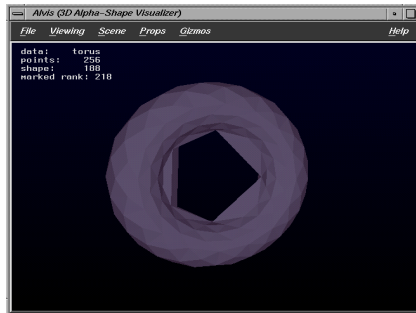
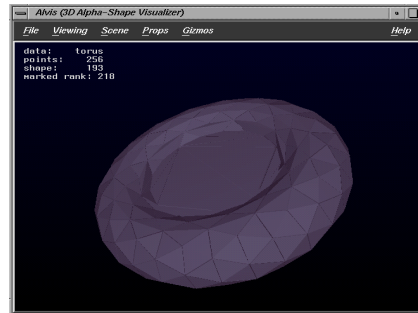
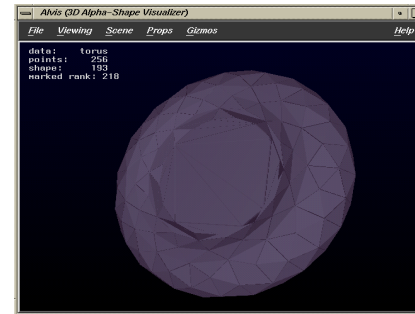
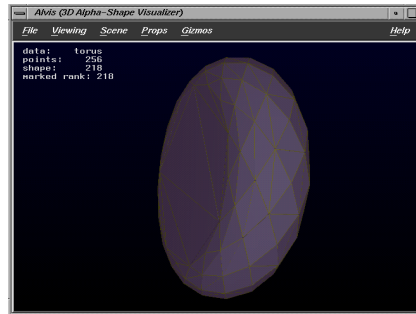
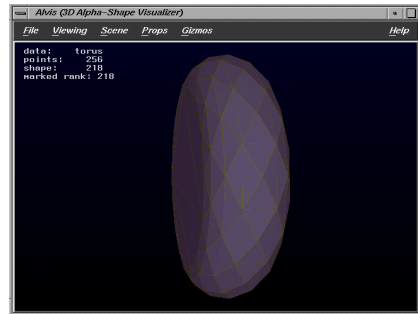
## Delaunay triangulation



## Alpha Complex



- $\alpha = 0$        $\alpha$ -shape is the point set
- $\alpha \rightarrow \infty$        $\alpha$ -shape tends to the convex hull
- A finite number of thresholds  $\alpha_0 < \alpha_1 < \dots < \alpha_n$  defines all possible shapes (at most  $2n^2 - 5n$ )



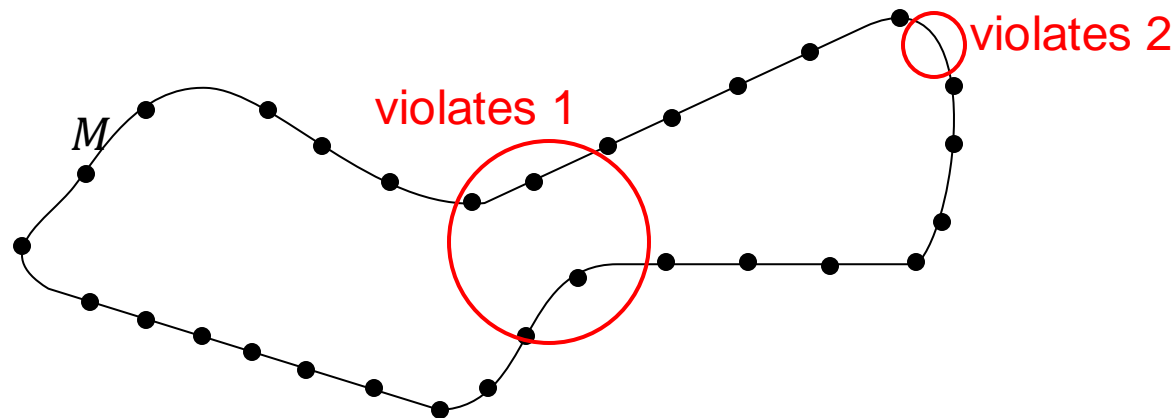
# Sampling Conditions for Alpha Shapes

## Proposition

Given a smooth manifold  $M$  and a sampling  $S$ ,  
if it holds that

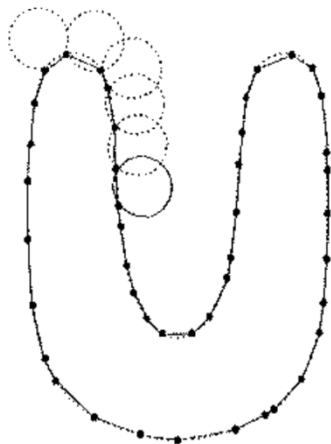
1. The intersection of any ball of radius  $\alpha$  with  $M$  is homeomorphic to a disk
2. Any ball of radius  $\alpha$  centered in the manifold contains at least one point of  $S$

Then the  $\alpha$ -shape of  $S$  is homeomorphic to  $M$

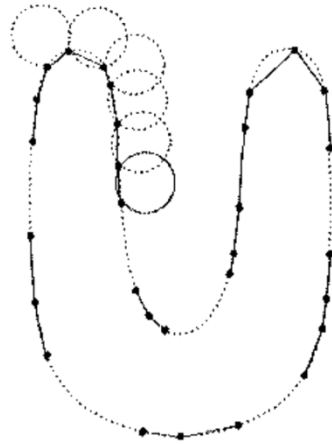


# Ball Pivoting [bernardini99]

- Motivations
  - Alpha shapes computation is fairly cumbersome
  - May produce non manifold surfaces
- Core idea: approximate the alpha shapes just «rolling» a ball of radius  $\alpha$  on the sampling  $S$
- Same sampling conditions as  $\alpha$ -shape holds



OK



Low sampling density

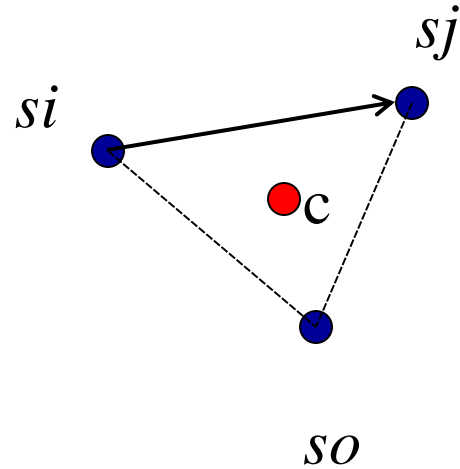


Curvature grater than  $\frac{1}{\alpha}$

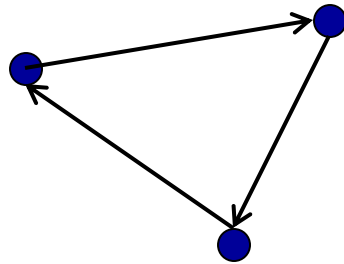


# The algorithm

- Edge  $(s_i, s_j)$ 
  - Opposite point  $s_o$ , center of empty ball  $c$
  - Edge: “Active”, “Boundary”



# Pivoting example



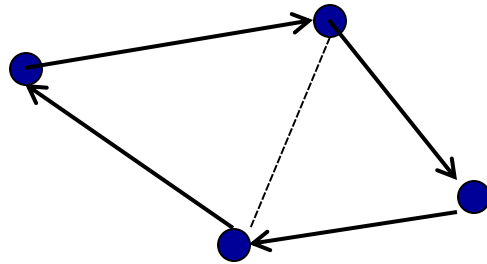
Initial seed triangle:

Empty ball of radius  $\rho$  passes through the three points

Active edge  
→

● Point on front

# Pivoting example

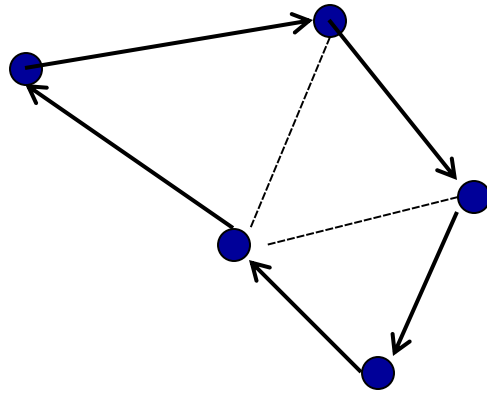


Ball pivoting around active edge

Active edge  
→

● Point on front

# Pivoting example

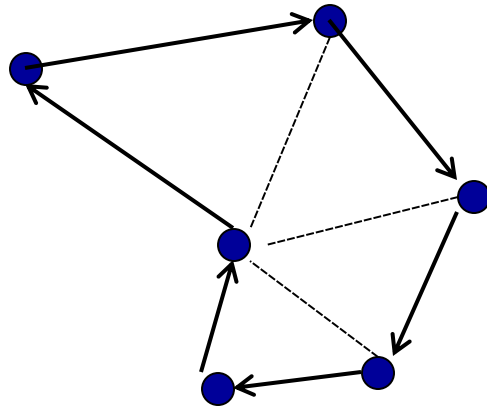


Ball pivoting around active edge

Active edge  
→

● Point on front

# Pivoting example



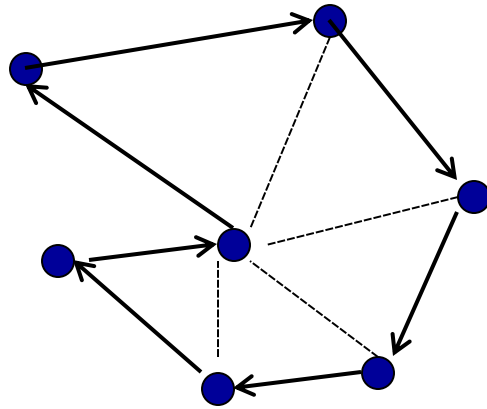
Ball pivoting around active edge

Active edge  
→

● Point on front



# Pivoting example

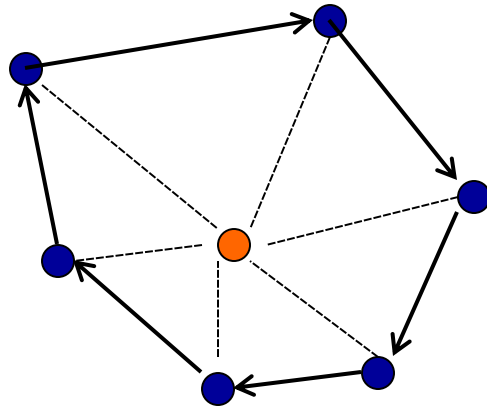


Ball pivoting around active edge

Active edge  
→

● Point on front

# Pivoting example



Ball pivoting around active edge

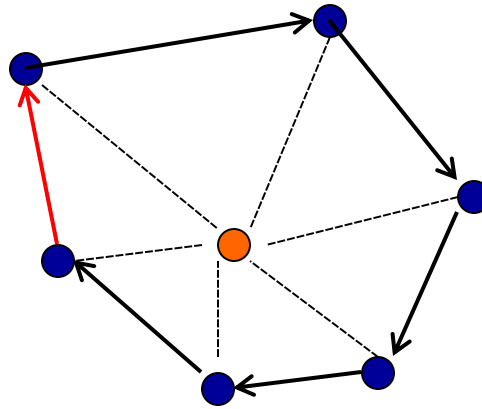
Active edge  
→

● Point on front

● Internal point

# Pivoting example

Boundary edge



Ball pivoting around active edge  
No pivot found

Active edge

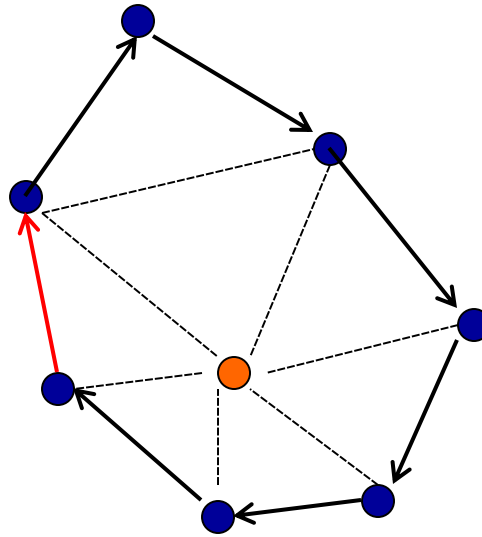


● Point on front

● Internal point

# Pivoting example

Boundary edge



Ball pivoting around active edge

Active edge

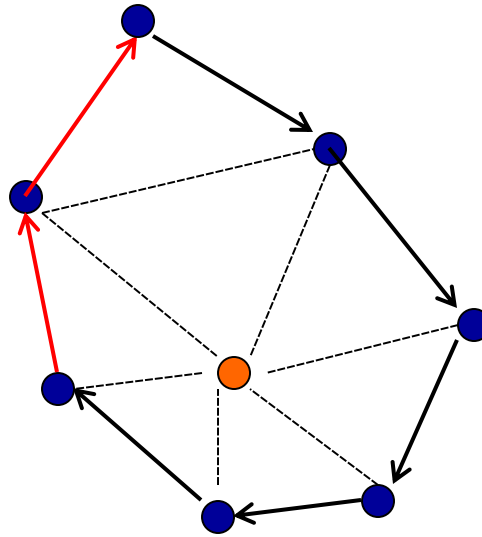


● Point on front

● Internal point

# Pivoting example

Boundary edge



Ball pivoting around active edge  
No pivot found

Active edge

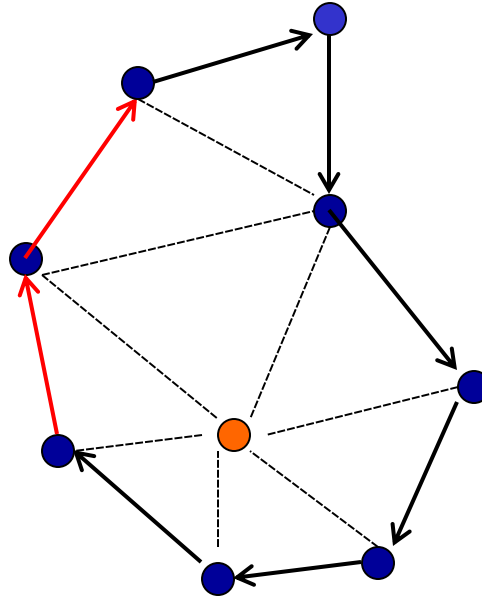


● Point on front

● Internal point

# Pivoting example

Boundary edge



Ball pivoting around active edge

Active edge

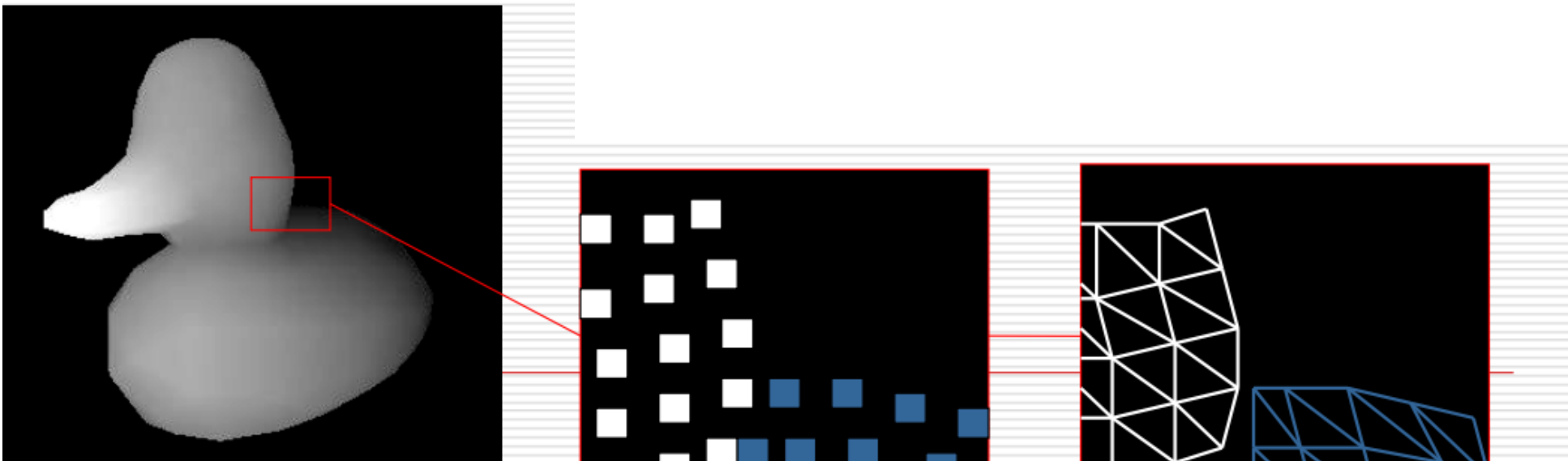


● Point on front

● Internal point

# Not only point clouds: the Range Maps

- 3D scanners produce a number of dense structured height fields, that is, a regular  $(X,Y)$  grid of points with a distance  $Z$  value. These are called **range maps**
- Trivial to triangulate but: How to merge different range maps?





# Mesh Zippering [Turk94]

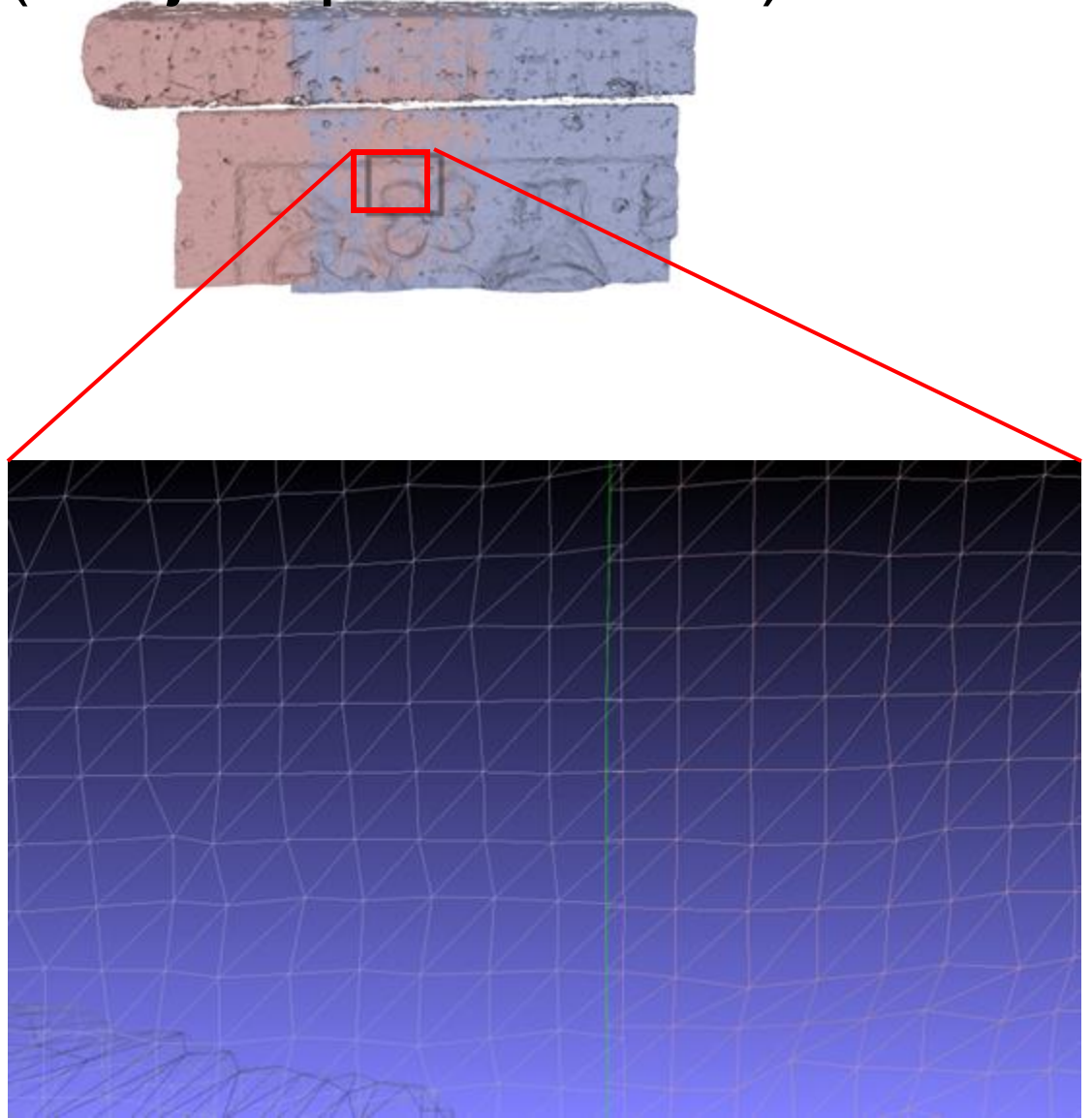
- Input: triangulated ranges maps (not just point clouds)
- Works in pairs:
  - **Remove overlapping portions**
  - Clip one RM against the other
  - Remove small triangles

# Mesh Zippering

Input: triangulated ranges maps (not just point clouds)

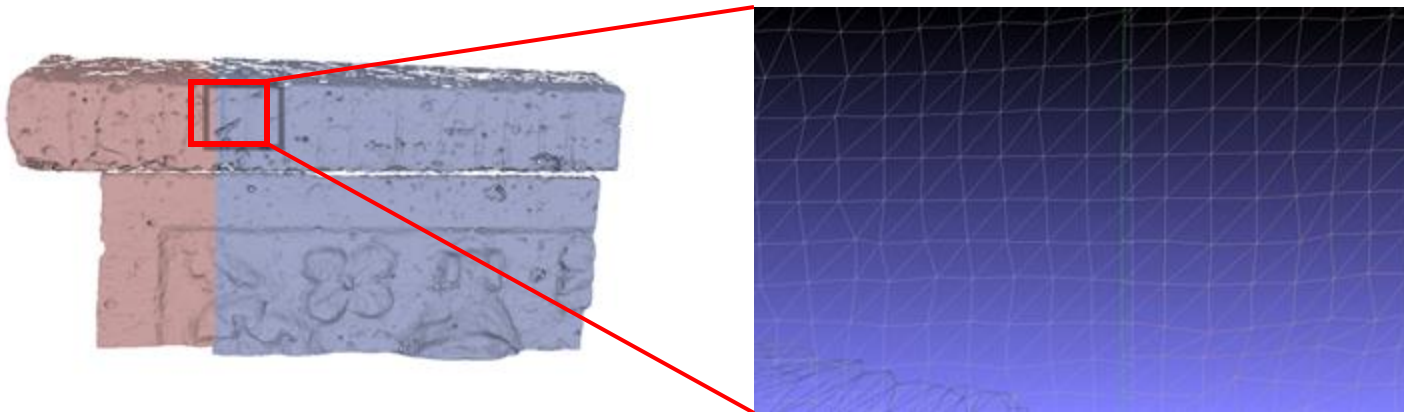
Works in pairs:

- ❑ **Remove overlapping portions**
- ❑ Clip one RM against the other
- ❑ Remove small triangles



# Mesh Zippering

- Input: triangulated ranges maps (not just point clouds)
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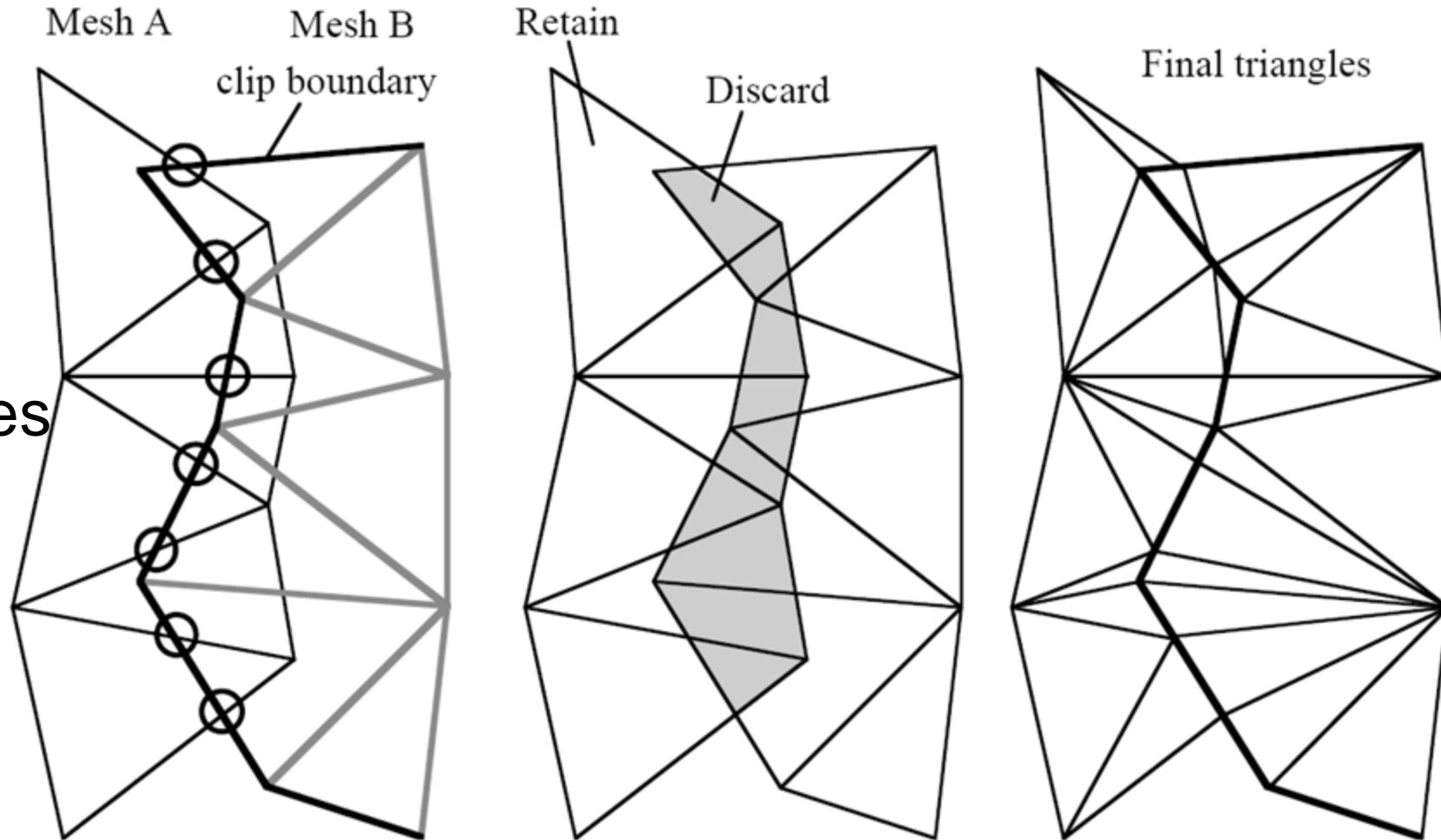


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Input: triangulated ranges maps (not just point clouds)

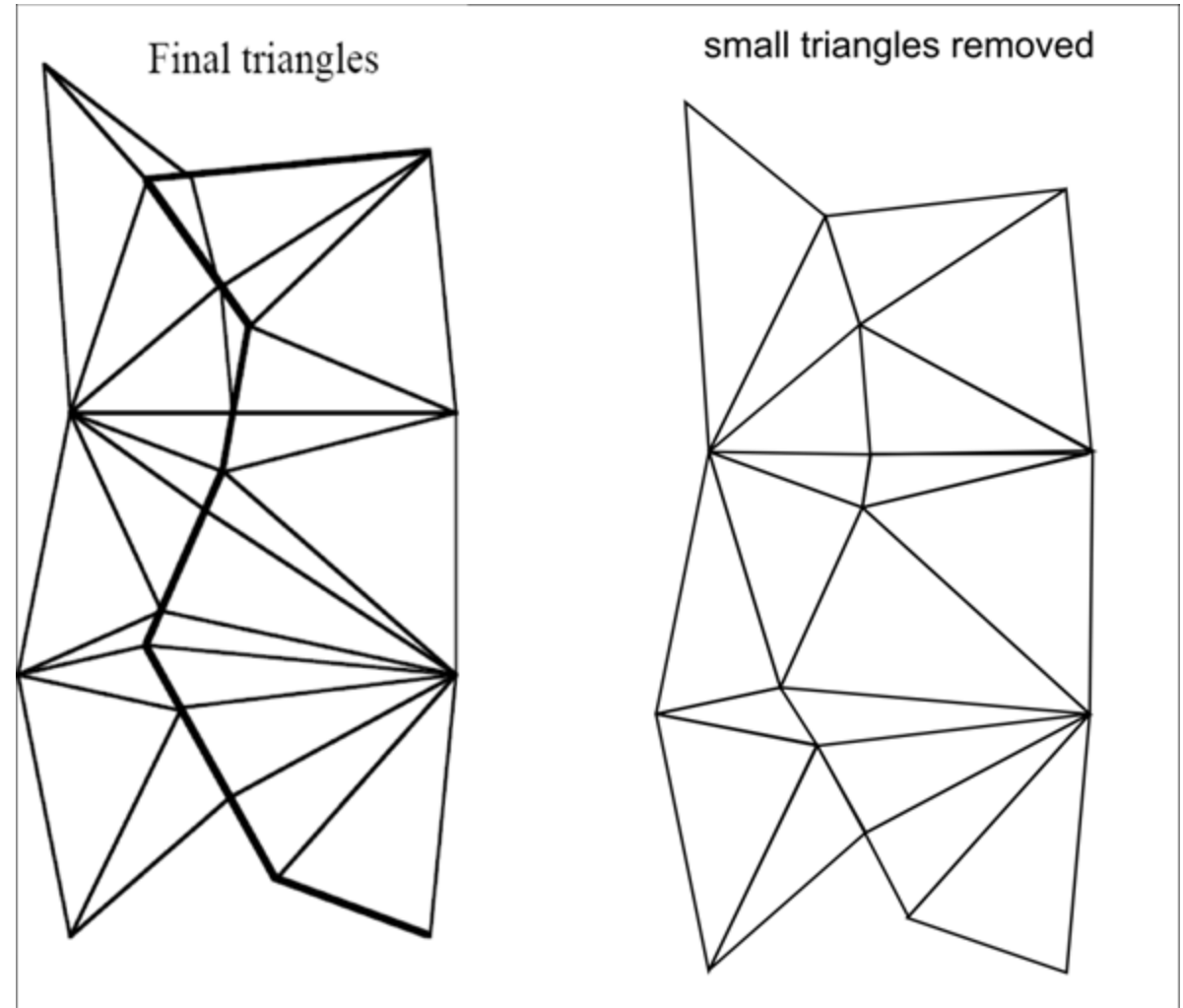
Works in pairs:

- Remove overlapping portions
- **Clip one RM against the other**
- Remove small triangles



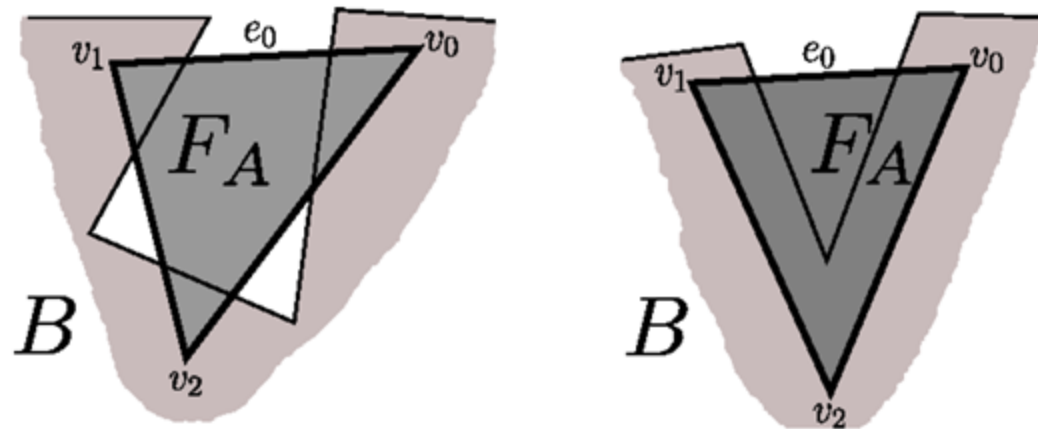
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- Works in pairs:
  - Remove overlapping portions
  - Clip one RM against the other
  - **Remove small triangles**



# Mesh Zippering

- Not so trivial to implement...for example..
- **remove overlapping regions:** «a face of mesh A overlaps if its 3 vertices project on mesh B»
- Hole may appear, to be fixed later...



# Mesh Zippering

- Not so trivial to implement...for example..

- remove**

**overlapping regions:**  
criterion?



# Mesh Zippering

■ Not so trivial to implement...for example..

□ remove

**overlapping regions:**  
criterion?

Preserve faces from left

Preserve faces from right

Halfway (distance from  
the border)

