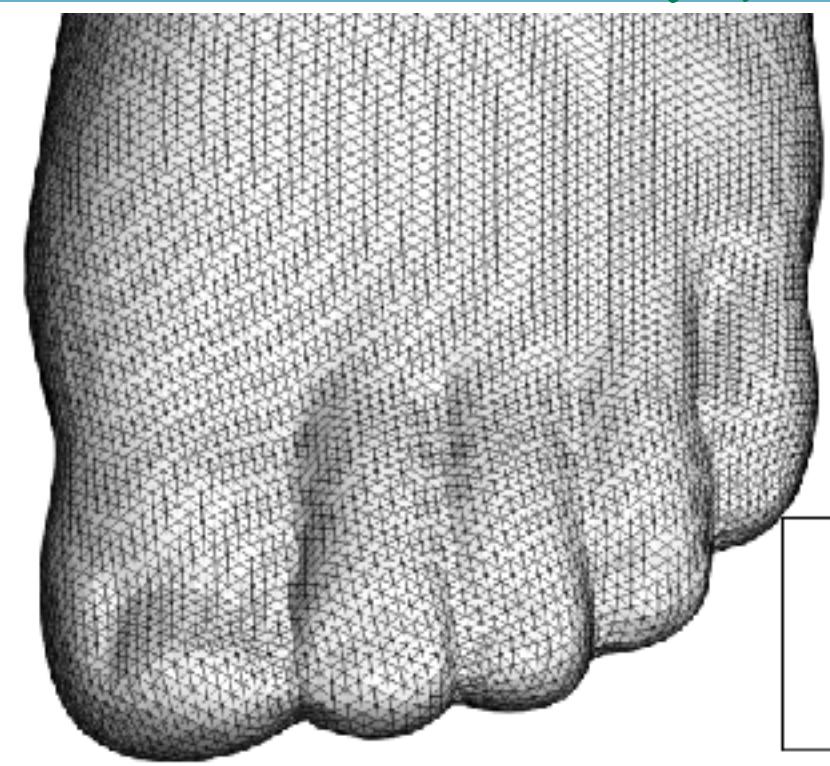
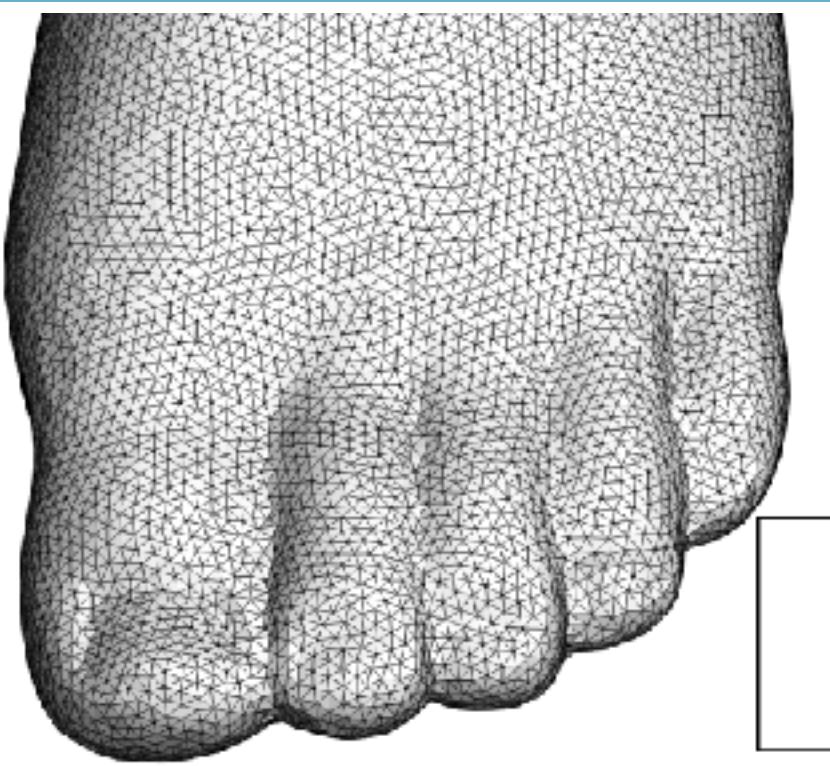
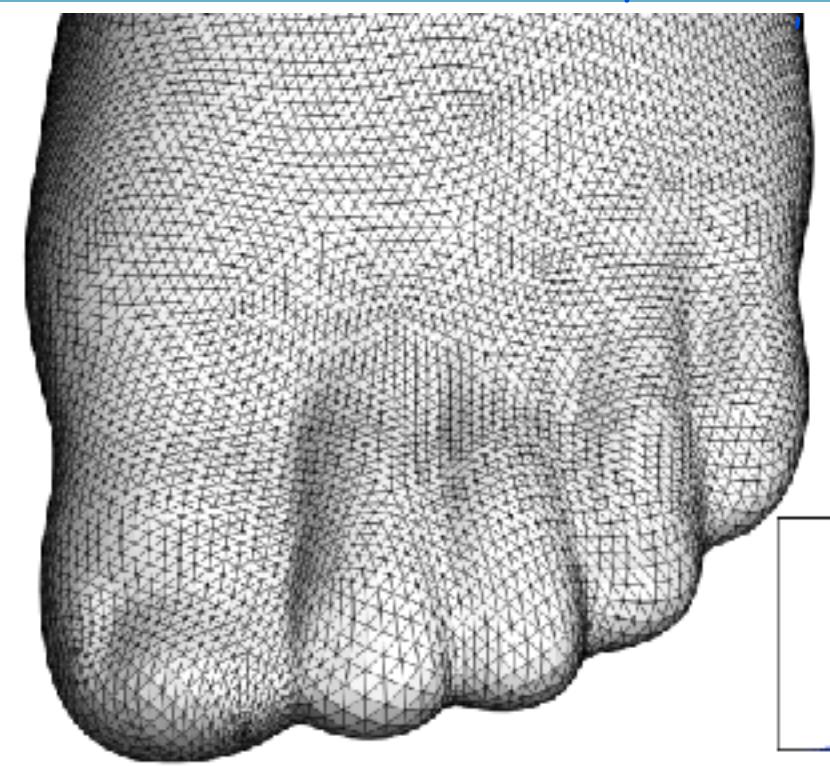


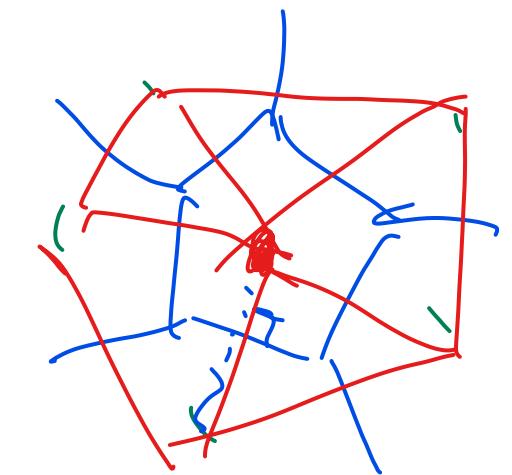
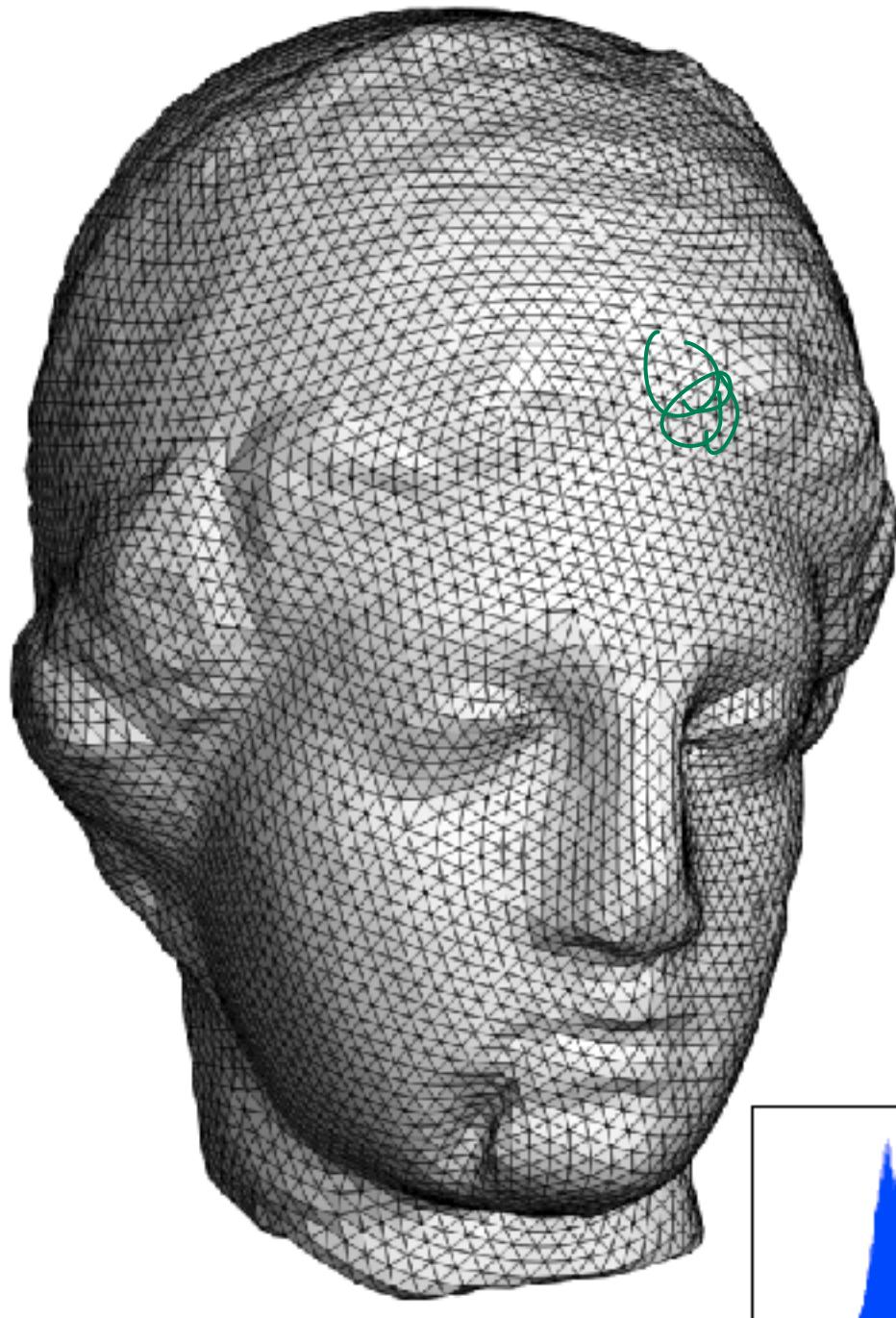
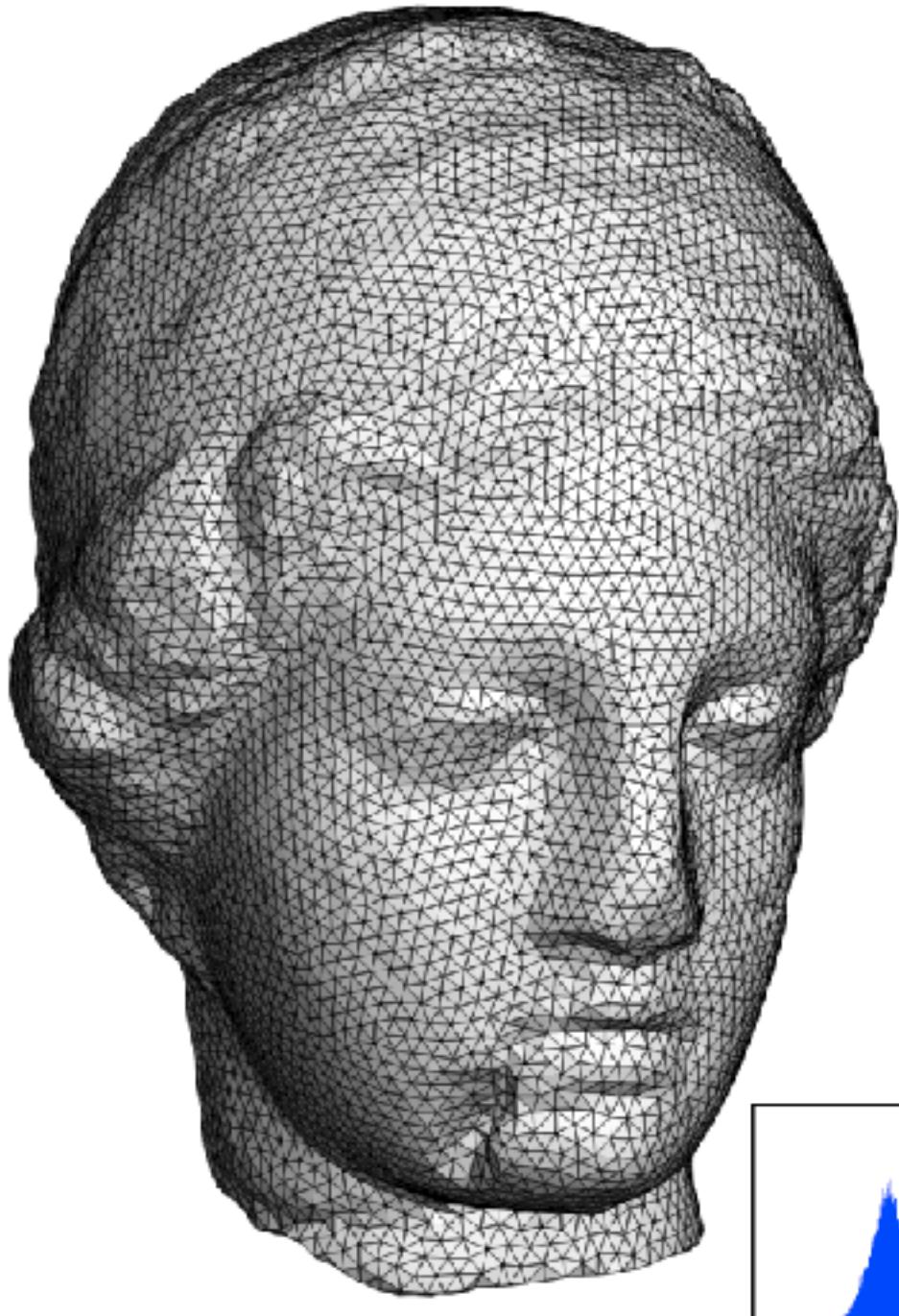
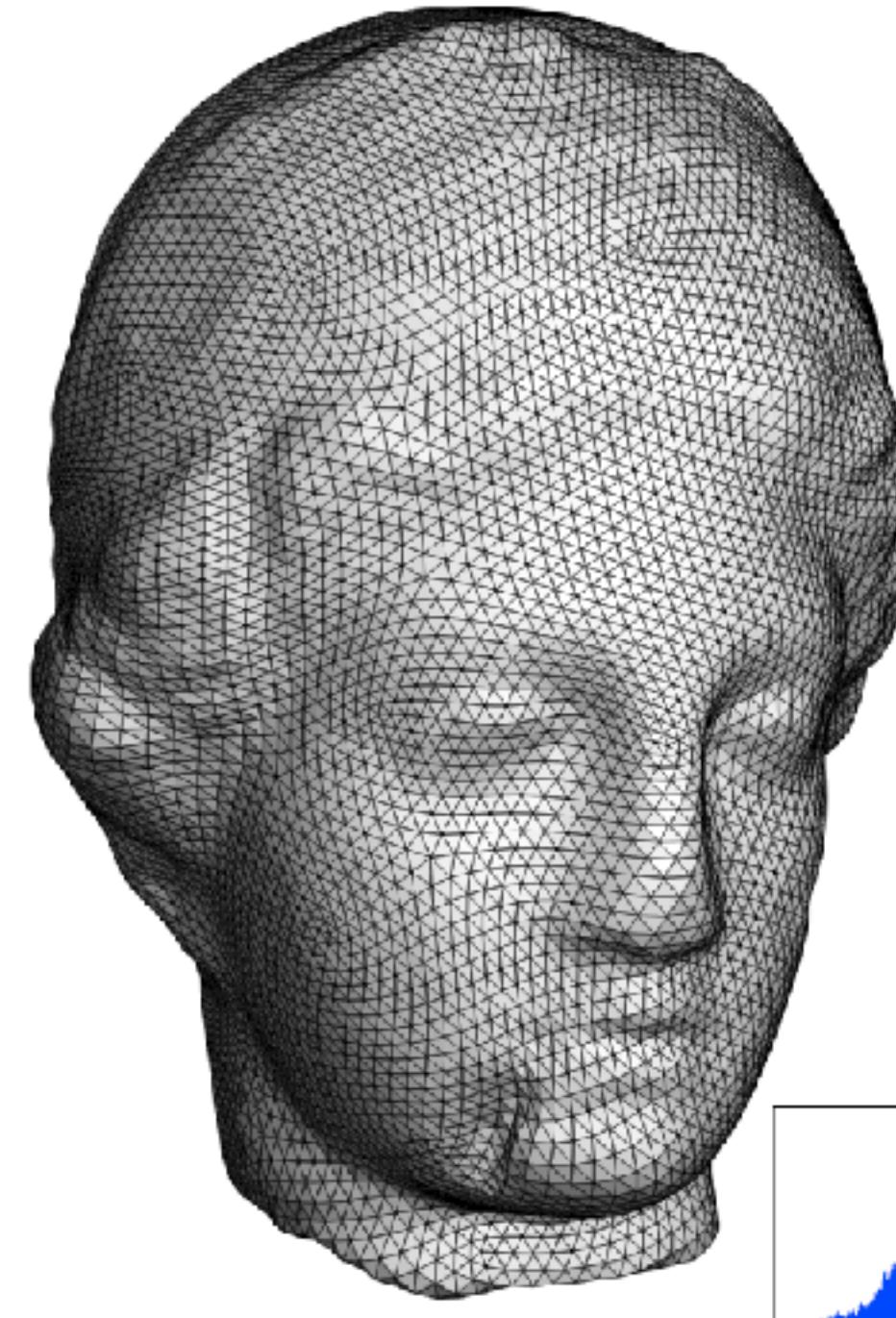
# Remeshing

[VRCP] [VORONOI] [REGIONS]  
[DELAUNAY] [TRIANGULATION]

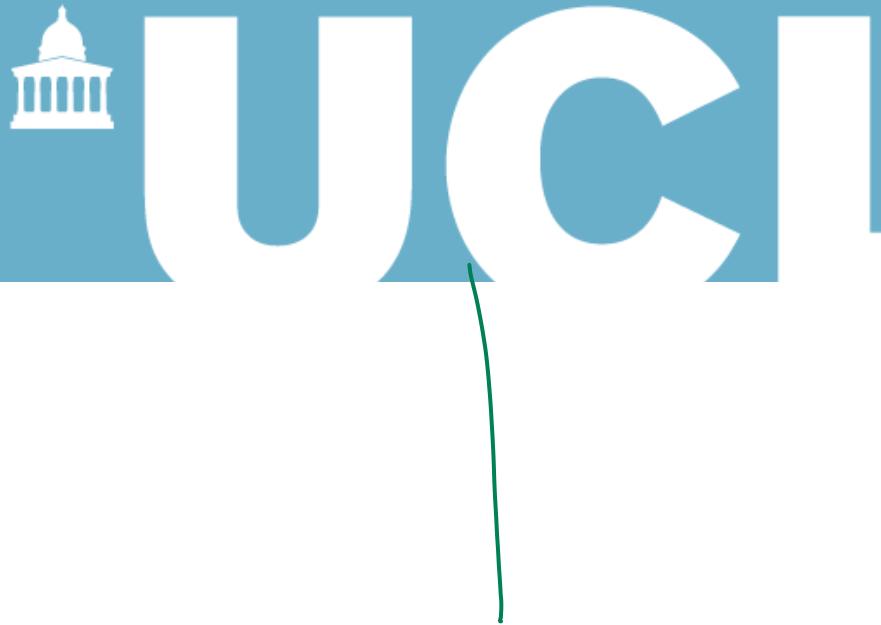


$$P_i \rightarrow \{f(i, j, k)\}$$

maximum min angle



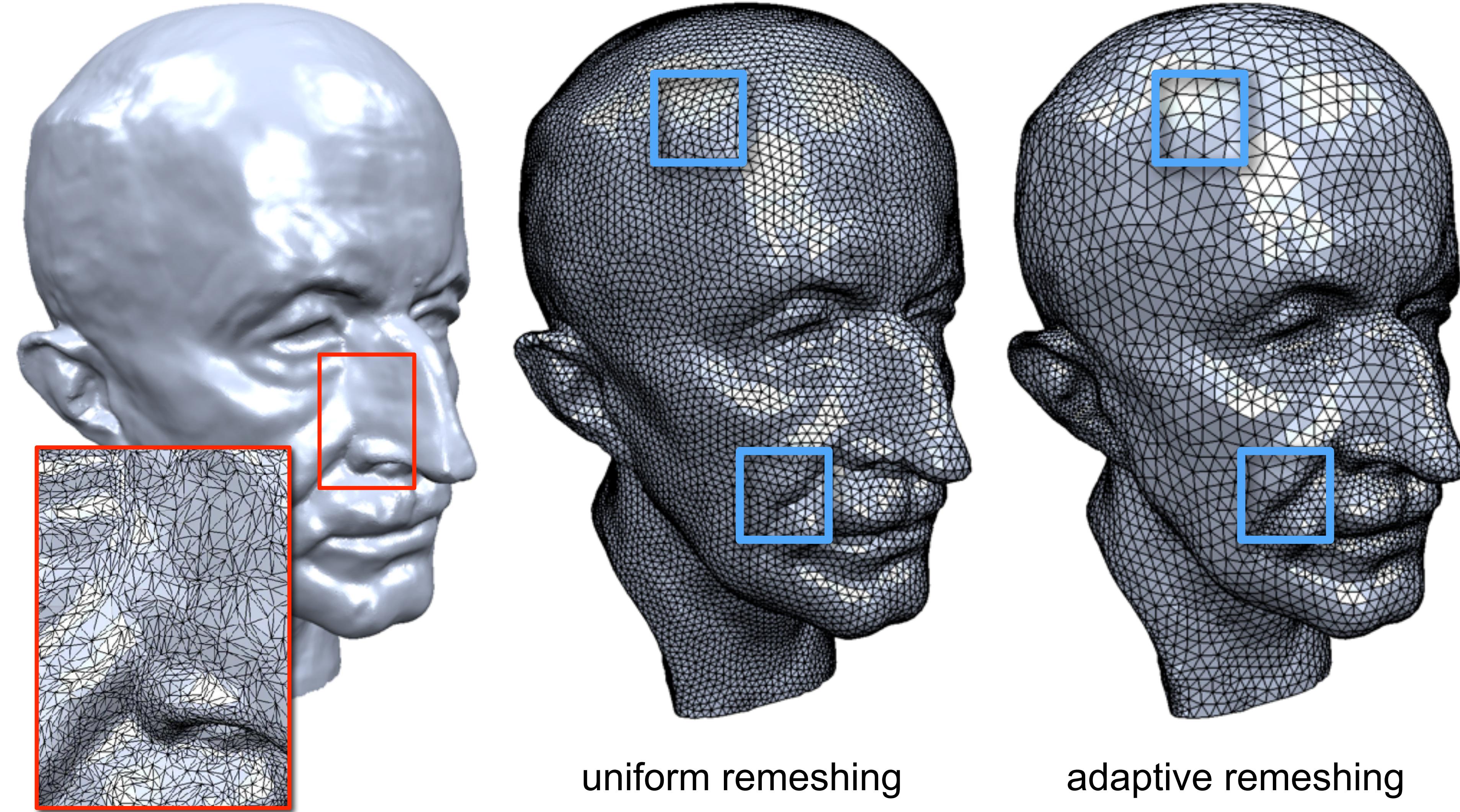
# Remeshing



- Problem setting:
  - *Given a 3D mesh, **improve** its triangulation while preserving its geometry.*
- Why?
  - **Robustness** of numerical computations
- How?
  - Avoid very small / large triangle **angles**
  - Avoid very small / large triangle **areas**

*length preserved*

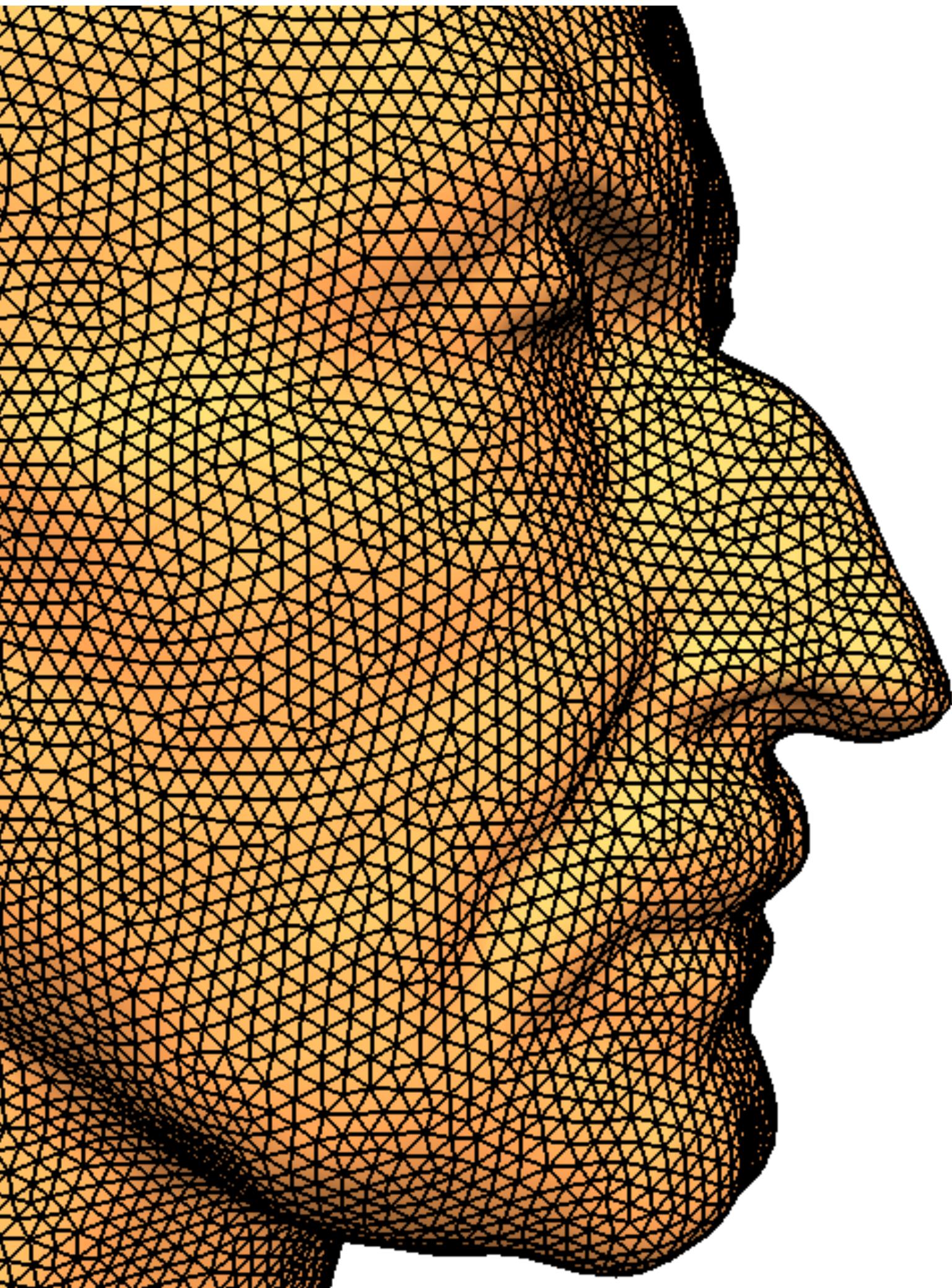
# Isotropic Remeshing



# What is a good mesh?



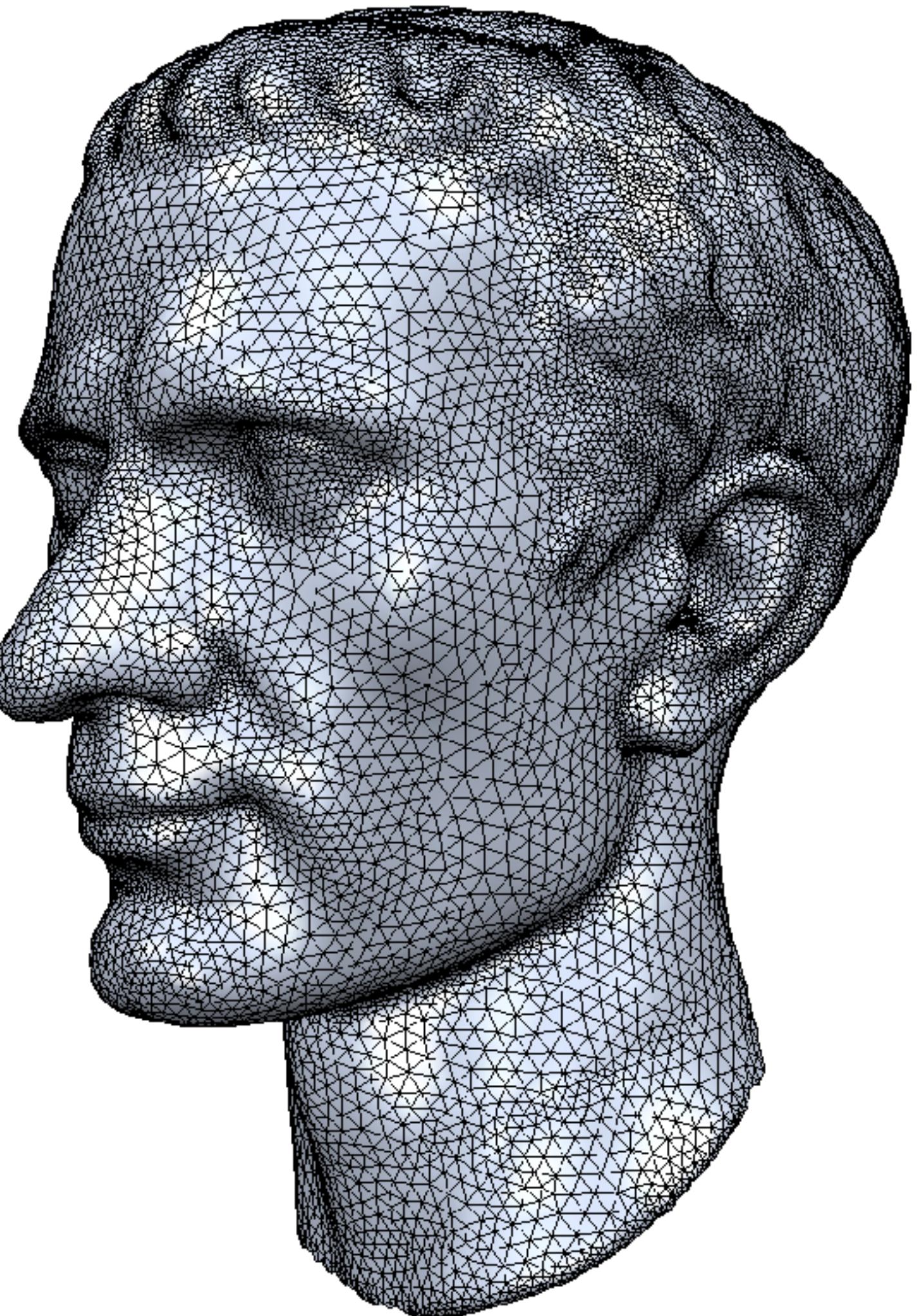
- Equal edge lengths
- Equilateral triangles
- Valence close to 6



# What is a good mesh?

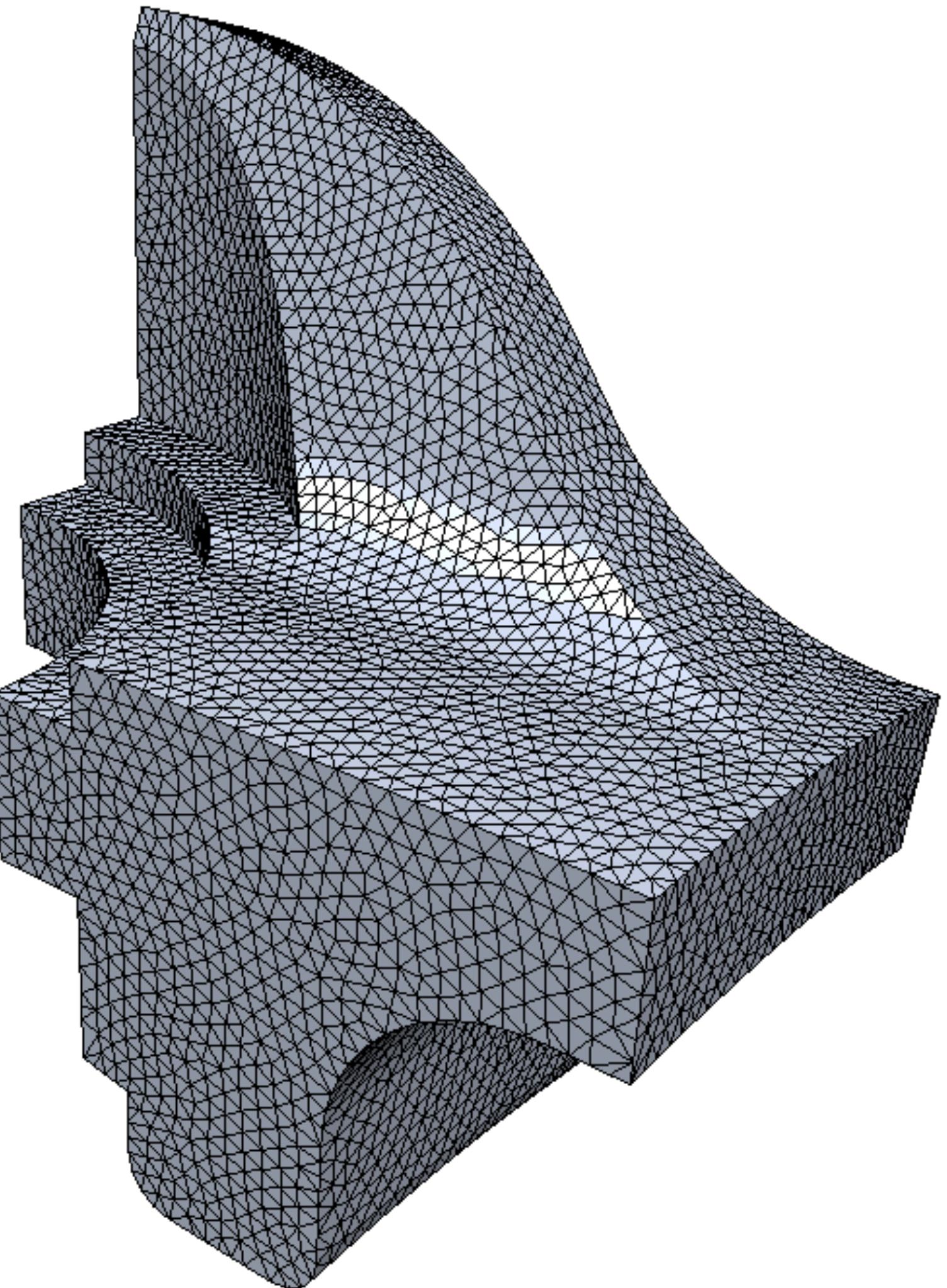


- Equal edge lengths
- Equilateral triangles
- Valence close to 6
- Uniform vs. adaptive sampling



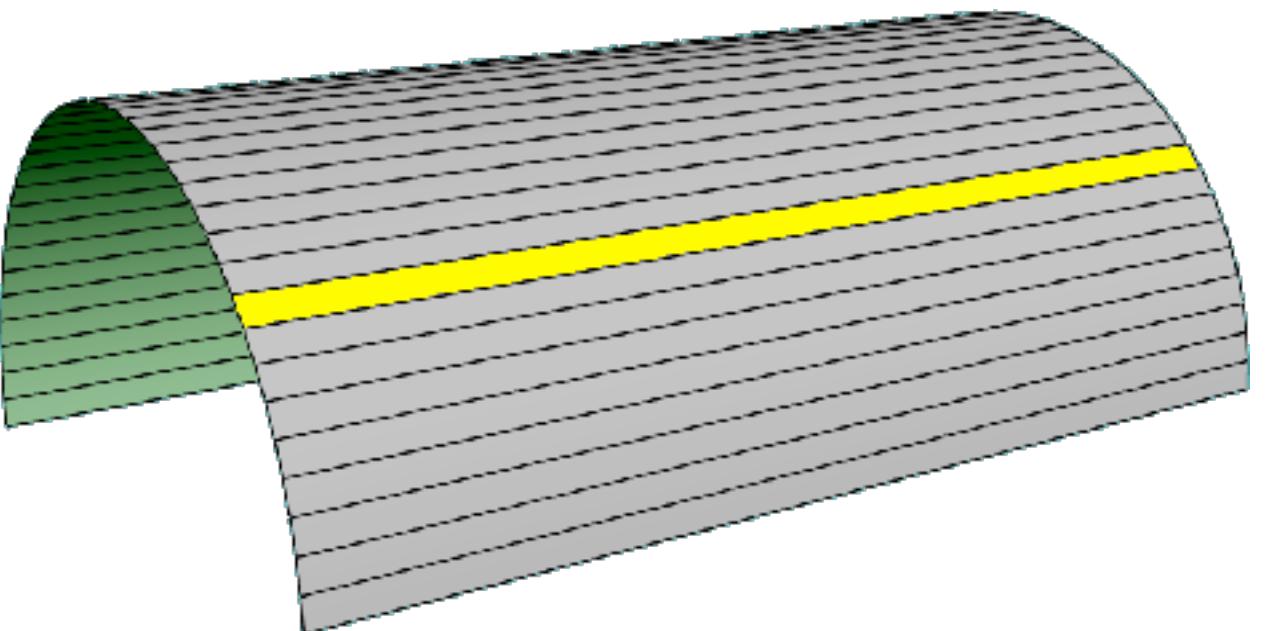
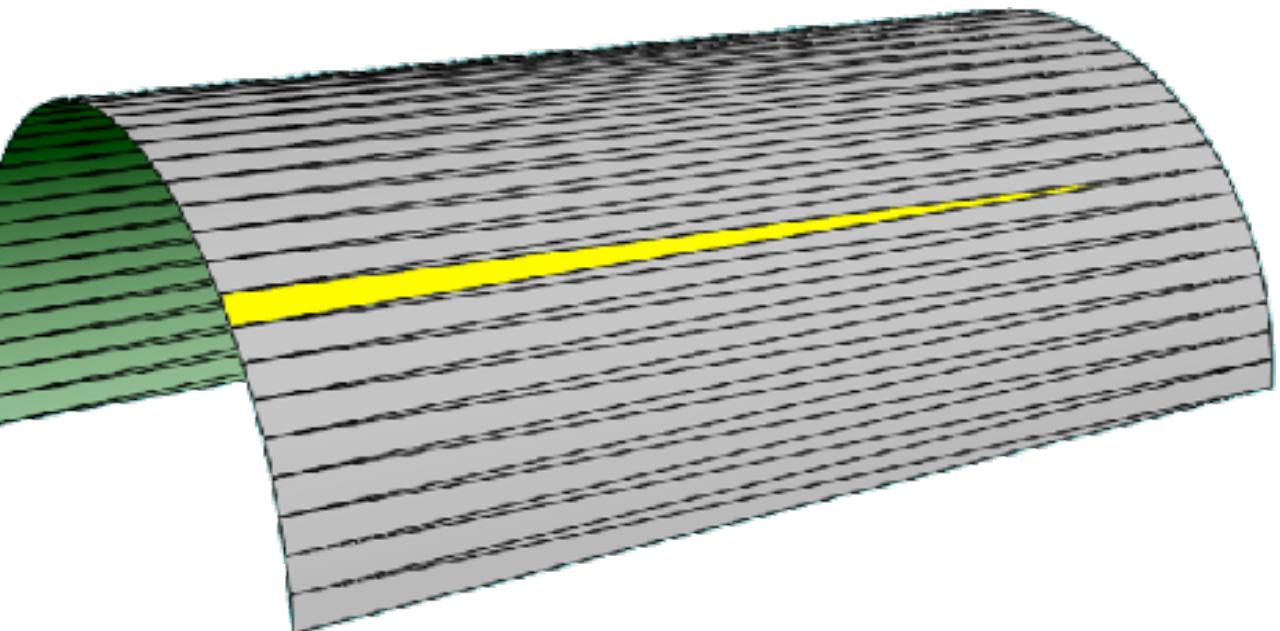
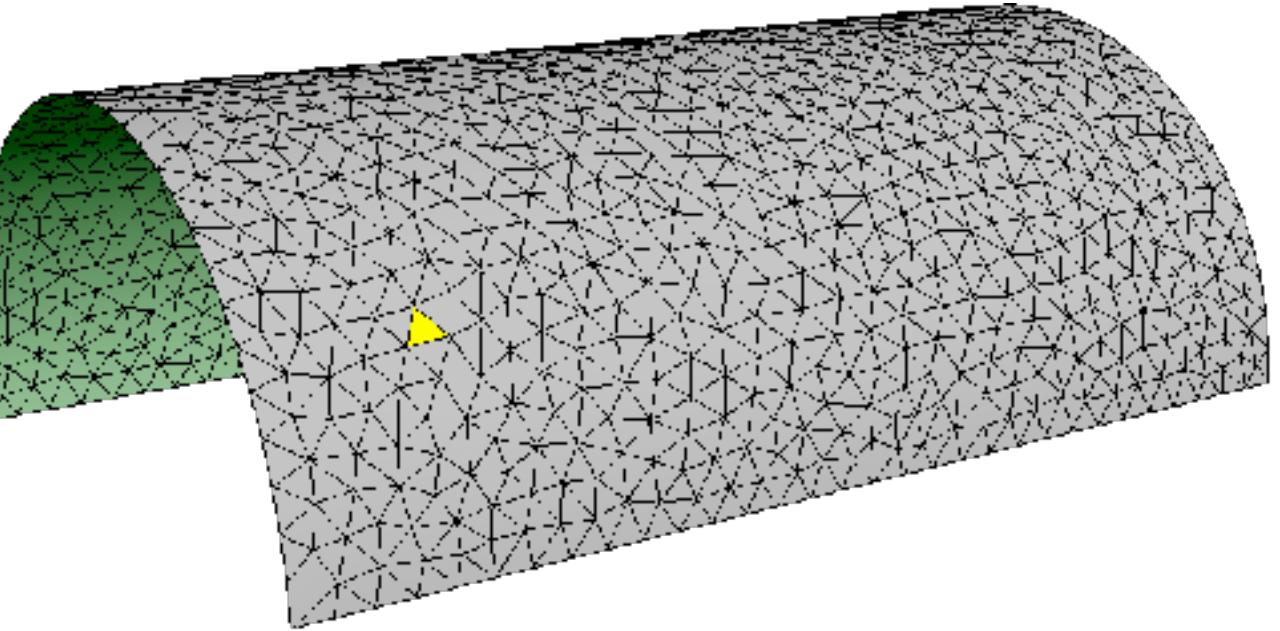
# What is a good mesh?

- Equal edge lengths
- Equilateral triangles
- Valence close to 6
- Uniform vs. adaptive sampling
- Feature preservation



# What is a good mesh?

- Equal edge lengths
- Equilateral triangles
- Valence close to 6
- Uniform vs. adaptive sampling
- Feature preservation
- Alignment to curvature lines
- Isotropic vs. anisotropic
- Triangles vs. quadrangles



# Two Primary Approaches



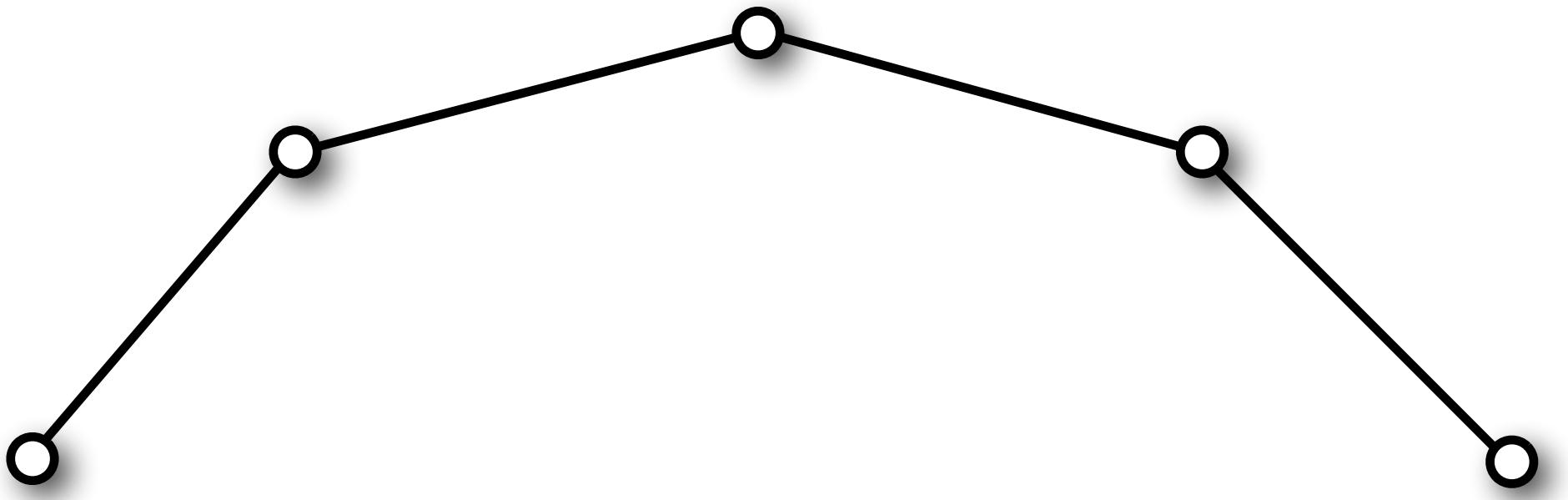
## 1. Parametrization based

- map to 2D domain / 2D problem
- computationally more expensive
- works even for coarse resolution remeshing

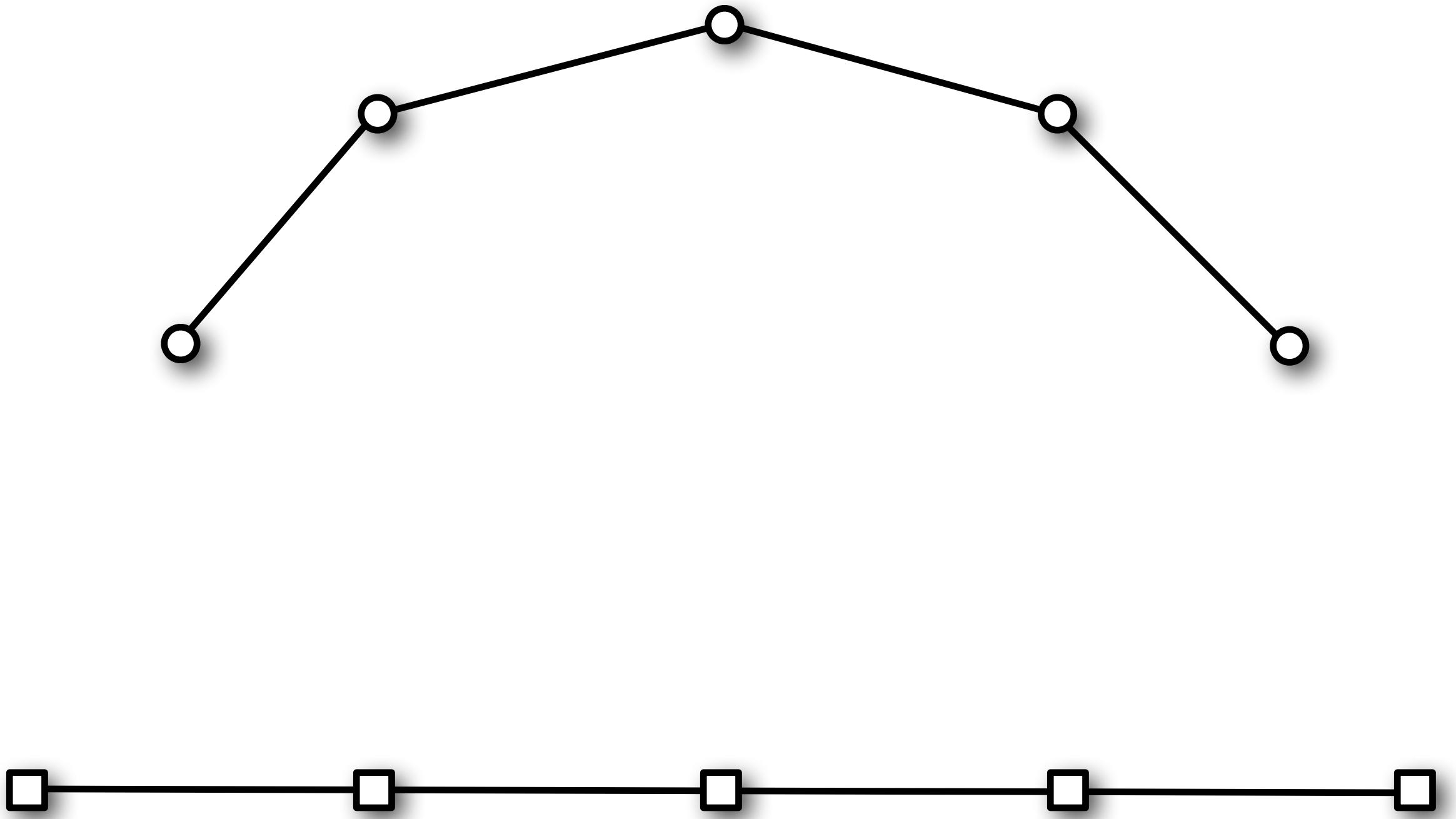
## 2. Surface based

- operate *directly* on the surface
- treat surface as a set of points / polygons in space
- efficient for high resolution remeshing

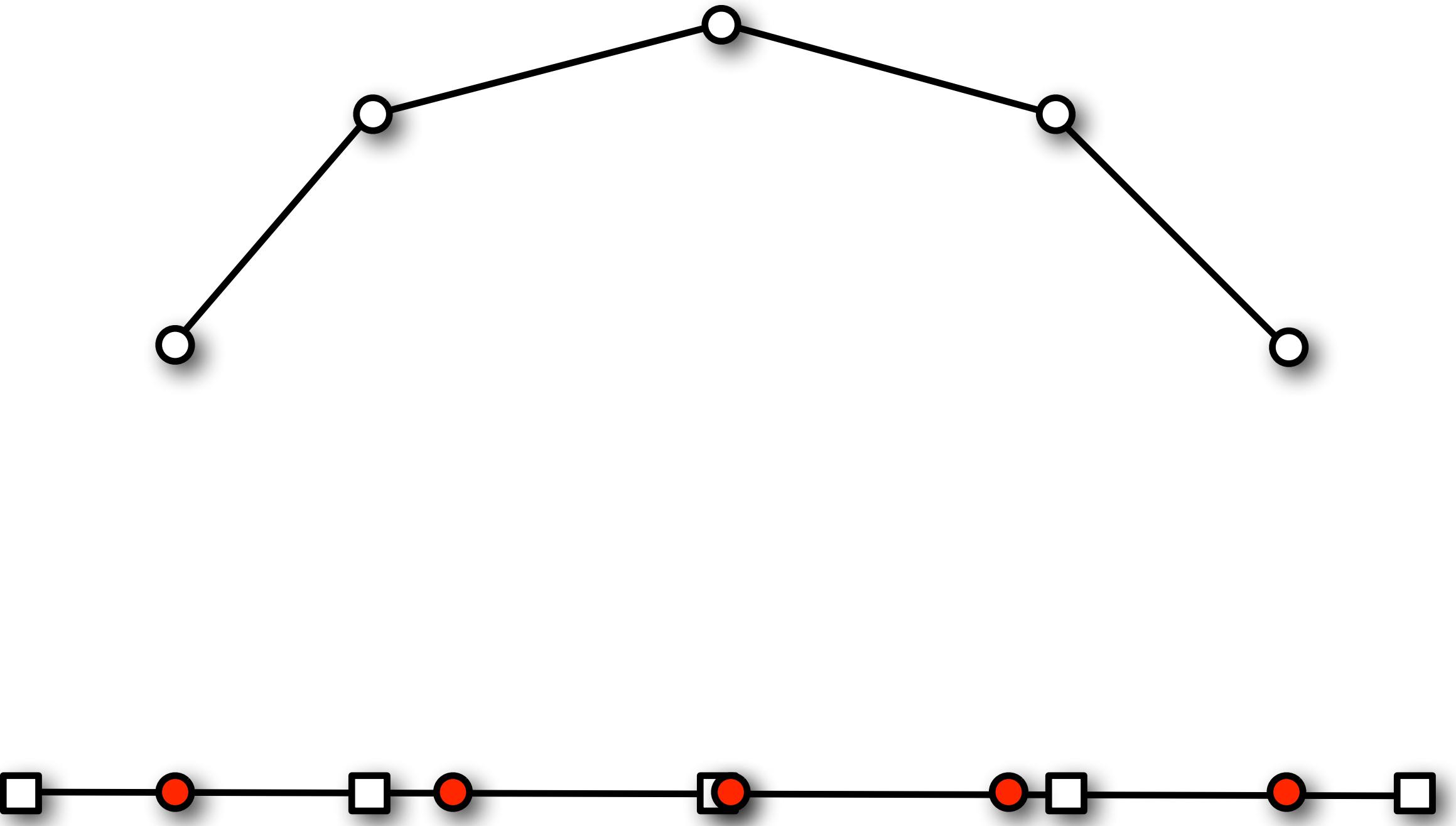
# 1. Parametrization Based



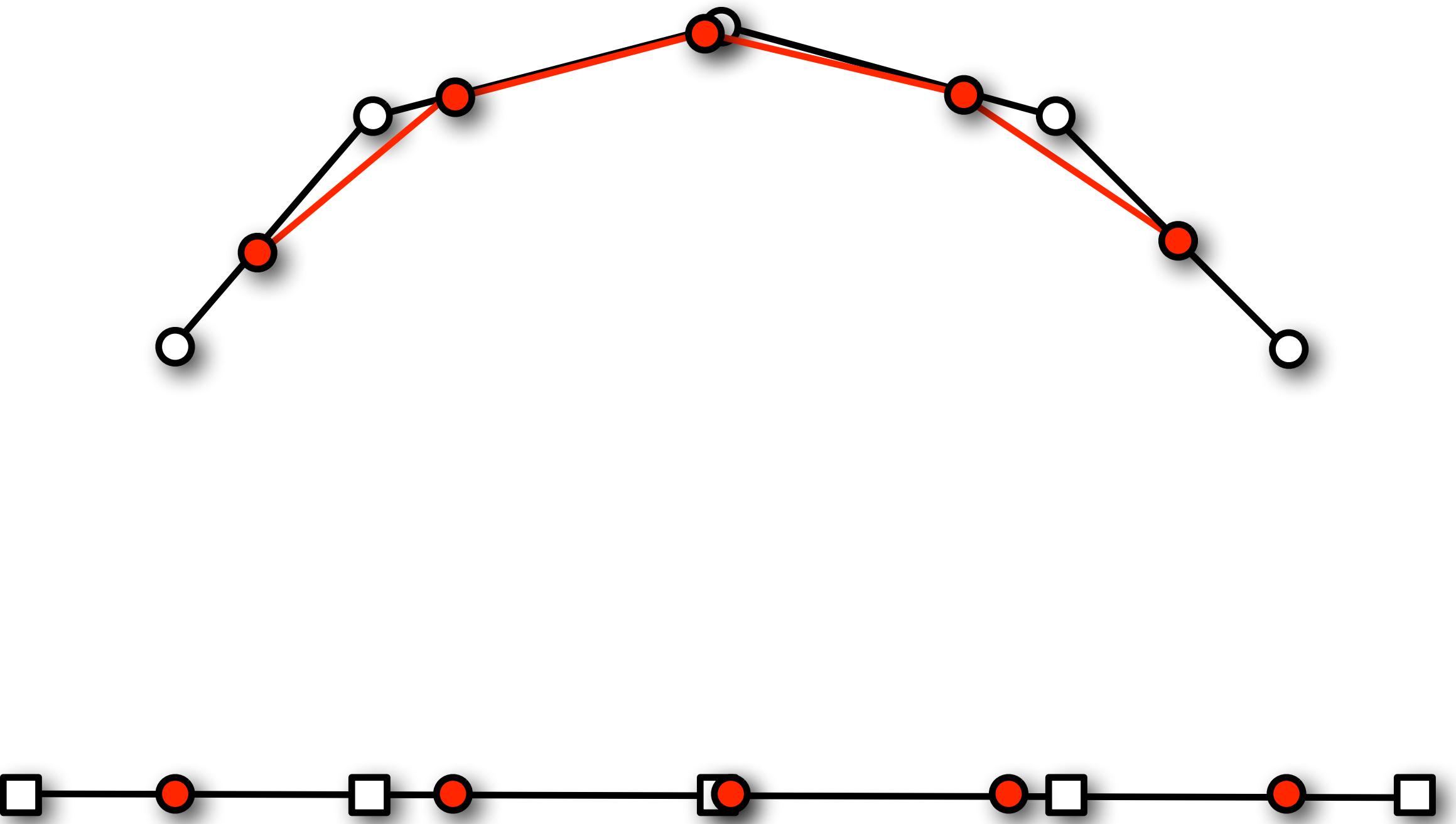
# 1. Parametrization Based



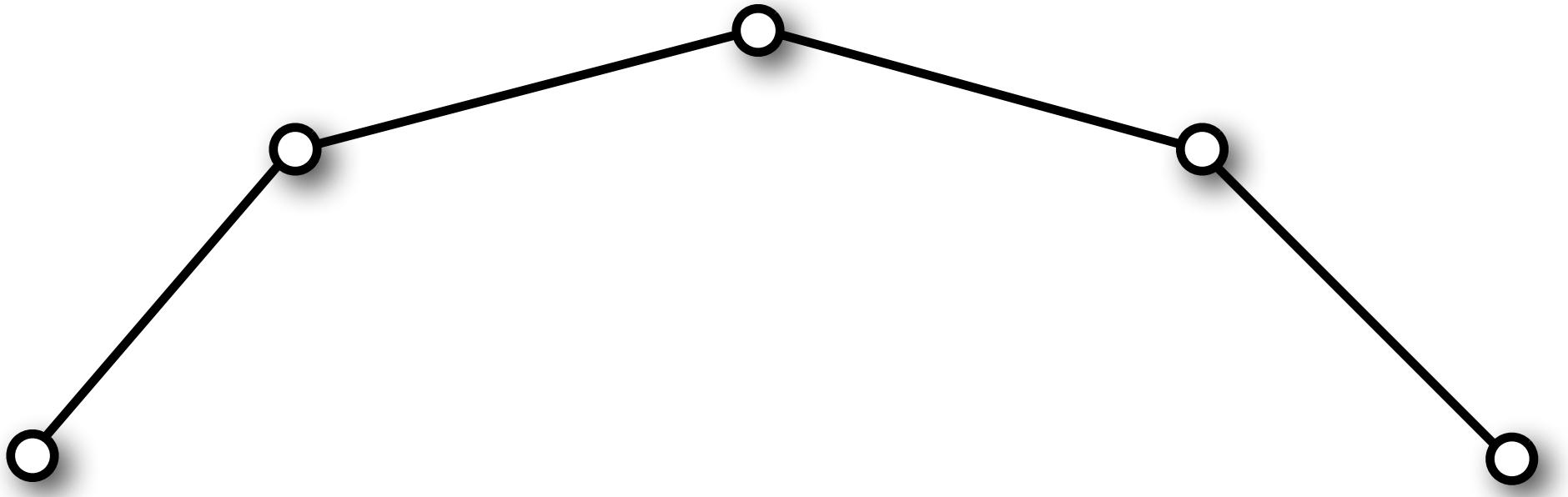
# 1. Parametrization Based



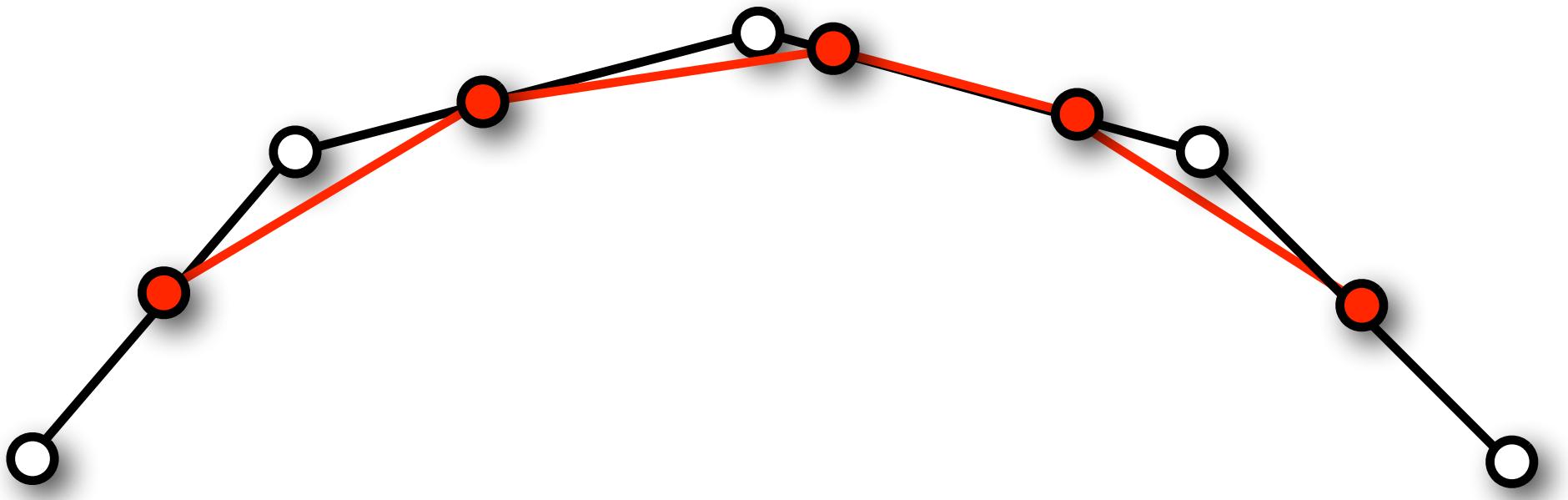
# 1. Parametrization Based



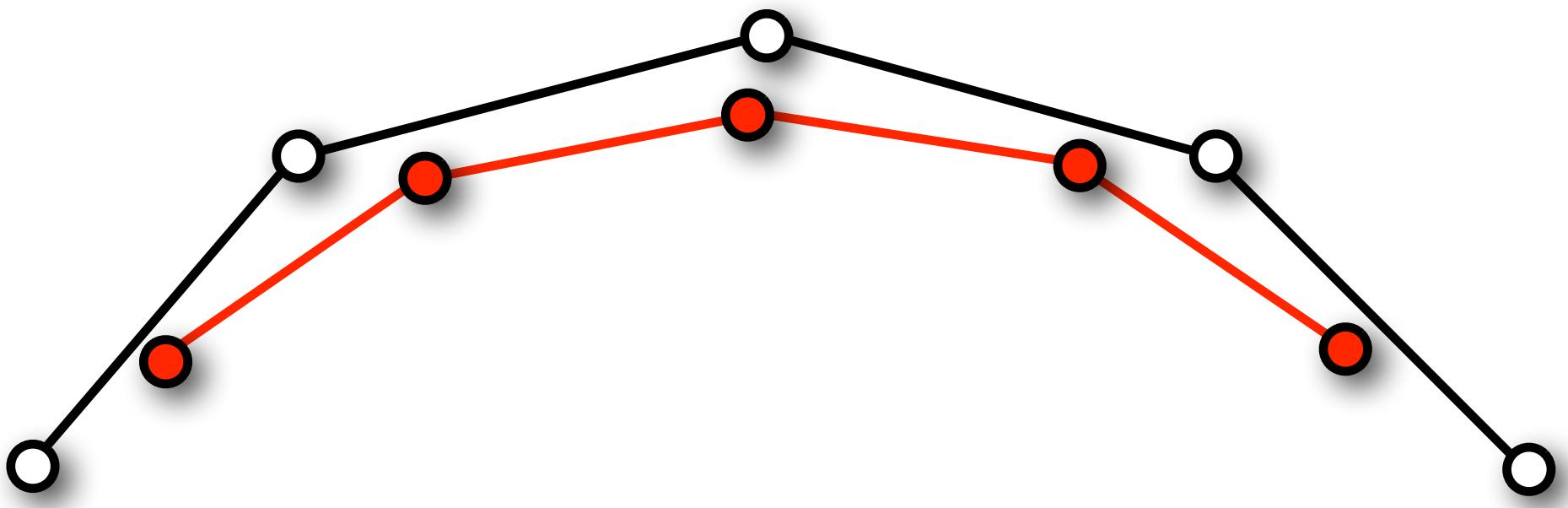
# 2. Surface Based



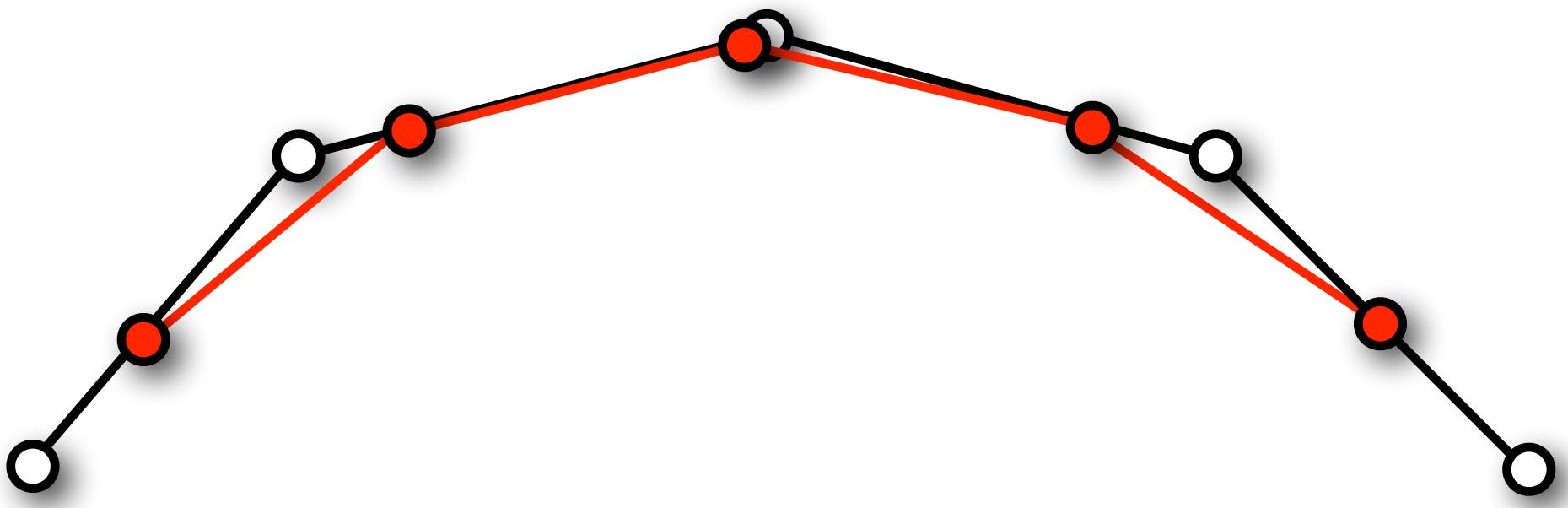
# 2. Surface Based



# 2. Surface Based



# 2. Surface Based



# Overview

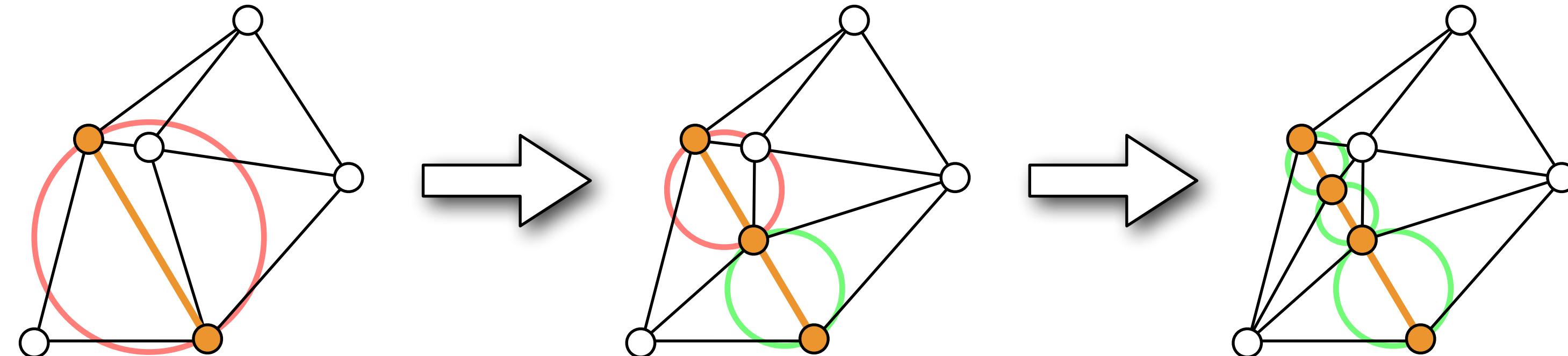


- **2D Meshing**
- Parameterization-Based Remeshing
- Surface-Based Remeshing

# Constrained Delaunay Triangulation

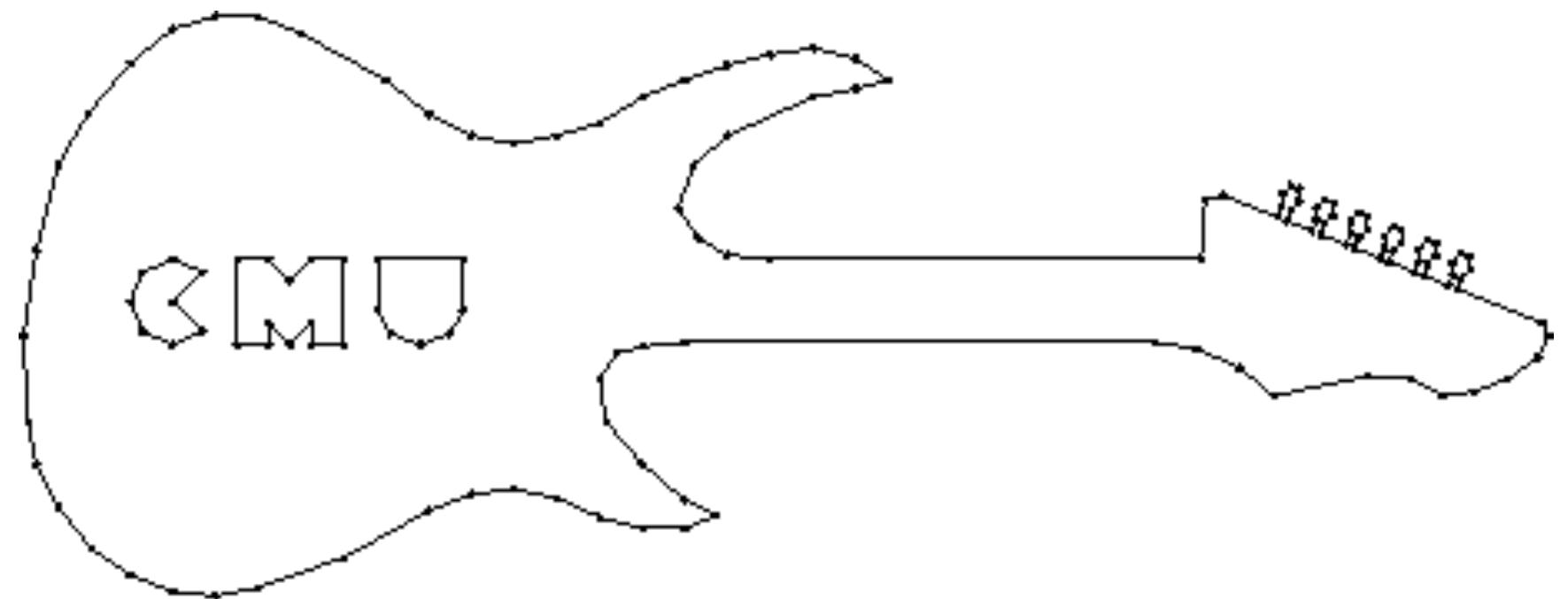


- Enforce certain edges in triangulation
  - Either prevent flipping ( $\rightarrow$  bad triangles)
  - Or subdivide edges sufficiently ( $\rightarrow$  many triangles)

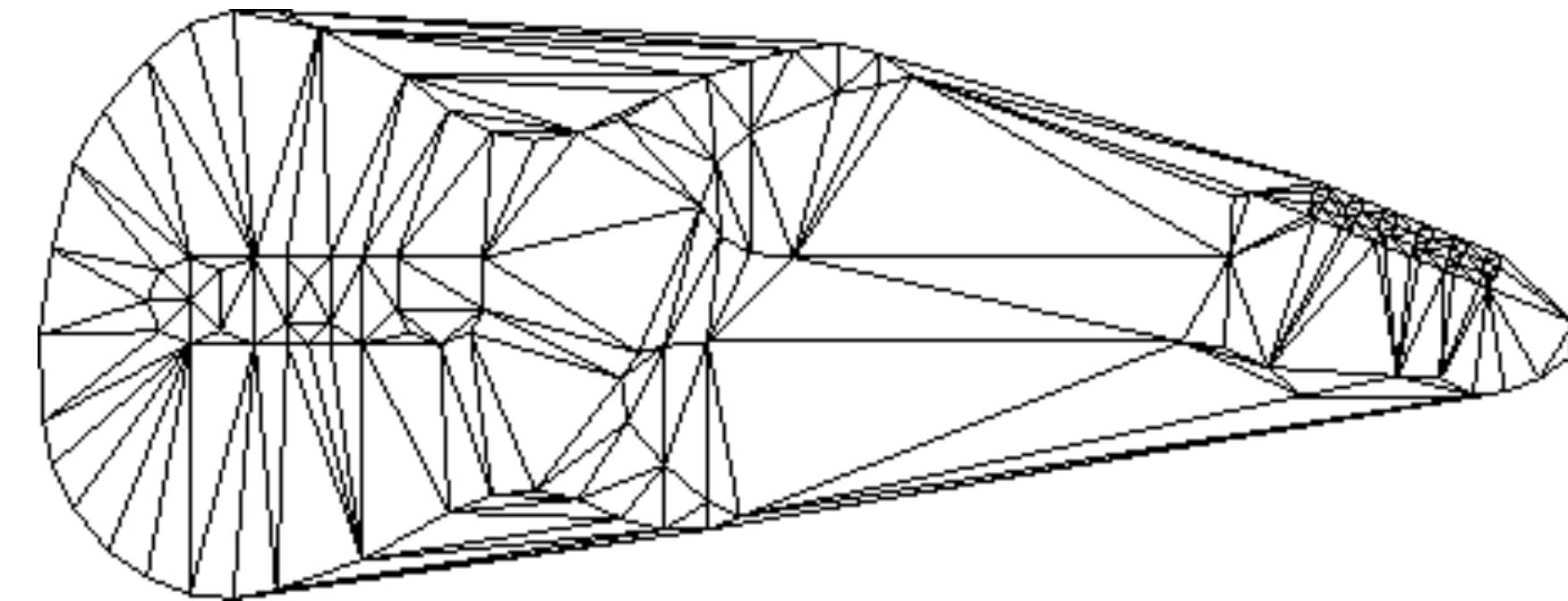




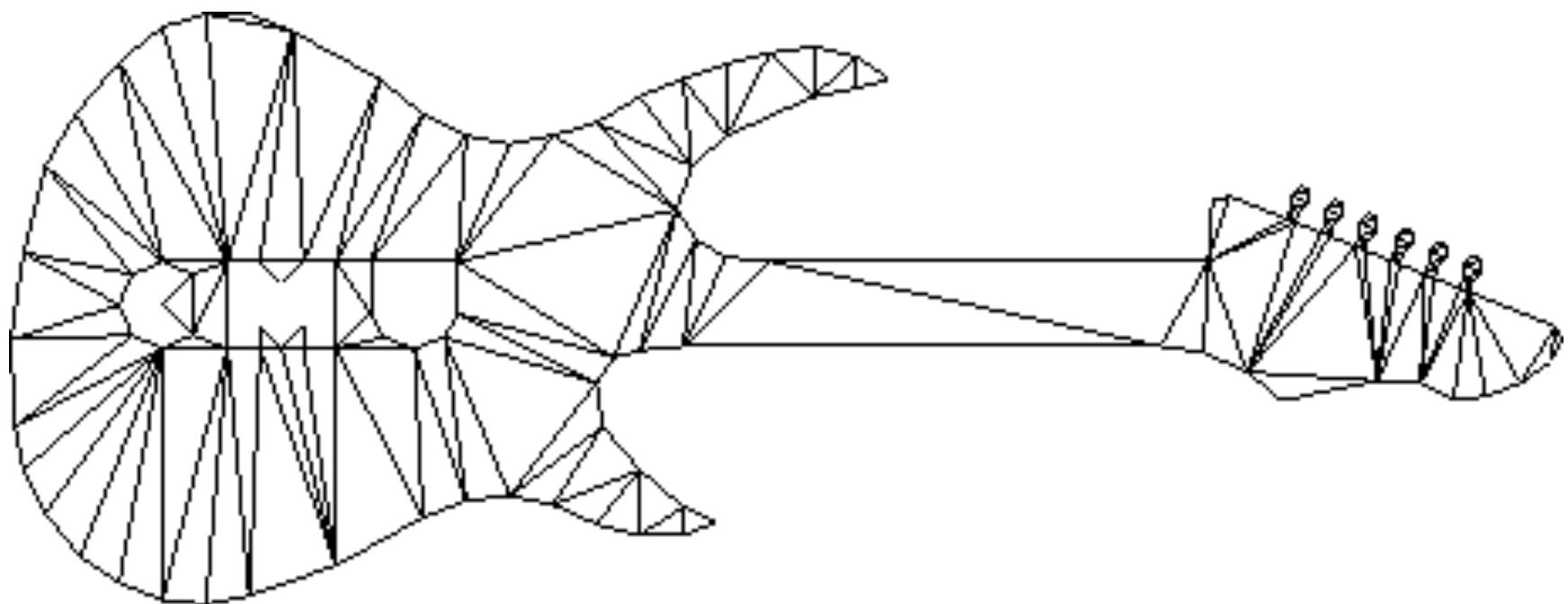
# 2D Meshing



Input points & edges



Constrained Delaunay Triangulation

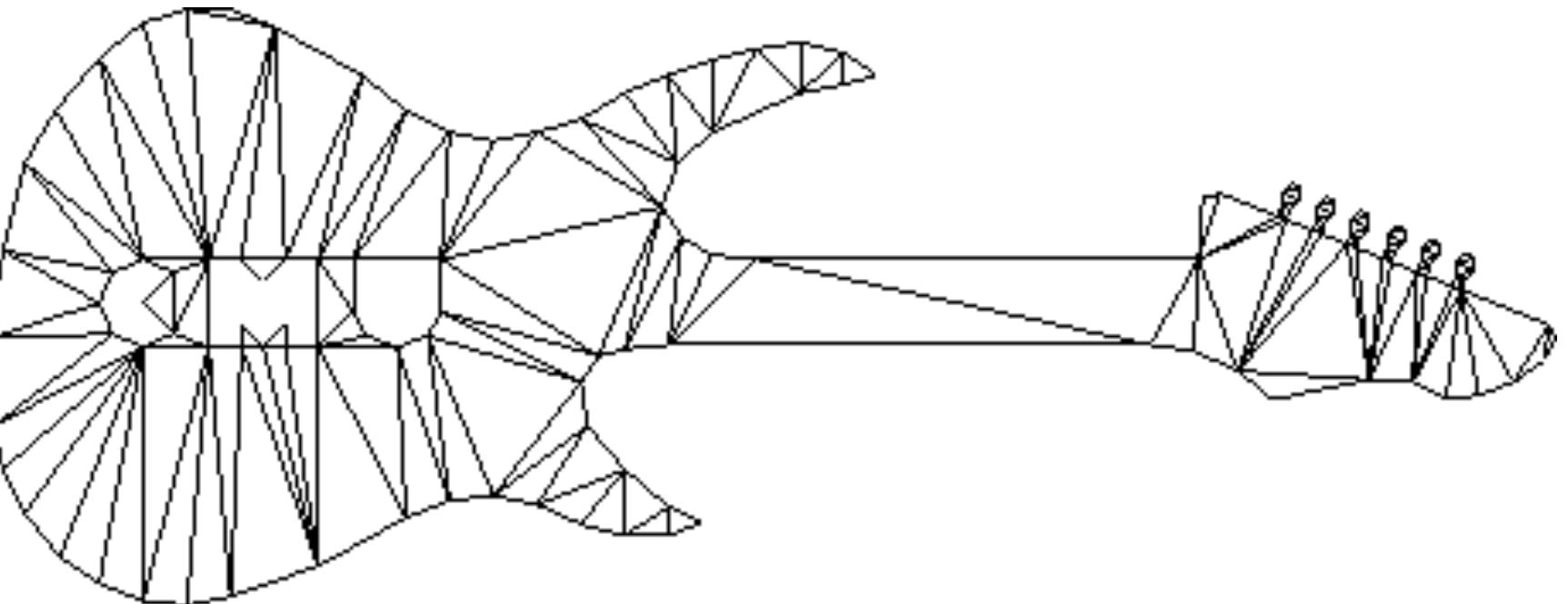


Remove exterior

[J. Shewchuck]

# 2D Meshing

- 2D Delaunay triangulation
  - *Maximizes minimum angle*
  - Optimal triangulation for given set of vertices
  - Why can there still be bad triangles?

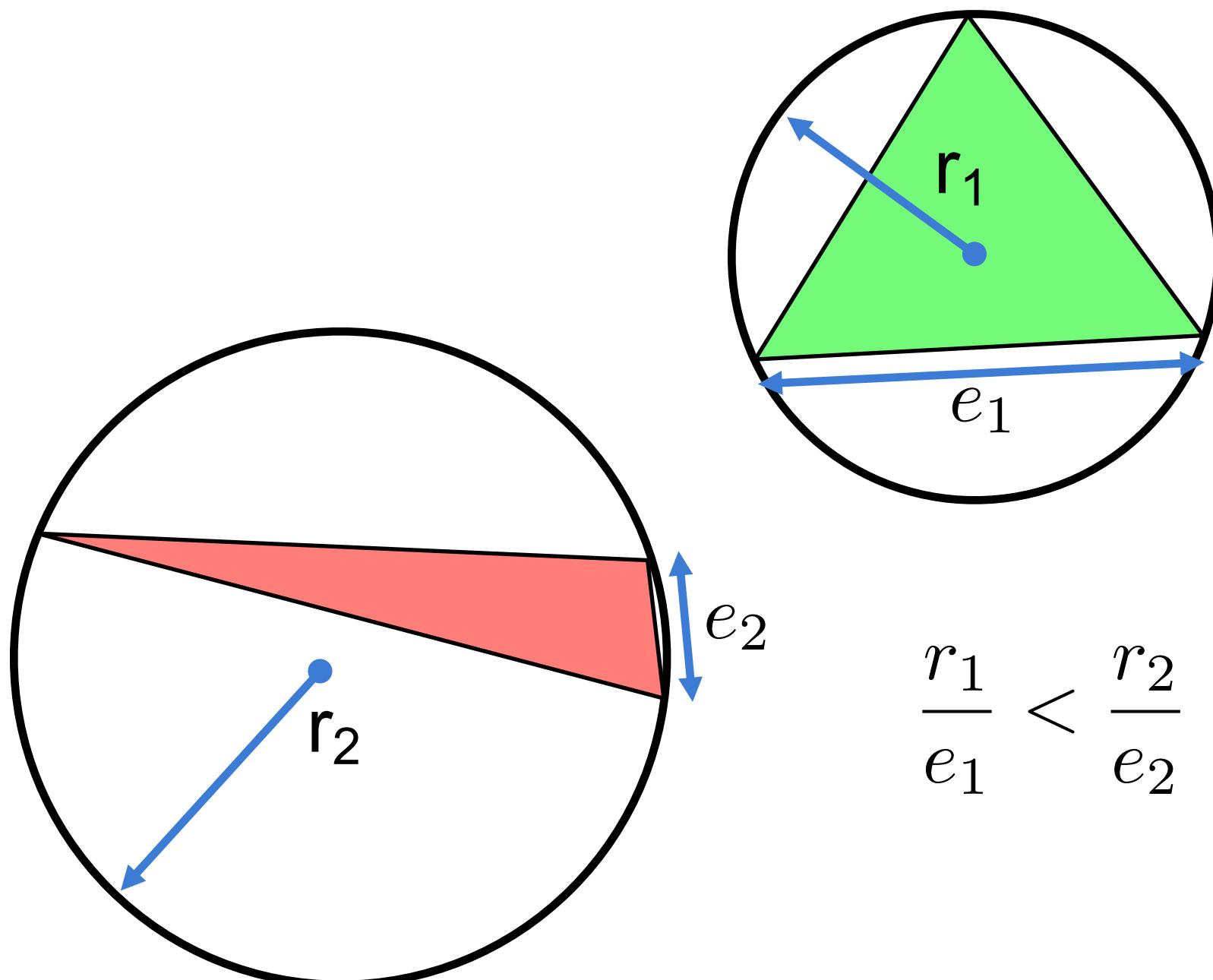




# Delaunay Refinement

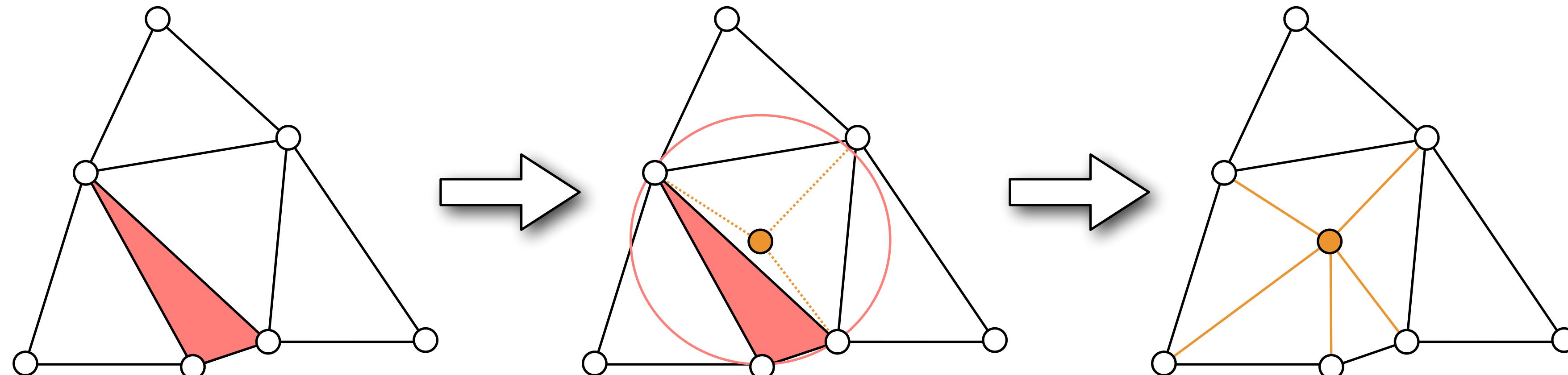


- Delaunay triangulation might contain bad triangles, depending on vertex distribution
- Refine triangulation
  - Insert new vertices, eliminate bad triangles
- Measure triangle quality by
  - circum-radius / shortest-edge
  - smallest inner angles



# Delaunay Refinement

- Eliminate “bad” triangles by **inserting their circum-center** into the triangulation
- Bad triangle will fail the **empty-circumcircle test** and will therefore be removed

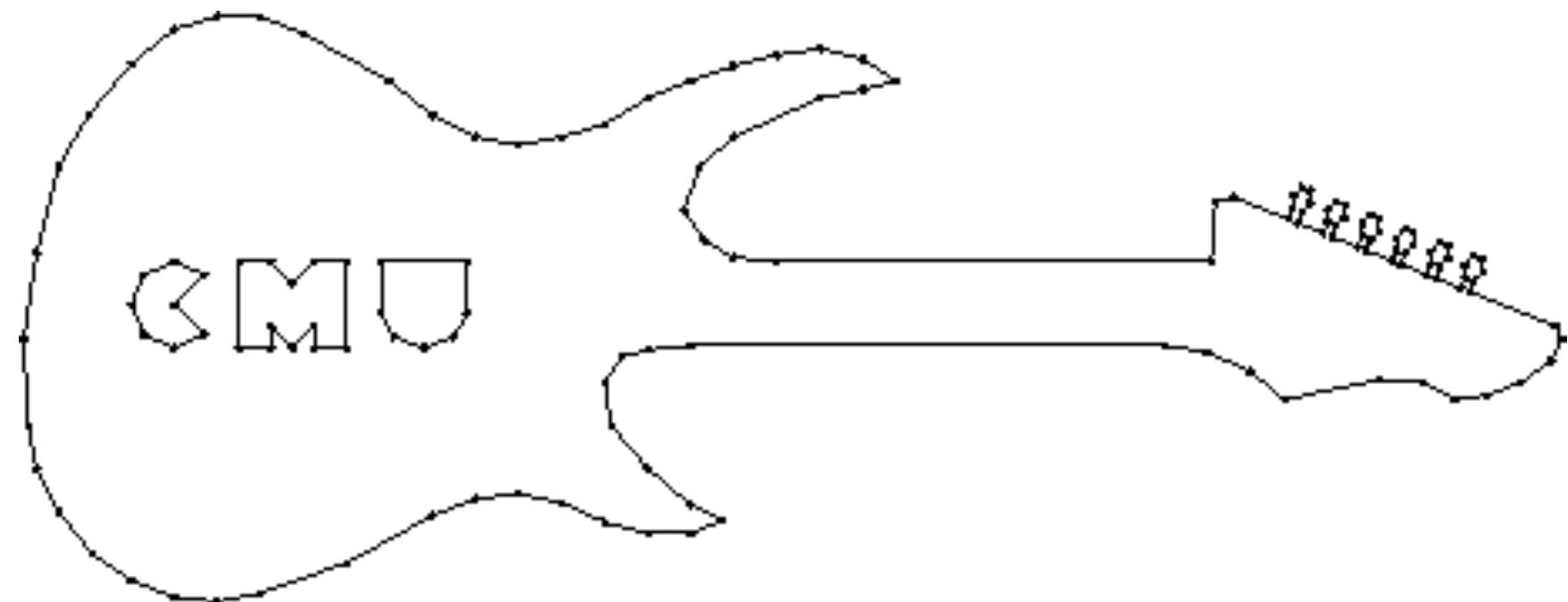


# Delaunay Refinement

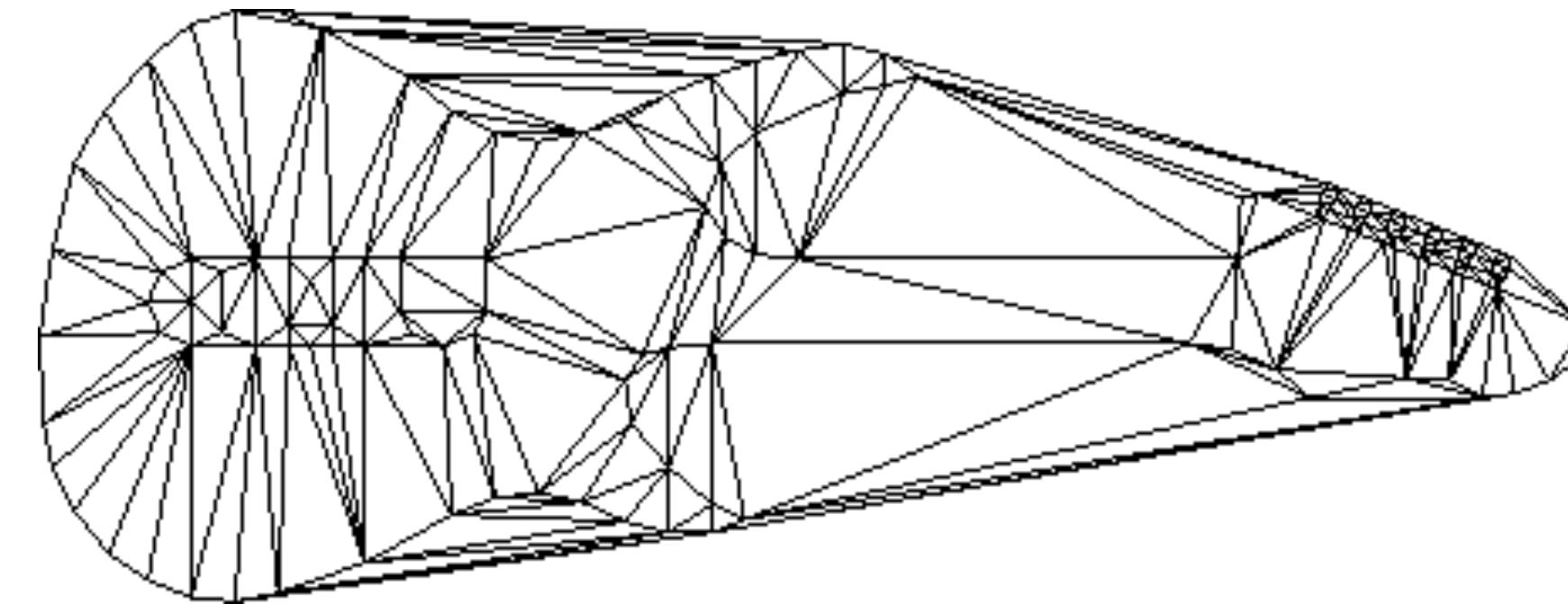


```
while (!finished)
{
    T = find worst triangle
    if T is too bad
        insert T's circum-center
    else
        finished = true
}
```

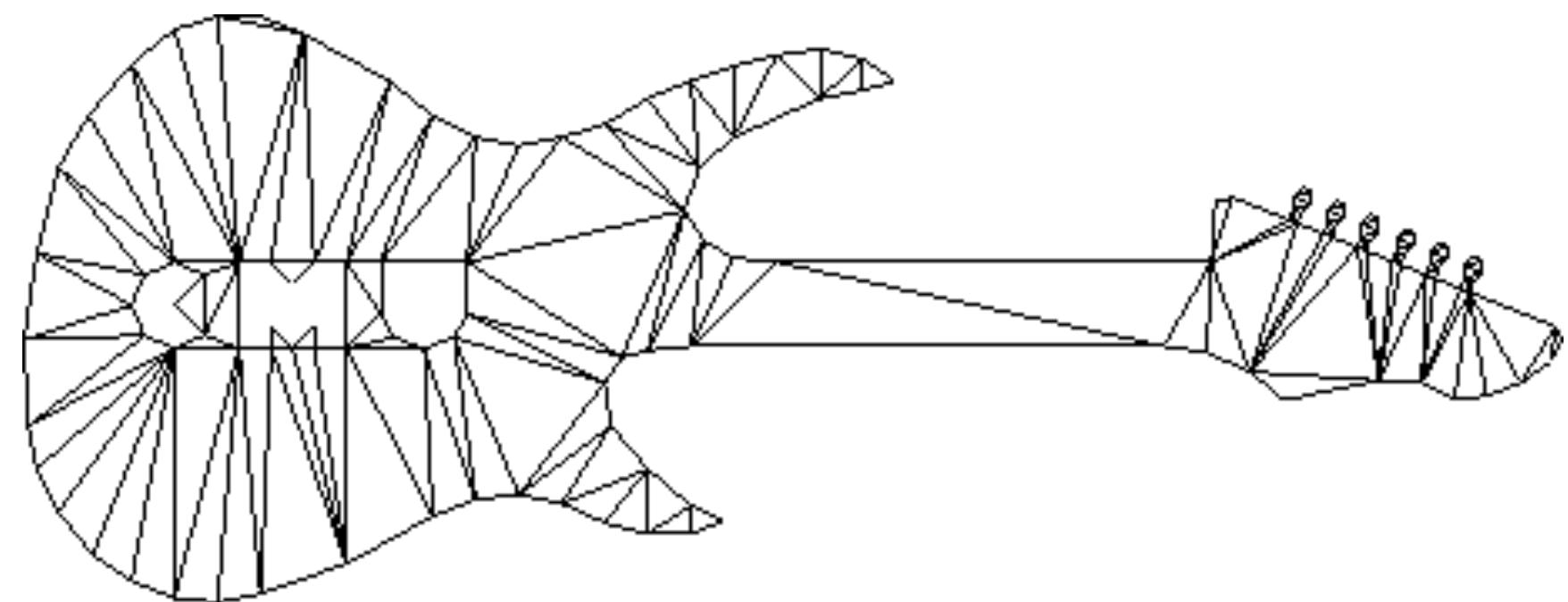
# 2D Meshing



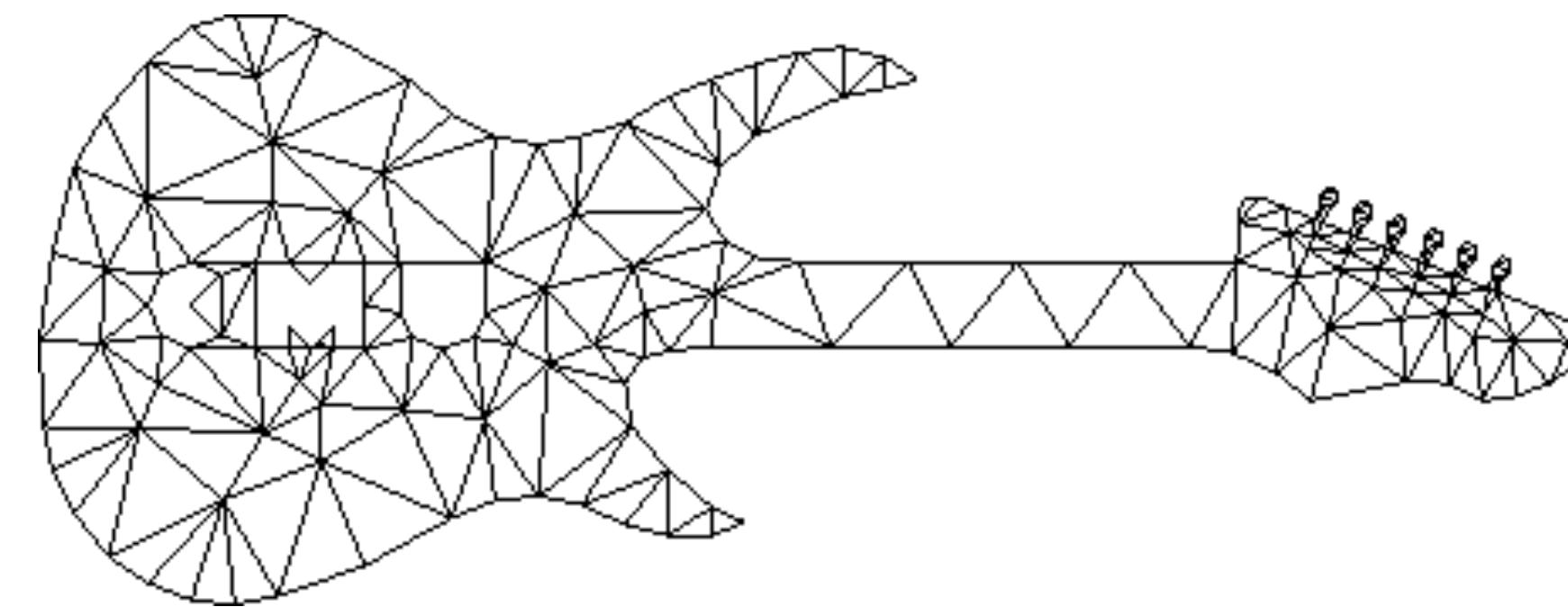
Input points & edges



Constrained Delaunay Triangulation



Remove exterior



Delaunay Refinement

**DT/VD**

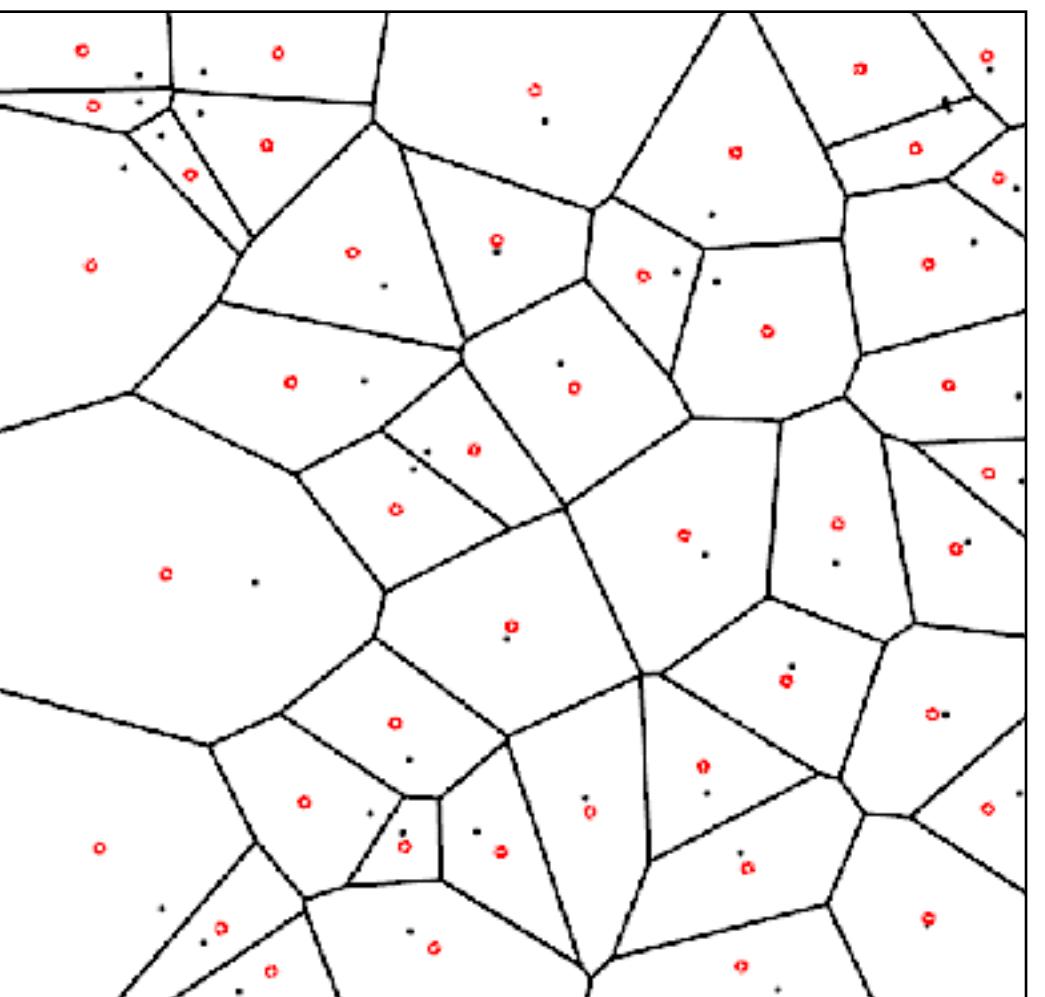


**DT/VD**

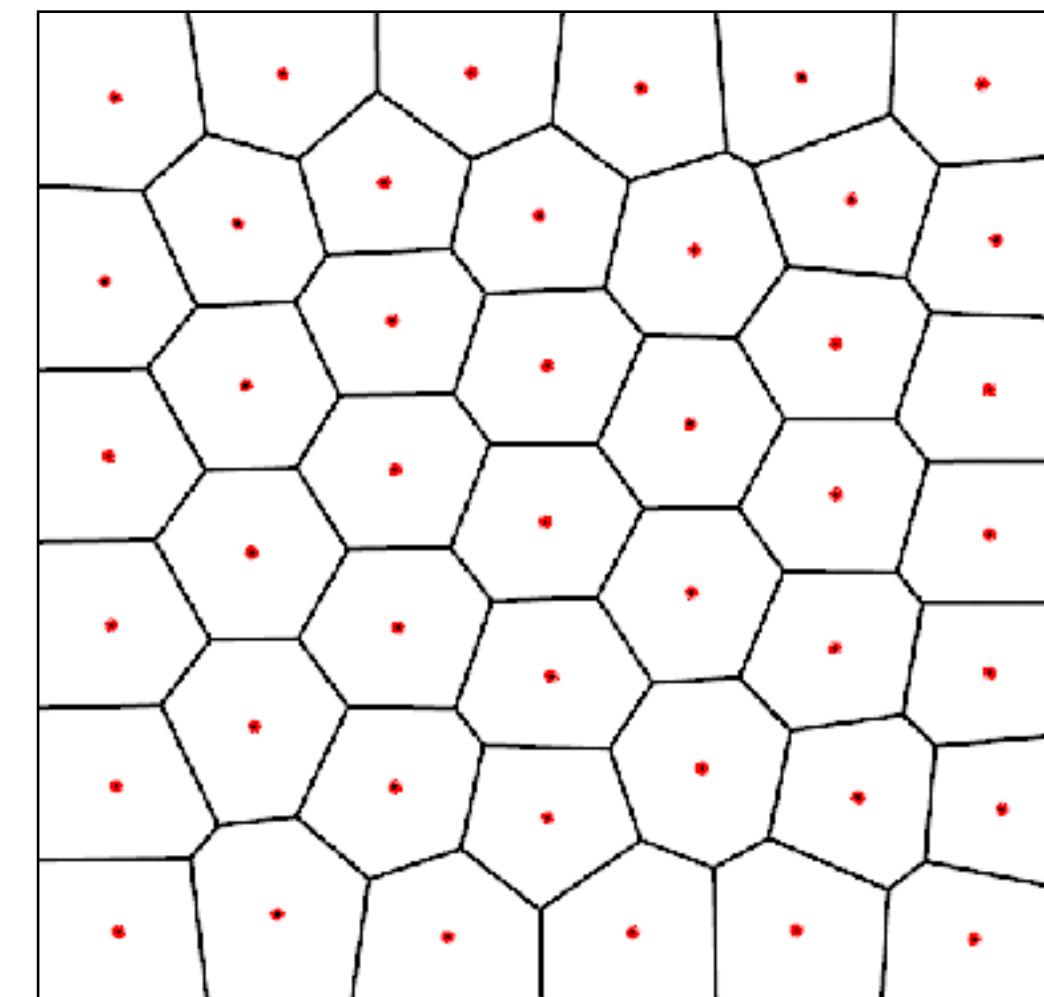


# Centroidal Voronoi Diagrams

- How can we get a more *regular* triangulation?
  - *Delaunay Triangulation* (DT) of *Centroidal Voronoi Diagram* (CVD)
- Definition:
  - All points are centroids of their Voronoi cells



VD



CVD

# Centroidal Voronoi Diagrams

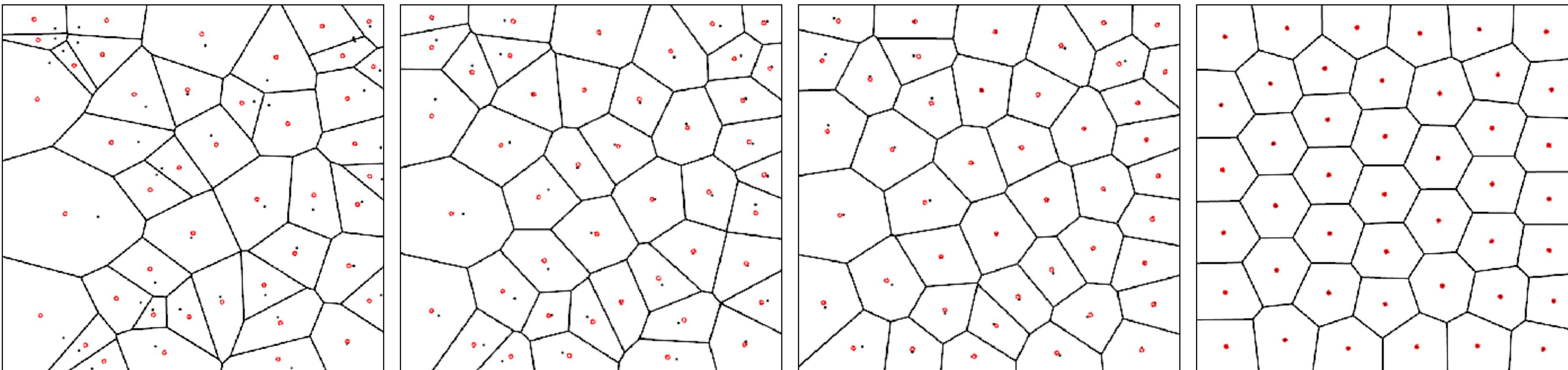


Compute CVD by iterative *Lloyd relaxation*

1. Compute Voronoi diagram of given point set  $\{\mathbf{p}_i\}$
2. Move  $\mathbf{p}_i$  to centroids  $\mathbf{c}_i$  of their Voronoi cells  $V_i$



$$\mathbf{p}_i \leftarrow \mathbf{c}_i = \frac{\int_{V_i} \mathbf{x} \cdot \rho(\mathbf{x}) \, d\mathbf{x}}{\int_{V_i} \rho(\mathbf{x}) \, d\mathbf{x}}$$



# Centroidal Voronoi Diagrams



Compute CVD by iterative *Lloyd relaxation*

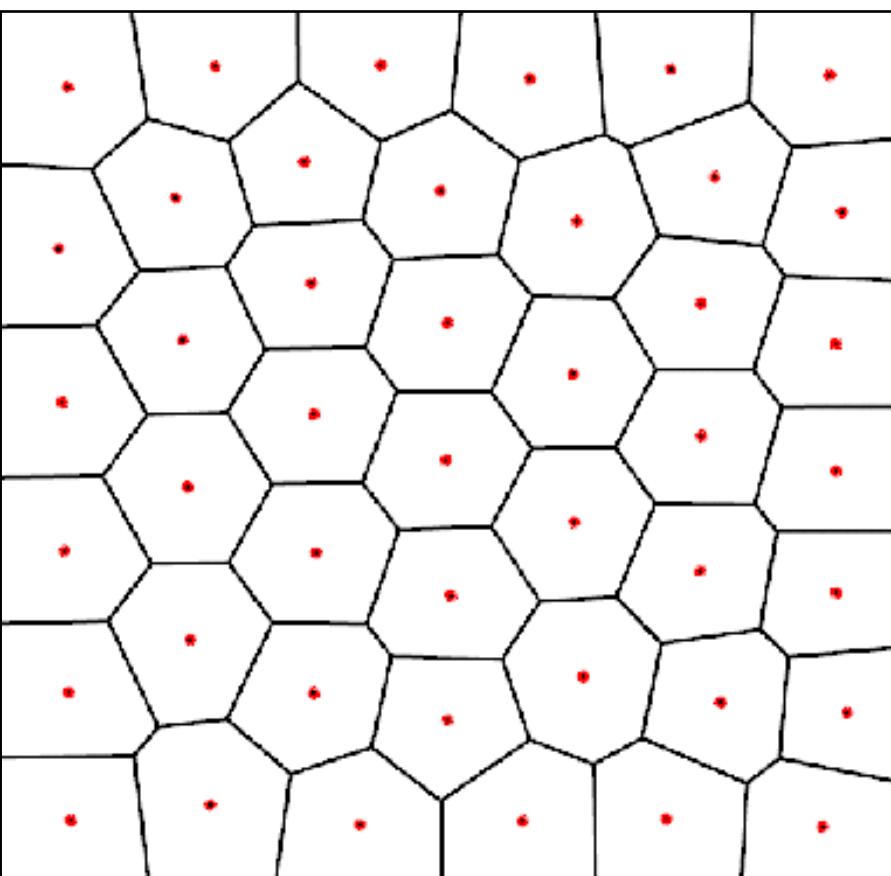
1. Compute Voronoi diagram of given points  $\mathbf{p}_i$
2. Move  $\mathbf{p}_i$  to centroids  $\mathbf{c}_i$  of their Voronoi cells  $V_i$



$$\mathbf{p}_i \leftarrow \mathbf{c}_i = \frac{\int_{V_i} \mathbf{x} \cdot \rho(\mathbf{x}) \, d\mathbf{x}}{\int_{V_i} \rho(\mathbf{x}) \, d\mathbf{x}}$$

- CVD maximizes compactness
  - Minimizes this energy

$$\sum_i \int_{V_i} \rho(\mathbf{x}) \|\mathbf{x} - \mathbf{p}_i\|^2 \, d\mathbf{x} \rightarrow \min$$

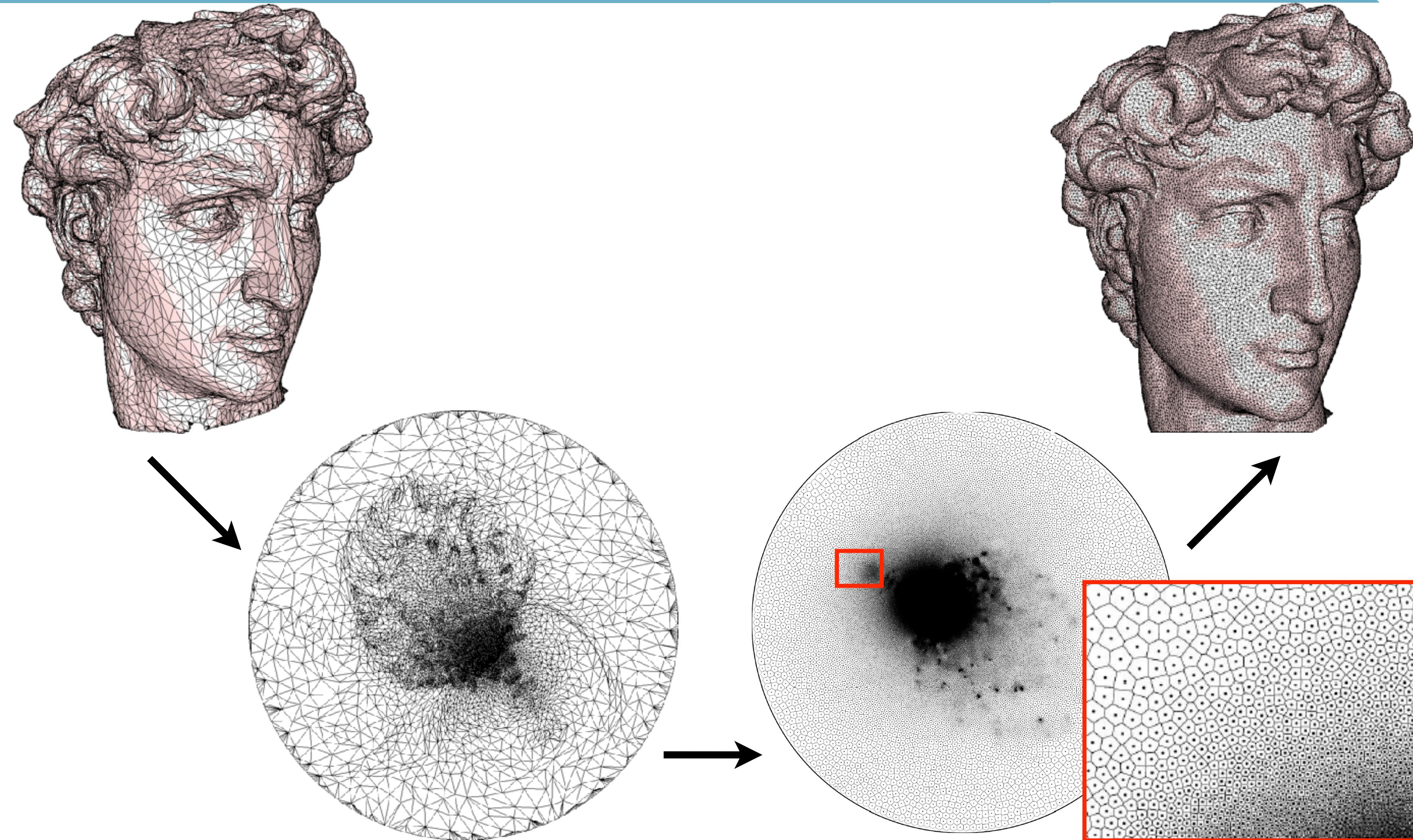


# Overview



- 2D Meshing
- Parameterization-Based Remeshing
- Surface-Based Remeshing

# Parameterization-Based Remeshing



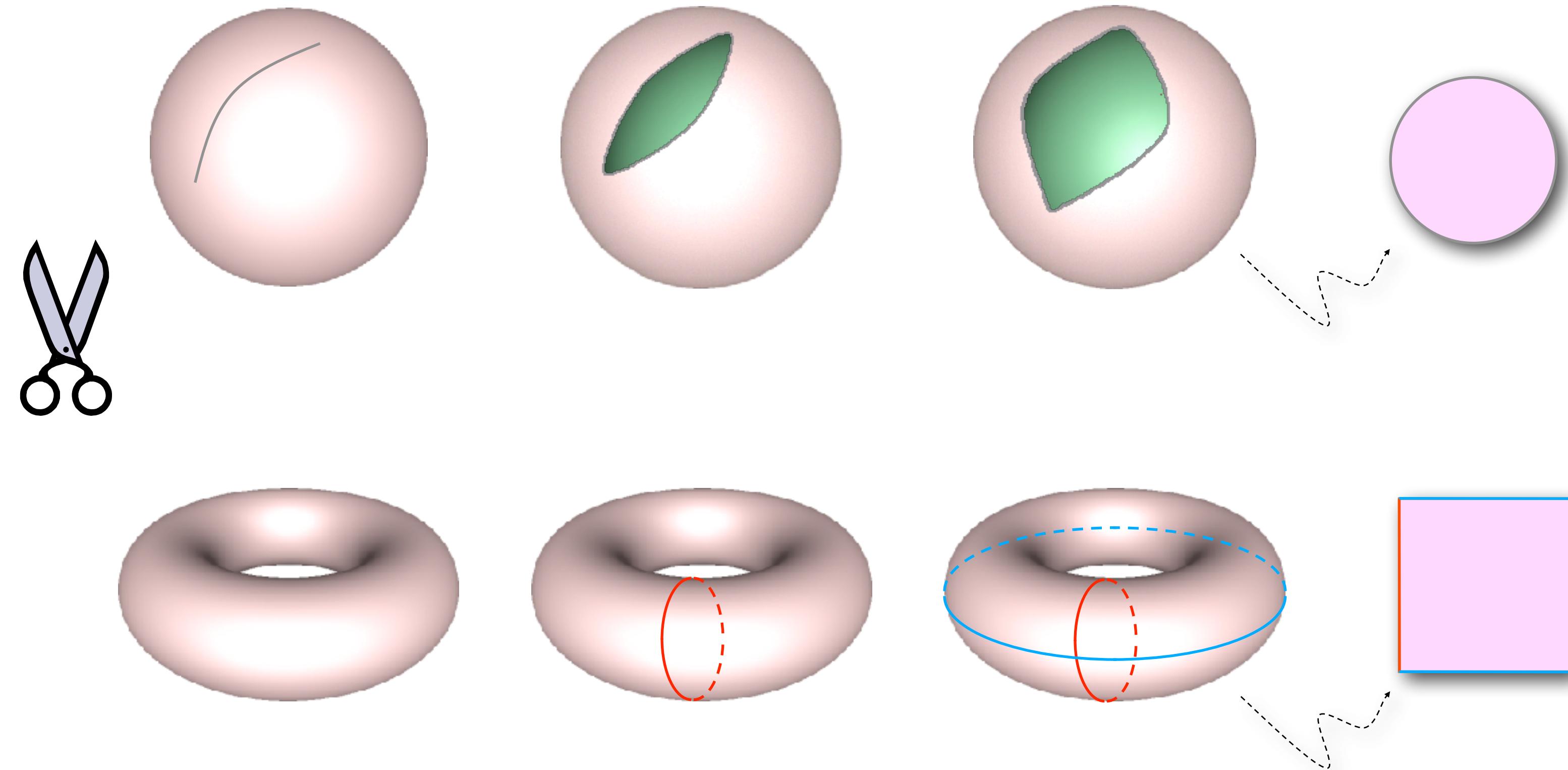
# Use a Global Parameterization



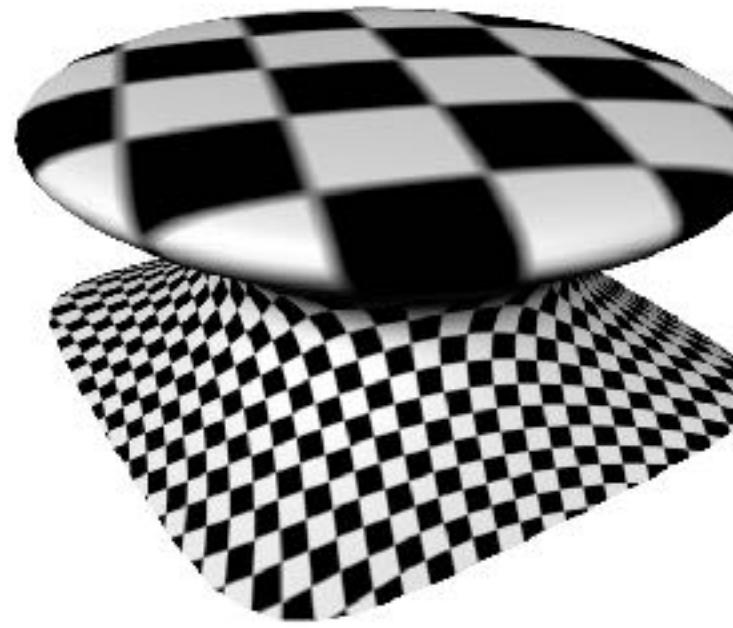
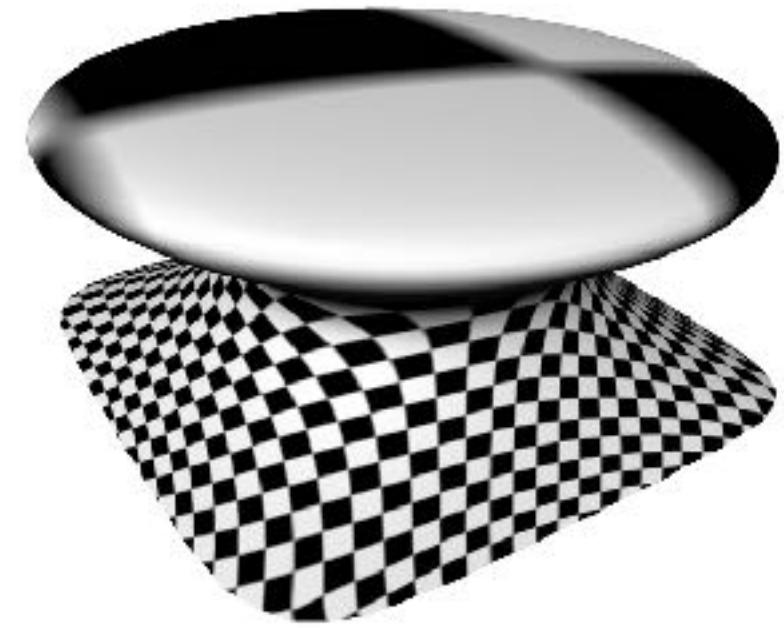
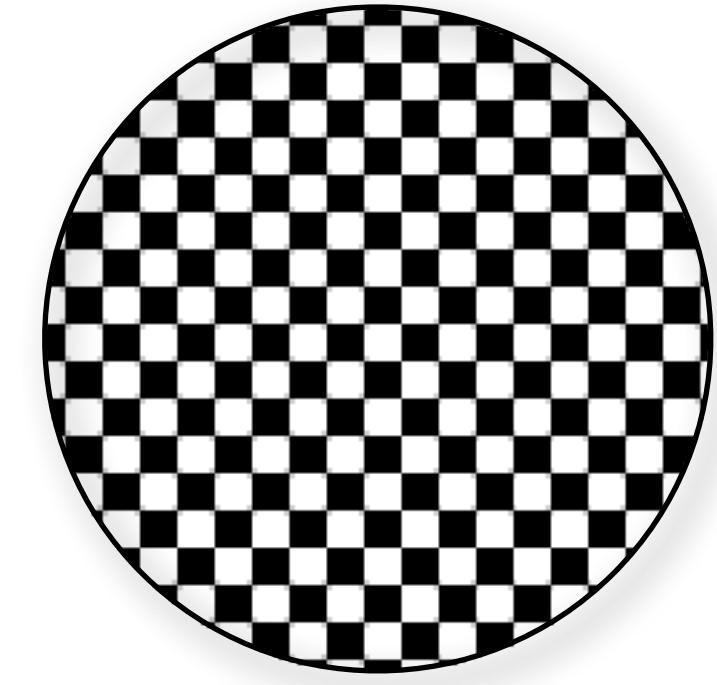
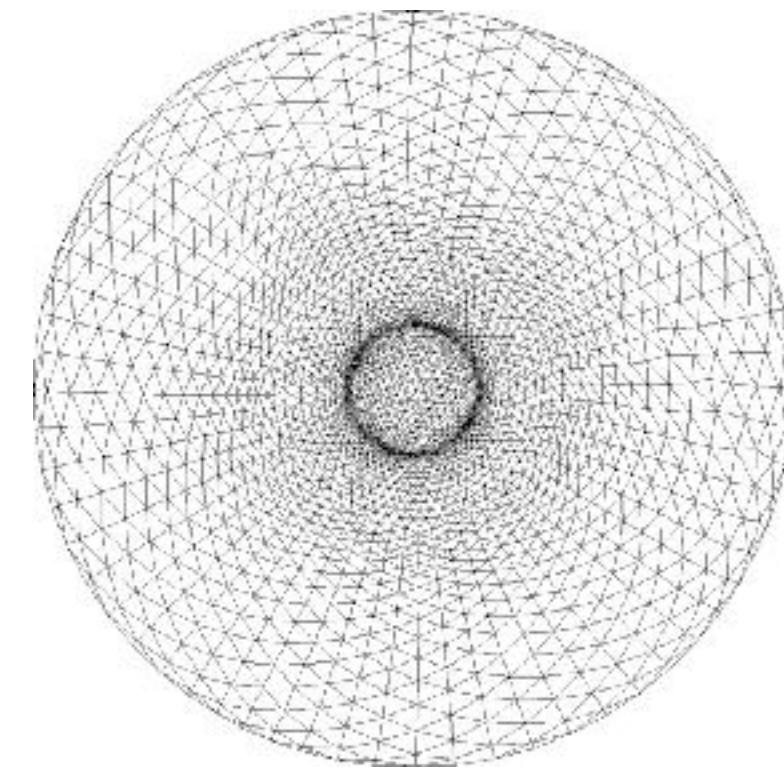
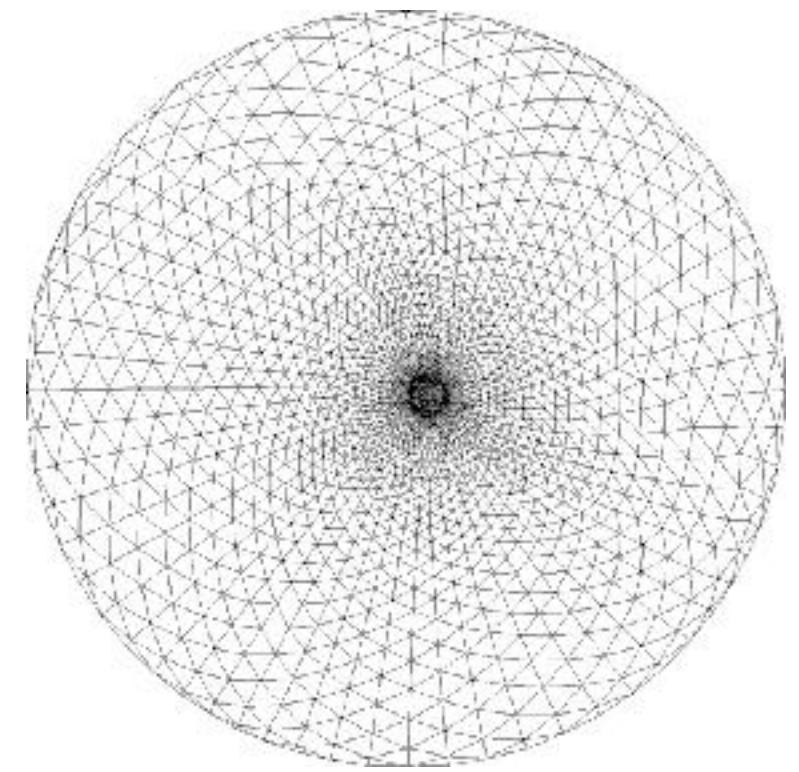
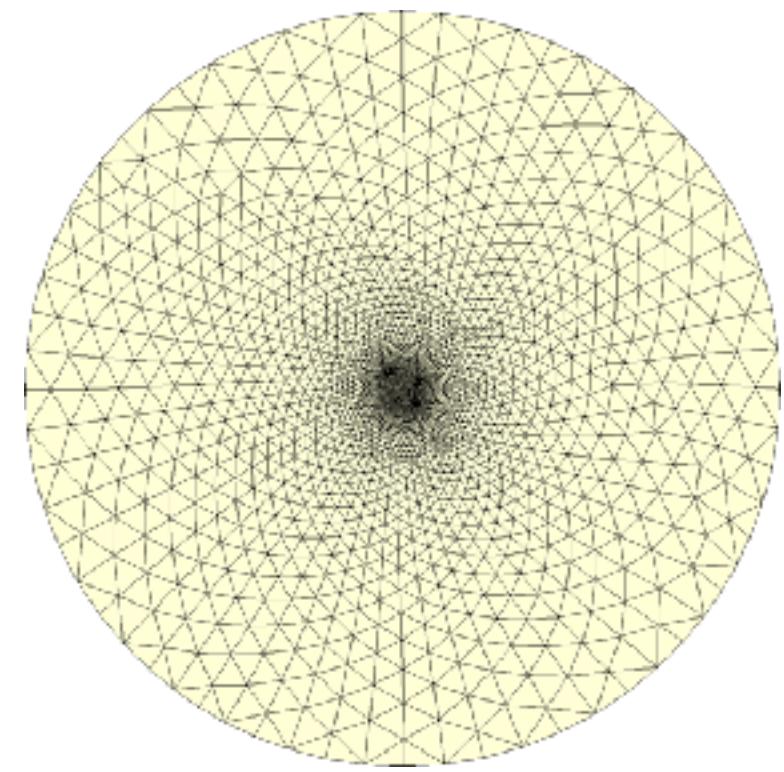
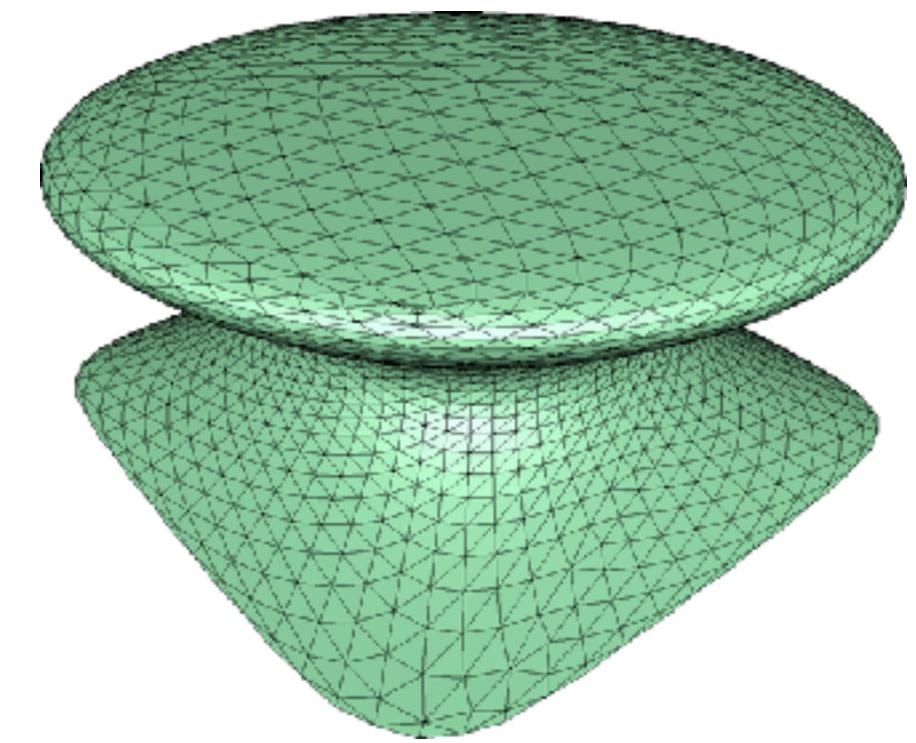
- **Motivation:** 2D remeshing is much easier
  - Distribution of sample points
  - Centroidal Voronoi diagram
  - Delaunay triangulation
- Which parameterization method to use?
  - Minimize distortion (conformal, isometric, ...)
  - Cut path for higher genus models
  - Free versus fixed boundary

# Need disk-like topology

- Introduce cuts on the mesh



# Parameterization Methods



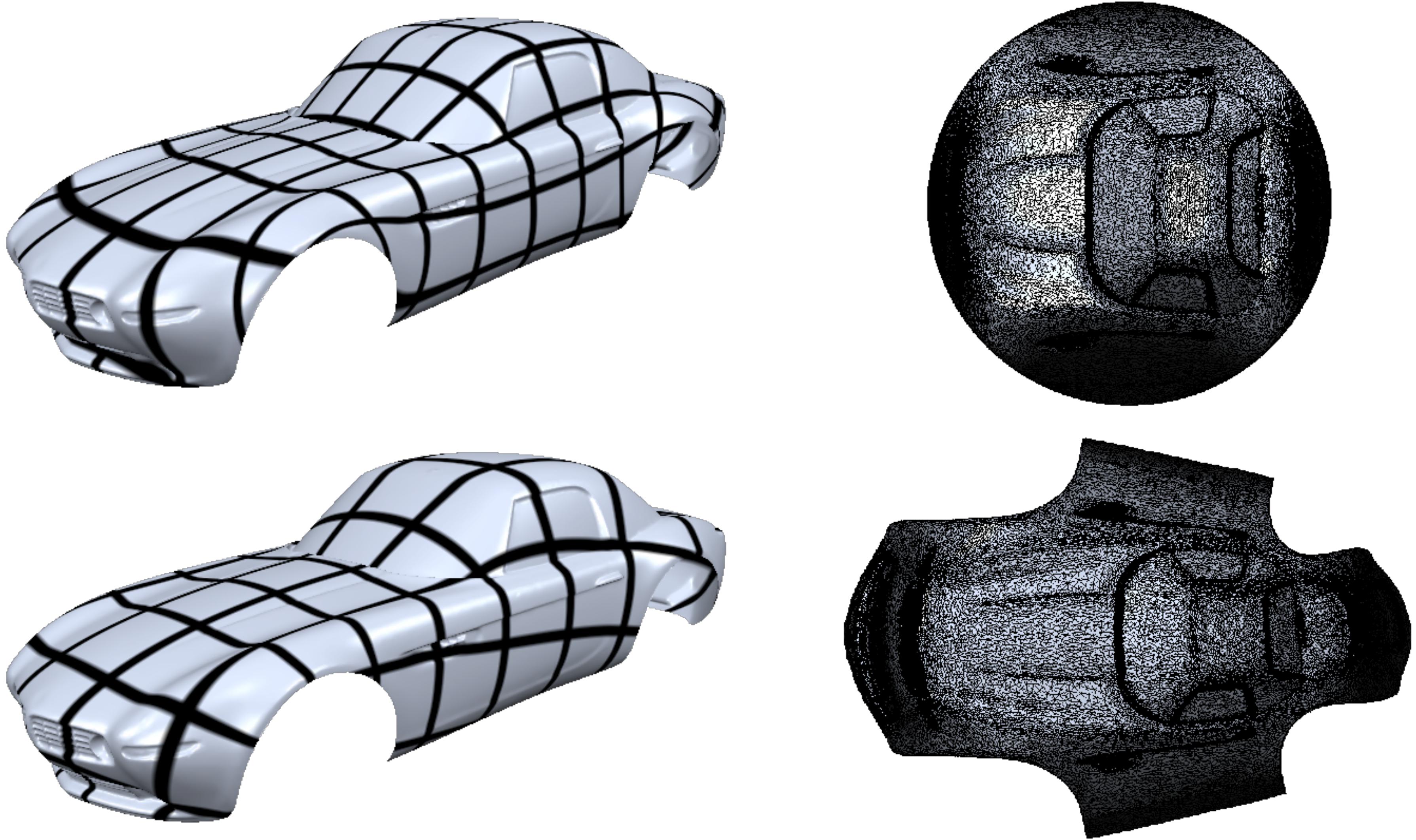
Texture map

Tutte

Shape-preserving

Conformal

# Fixed vs. Free Boundary



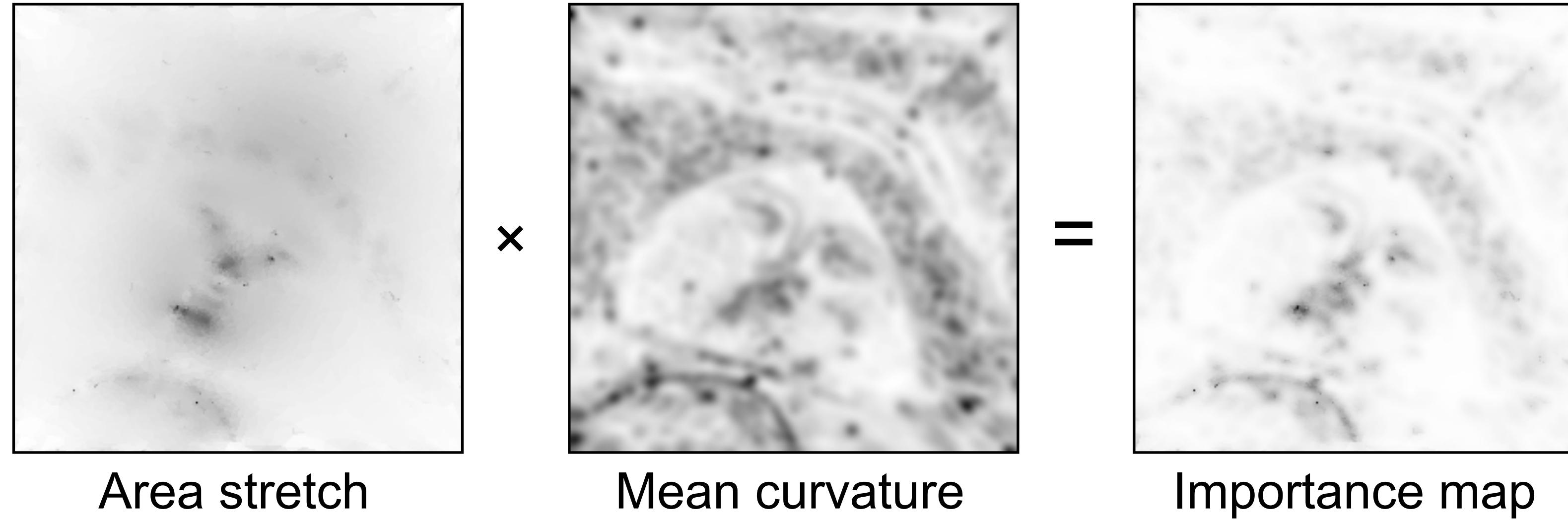
# Initial Sampling



- Randomly sample 2D triangles
  - Weighted by triangle area and density  $\rho$
  - **Density**: curvature or user-defined sizing field
- Compensate area distortion when sampling in the parameter domain
  - Distortion =  $\text{triangle\_area3D} / \text{triangle\_area2D}$

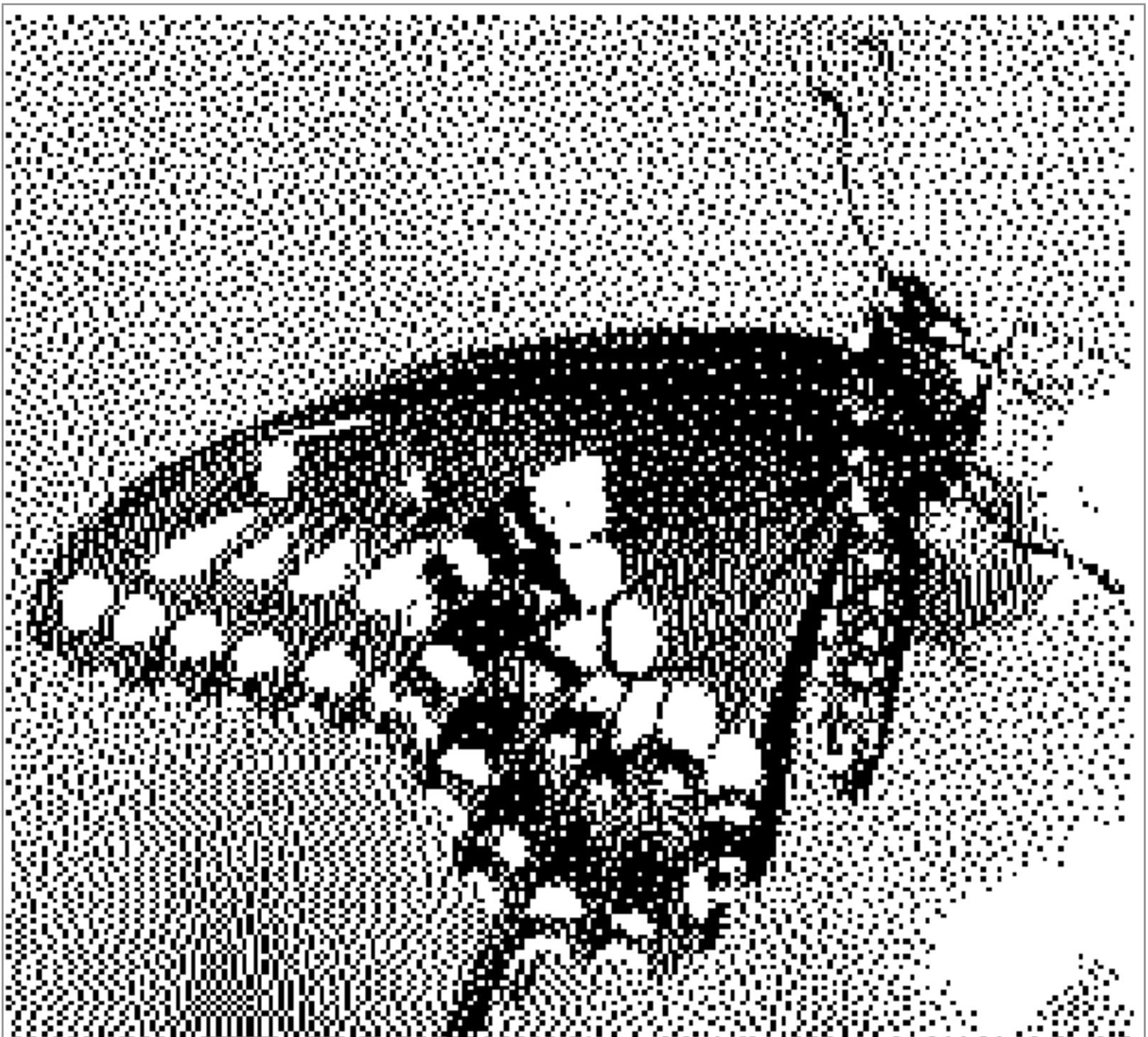
# Initial Sampling

- Compose importance map



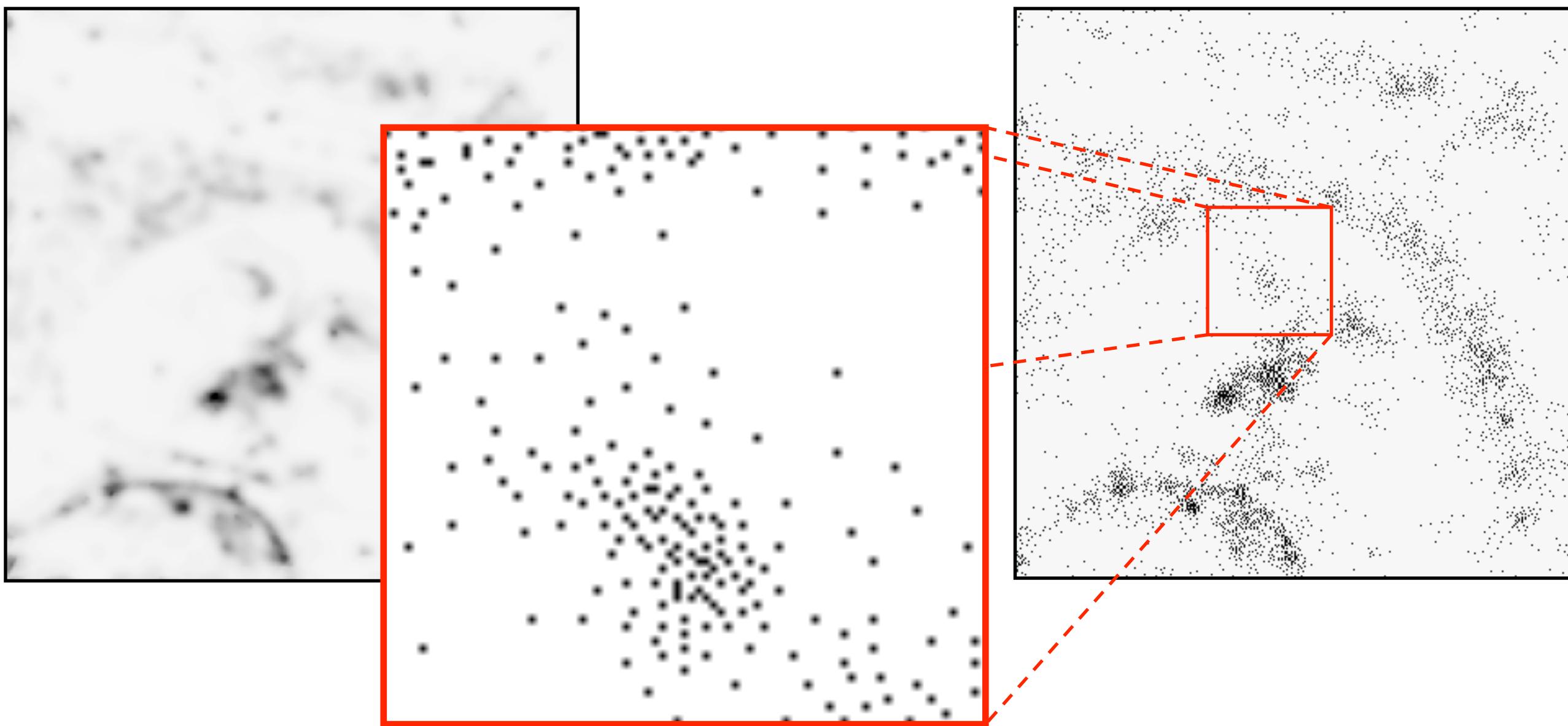
# Initial Sampling

- 2D error diffusion on importance map
  - Use half-toning or dithering techniques
  - “Print grey images with B/W printer”



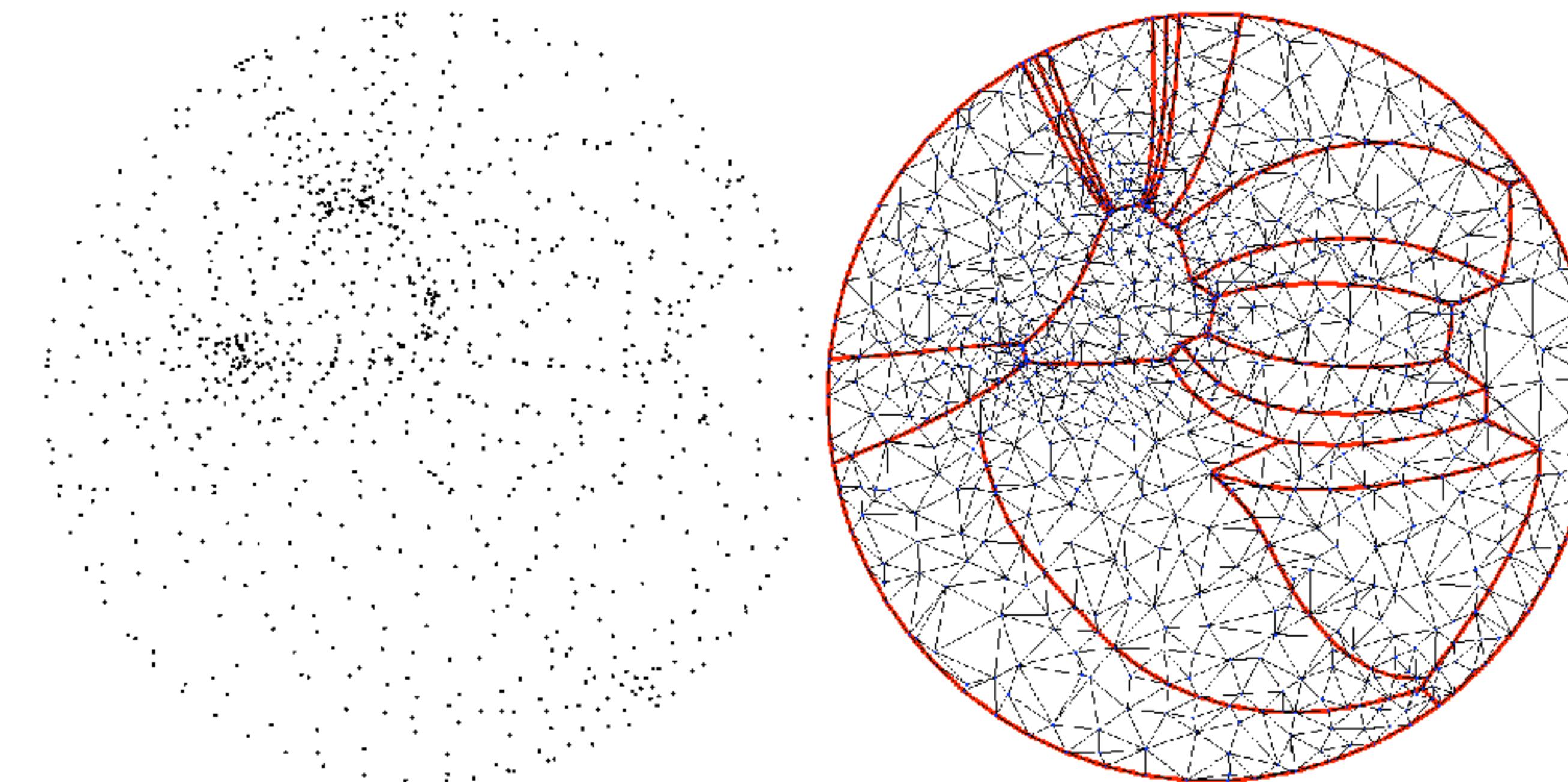
# Initial Sampling

- 2D error diffusion on importance map
  - Use half-toning or dithering techniques
  - “Print grey images with B/W printer”



# Initial Meshing

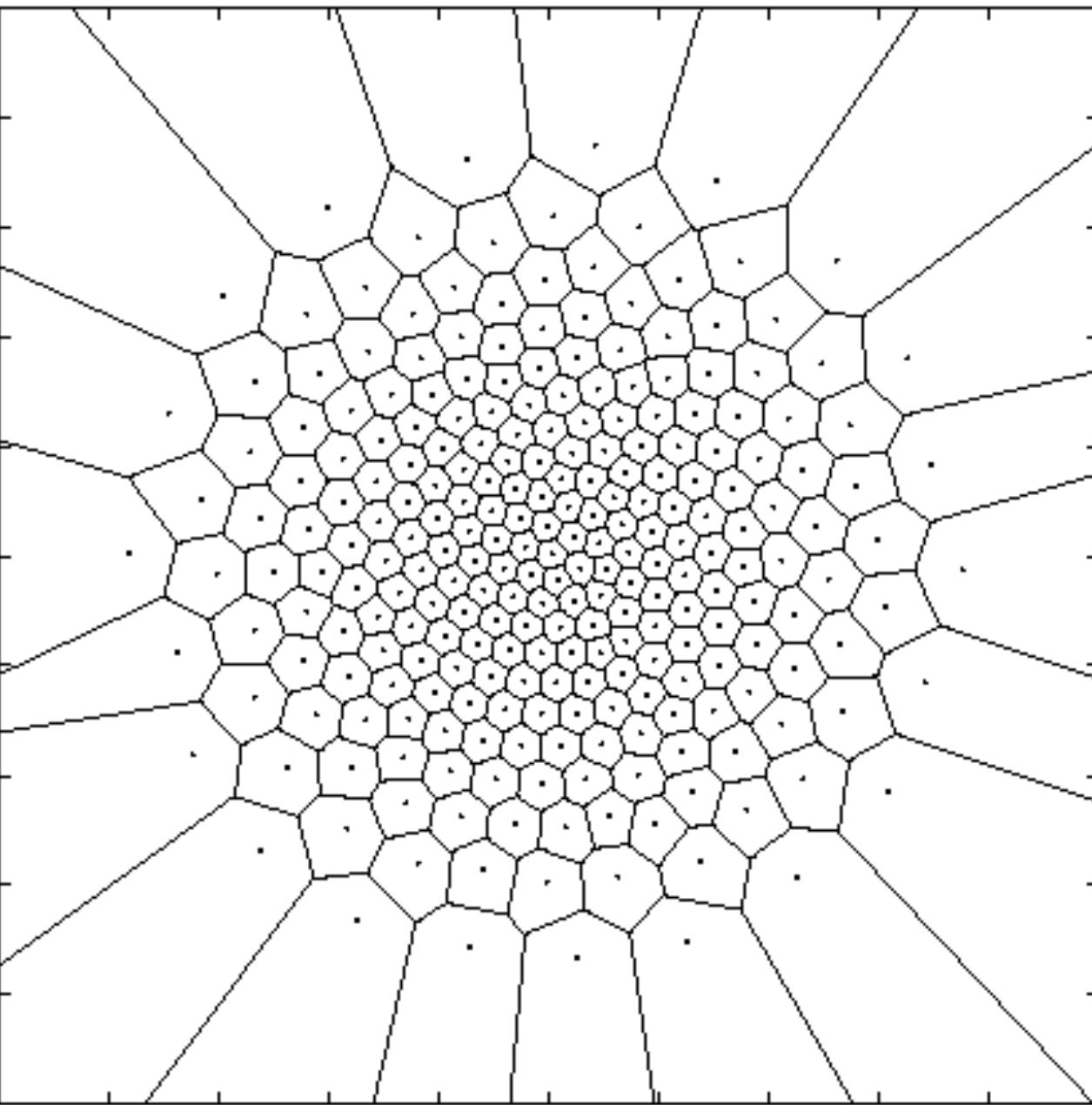
- 2D *constrained* Delaunay triangulation
  - Preserve feature edges / vertices
  - CGAL library provides robust implementation



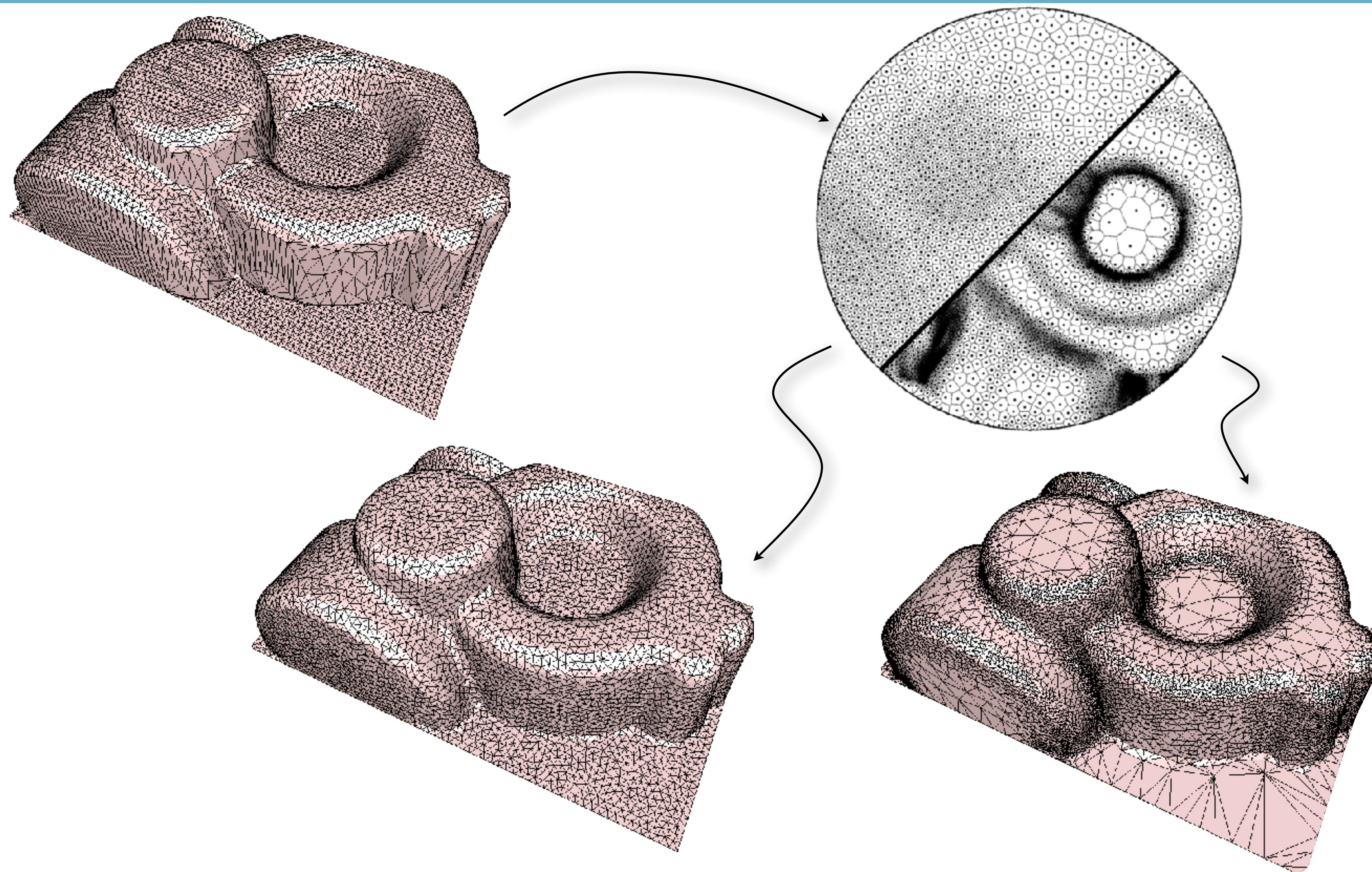
# Optimize Sample Distribution



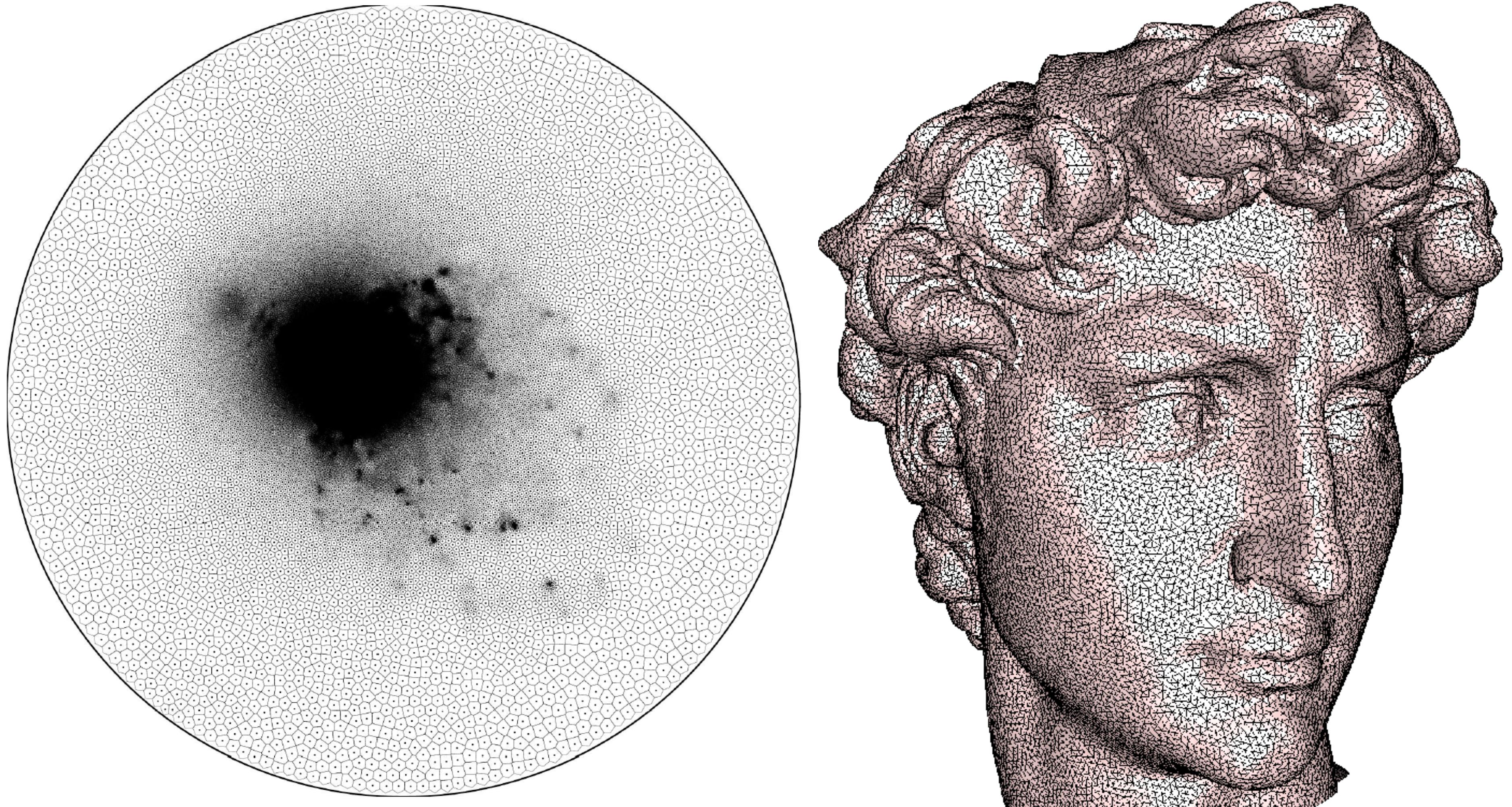
- Density-weighted centroidal Voronoi diagram
  - Equal mass enclosing
  - Tiles as compact as possible
  - Highly isotropic sampling
  - Lloyd clustering



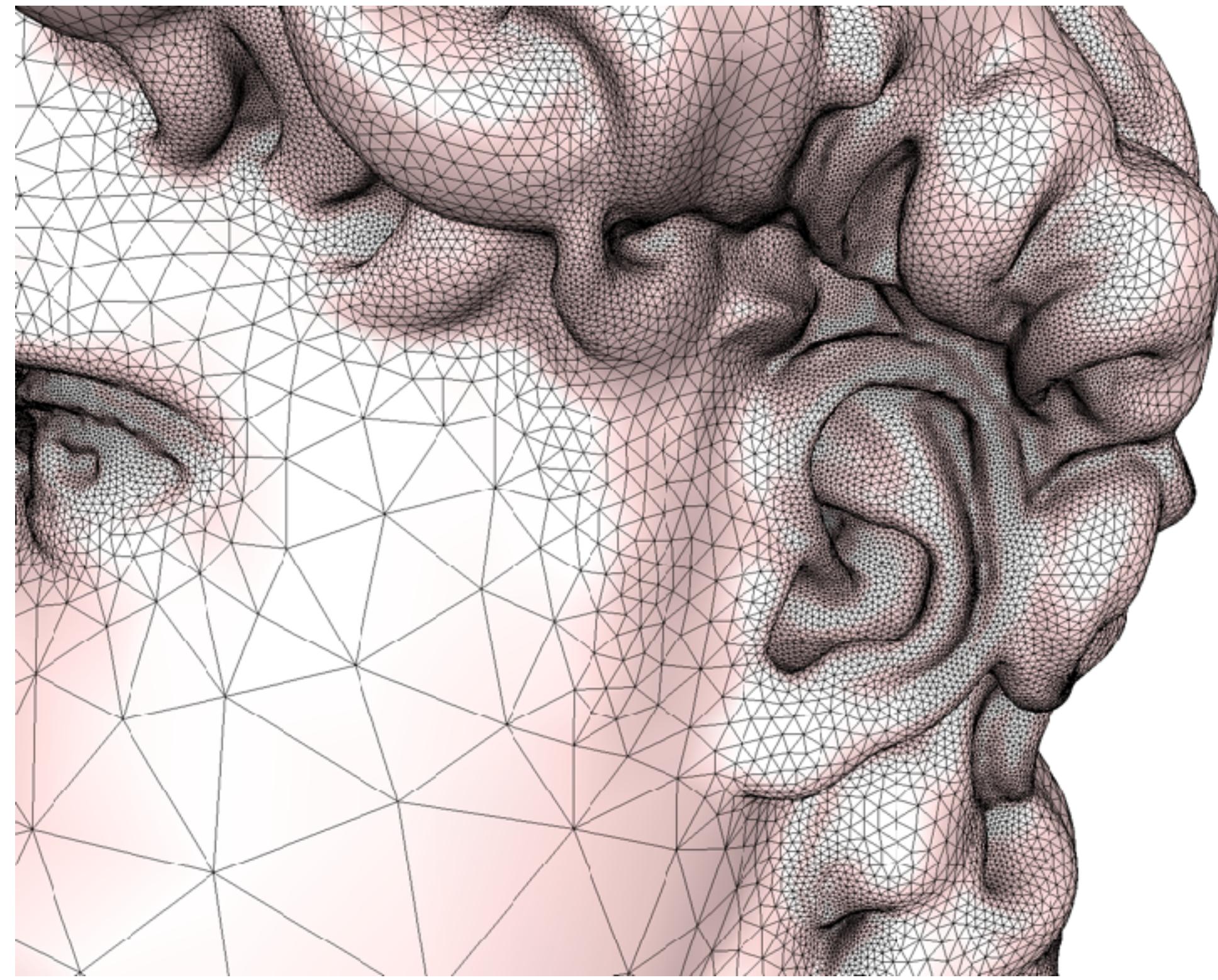
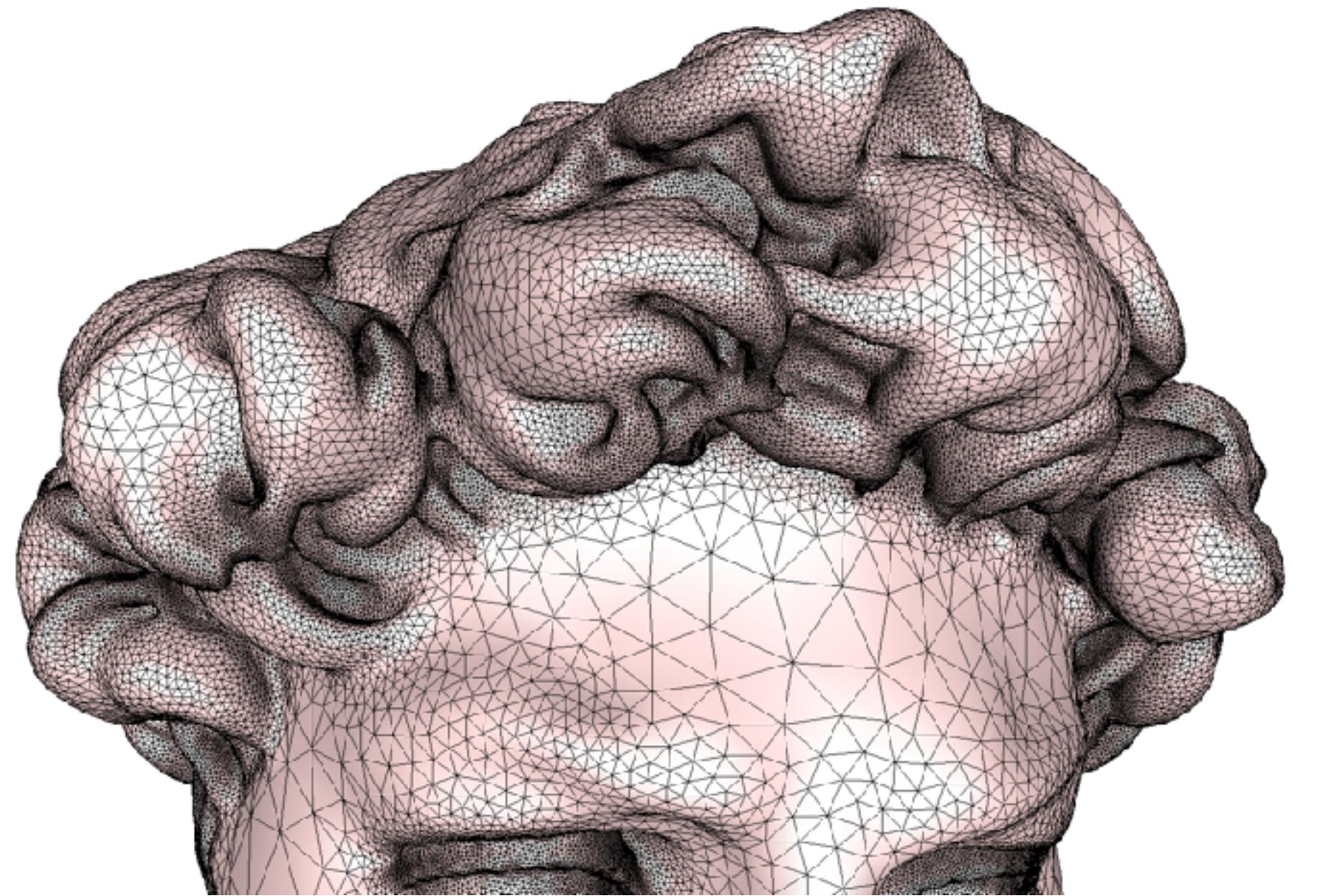
# Uniform vs. Adaptive



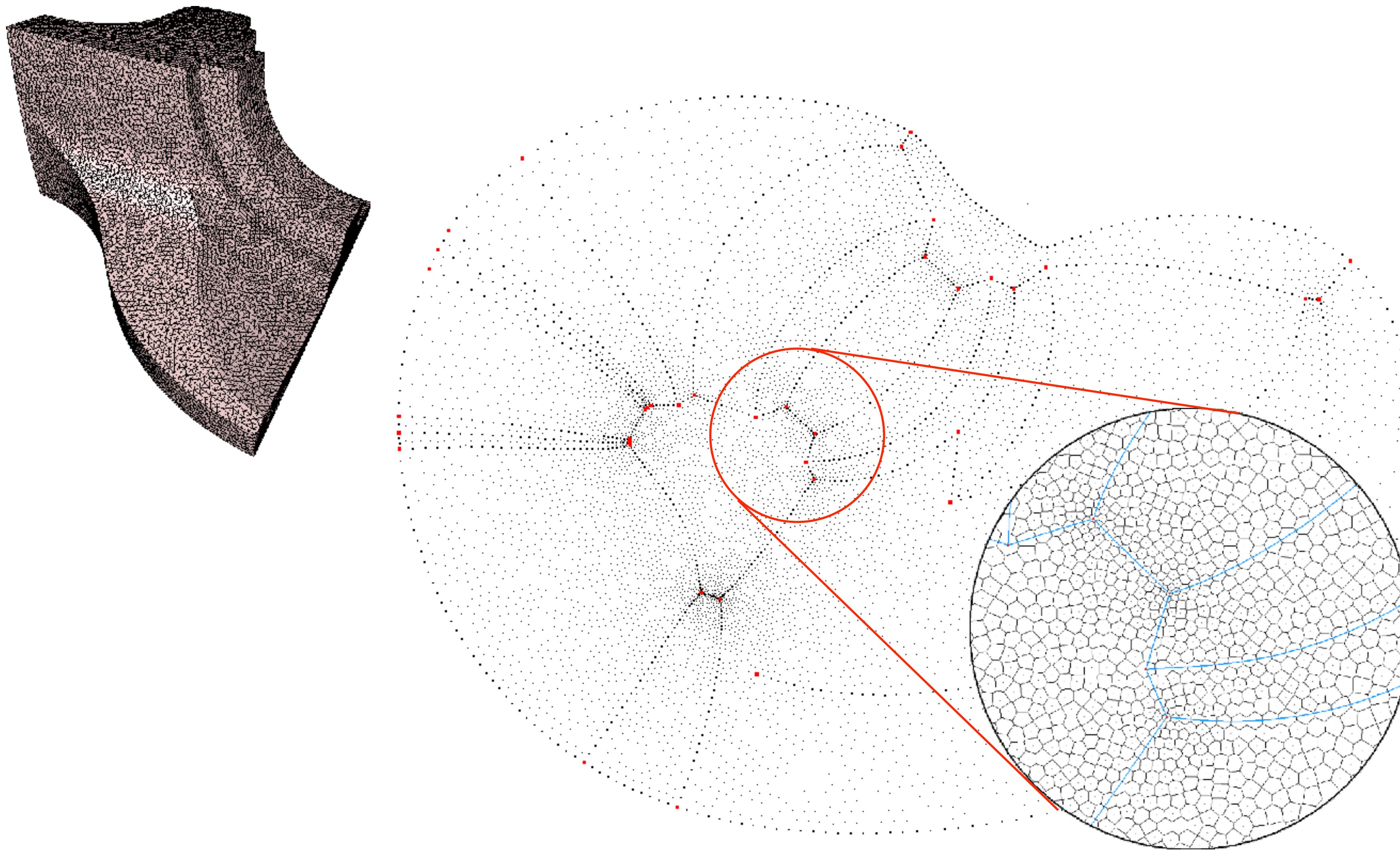
# Uniform Sampling



# Adaptive Sampling



# Sharp Features

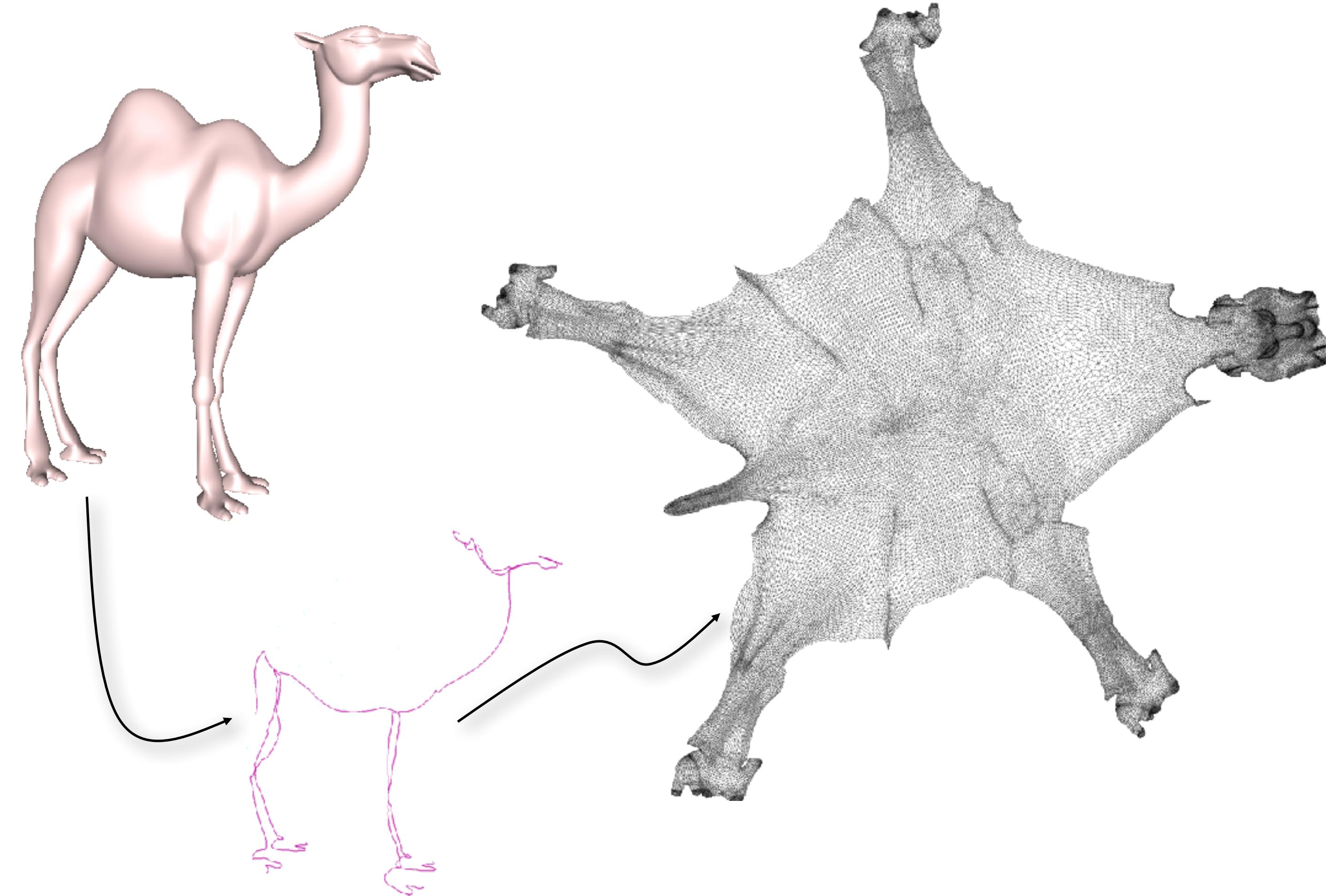


# Limitations

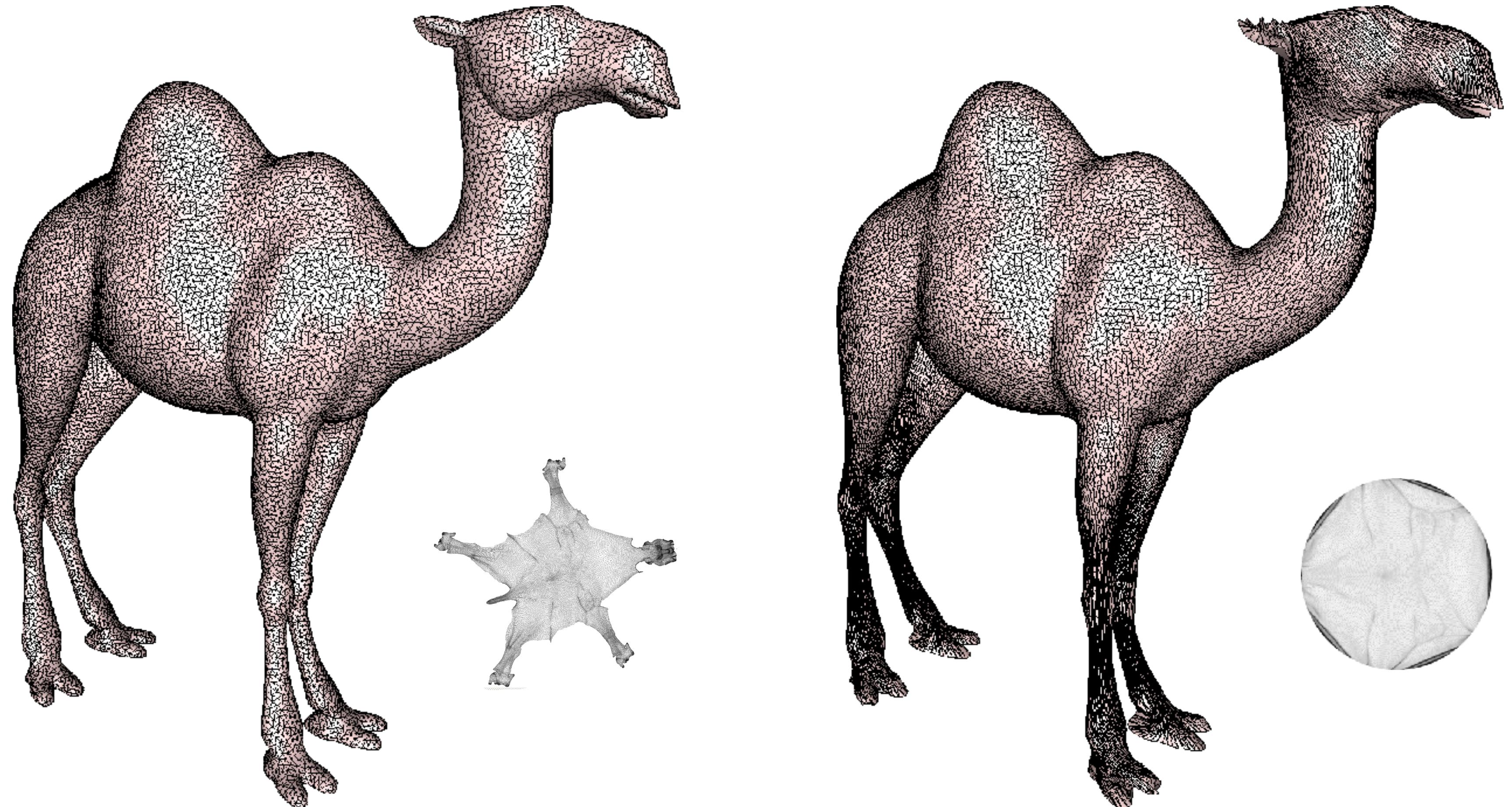
- Closed meshes
  - Need a good cut path
  - Free boundary parameterization
  - Stitch seams afterwards
- Protruding features
  - Legs, arms, ...
  - Numerical problems
  - Sampling fails



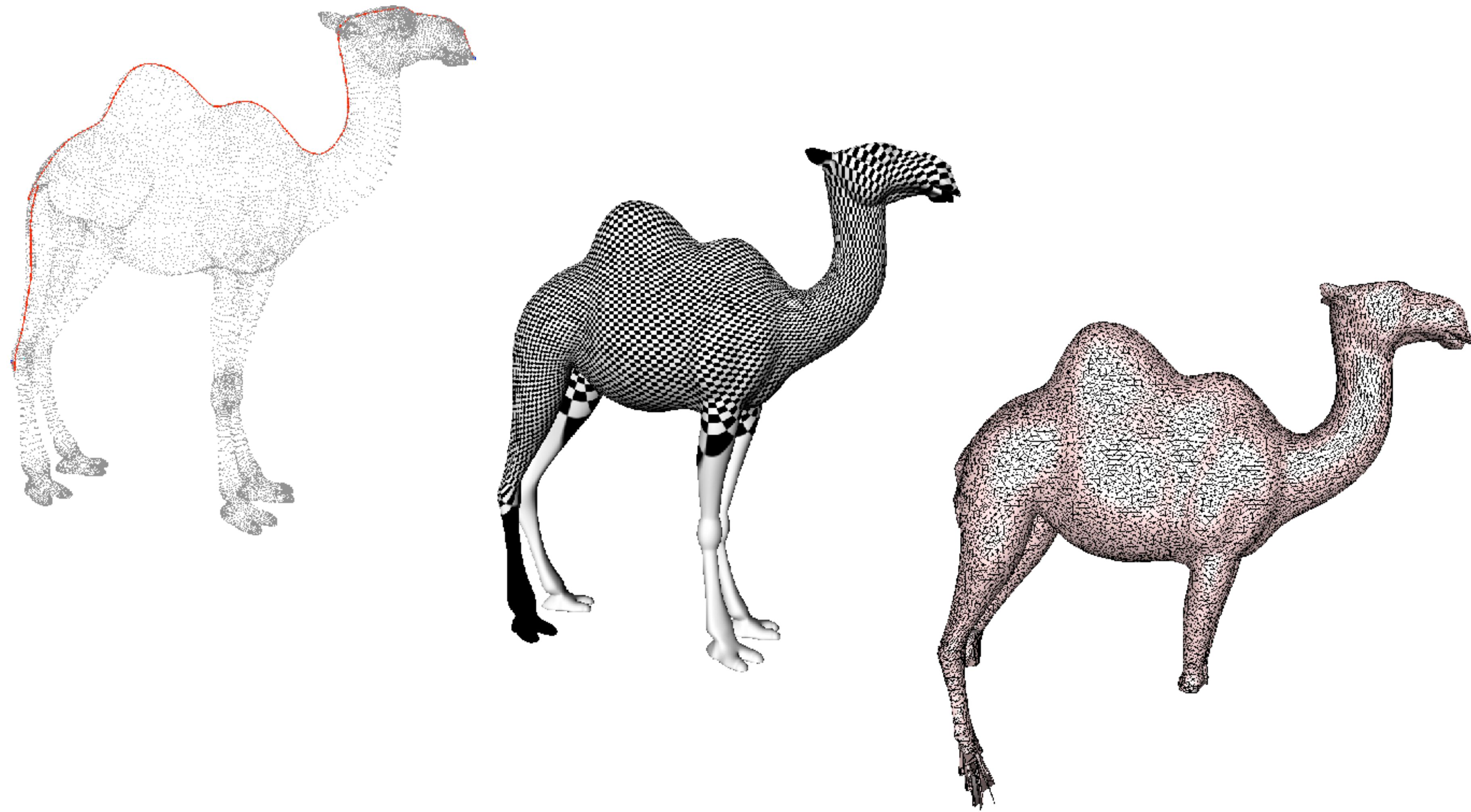
# Smart Cut, Free Boundary



# Free vs. Fixed Boundary



# Naive Cut, Numerical Problems

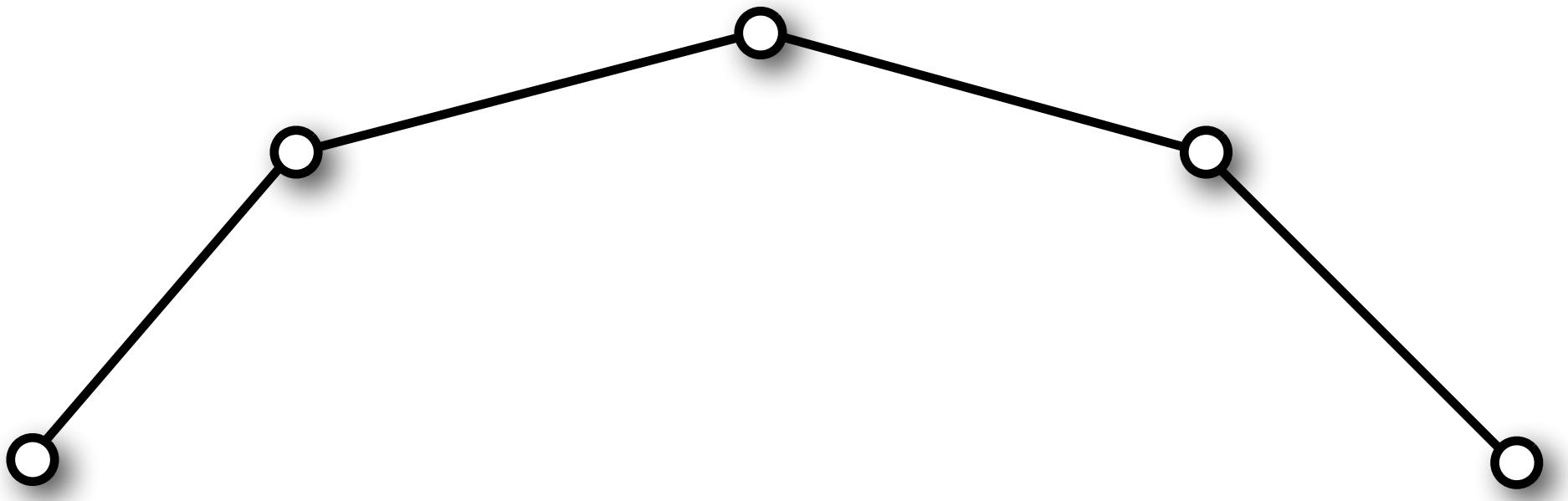


# Overview

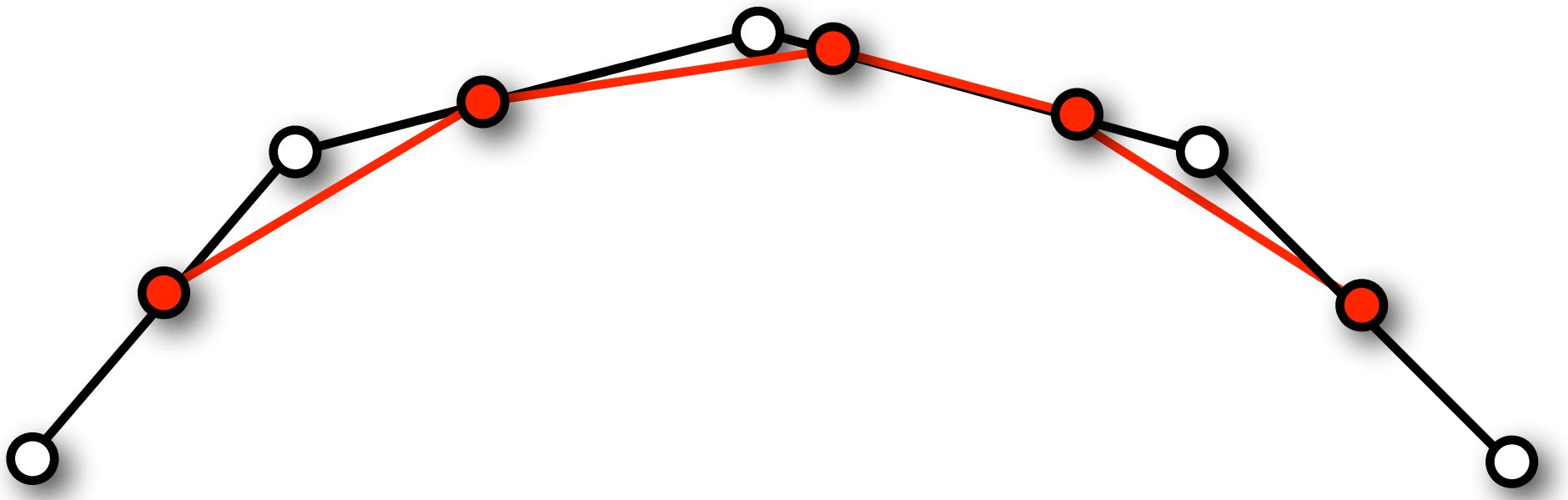


- 2D Meshing
- Parameterization-Based Remeshing
- **Surface-Based Remeshing**

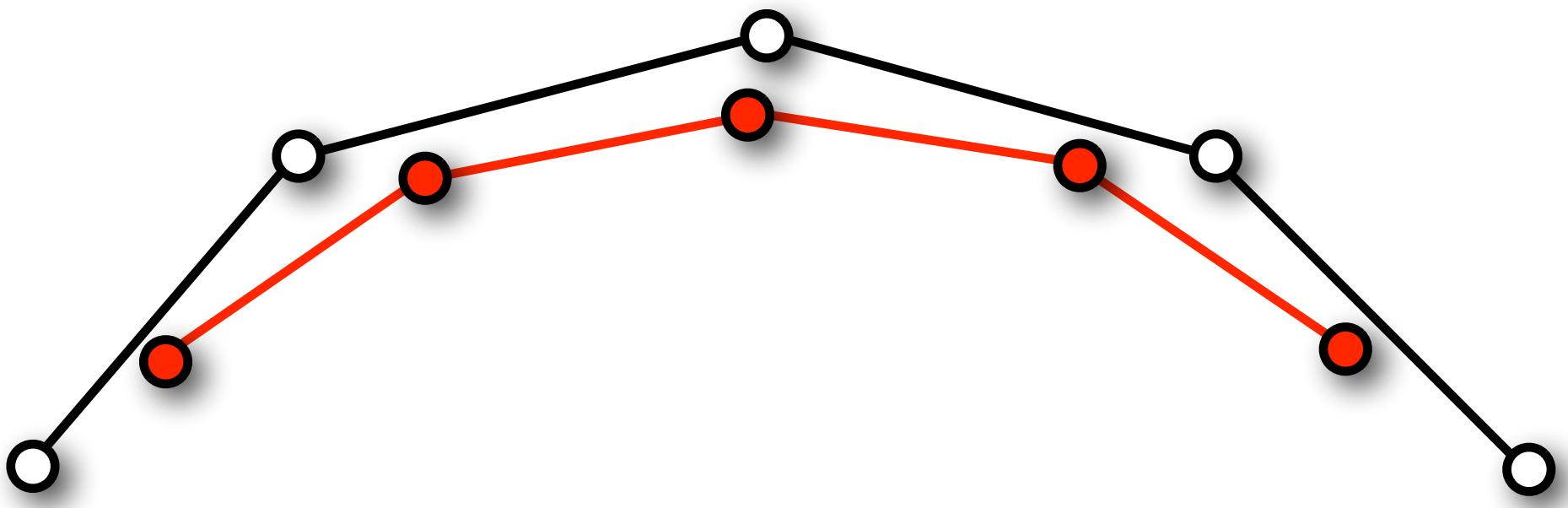
# 2. Surface Based



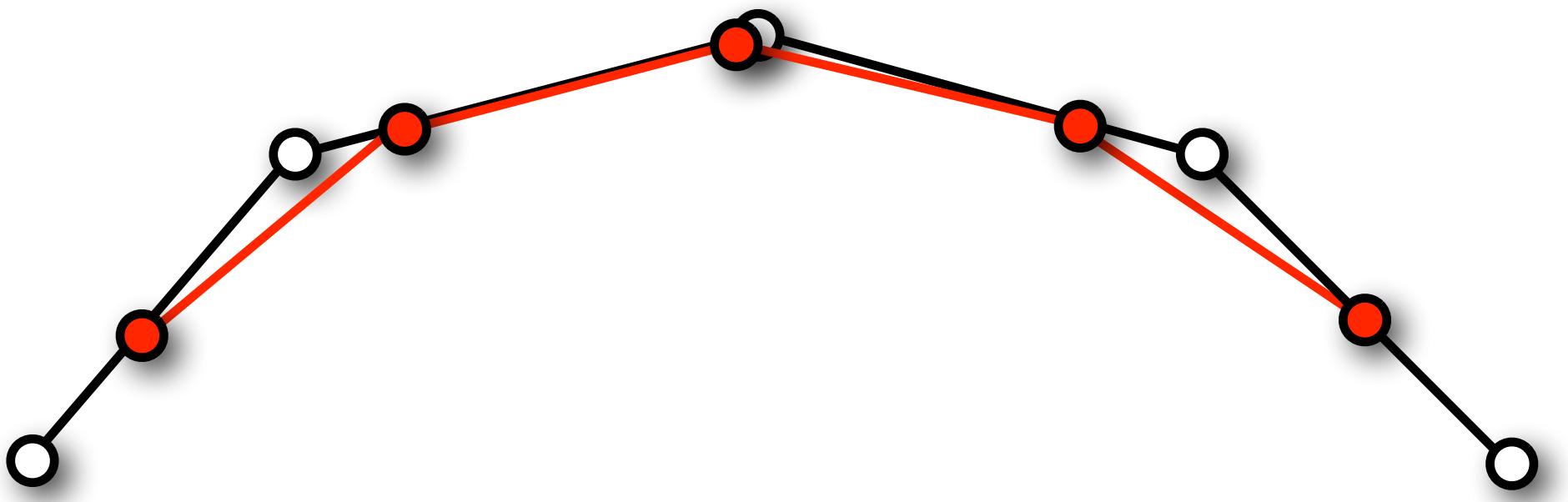
# 2. Surface Based



# 2. Surface Based



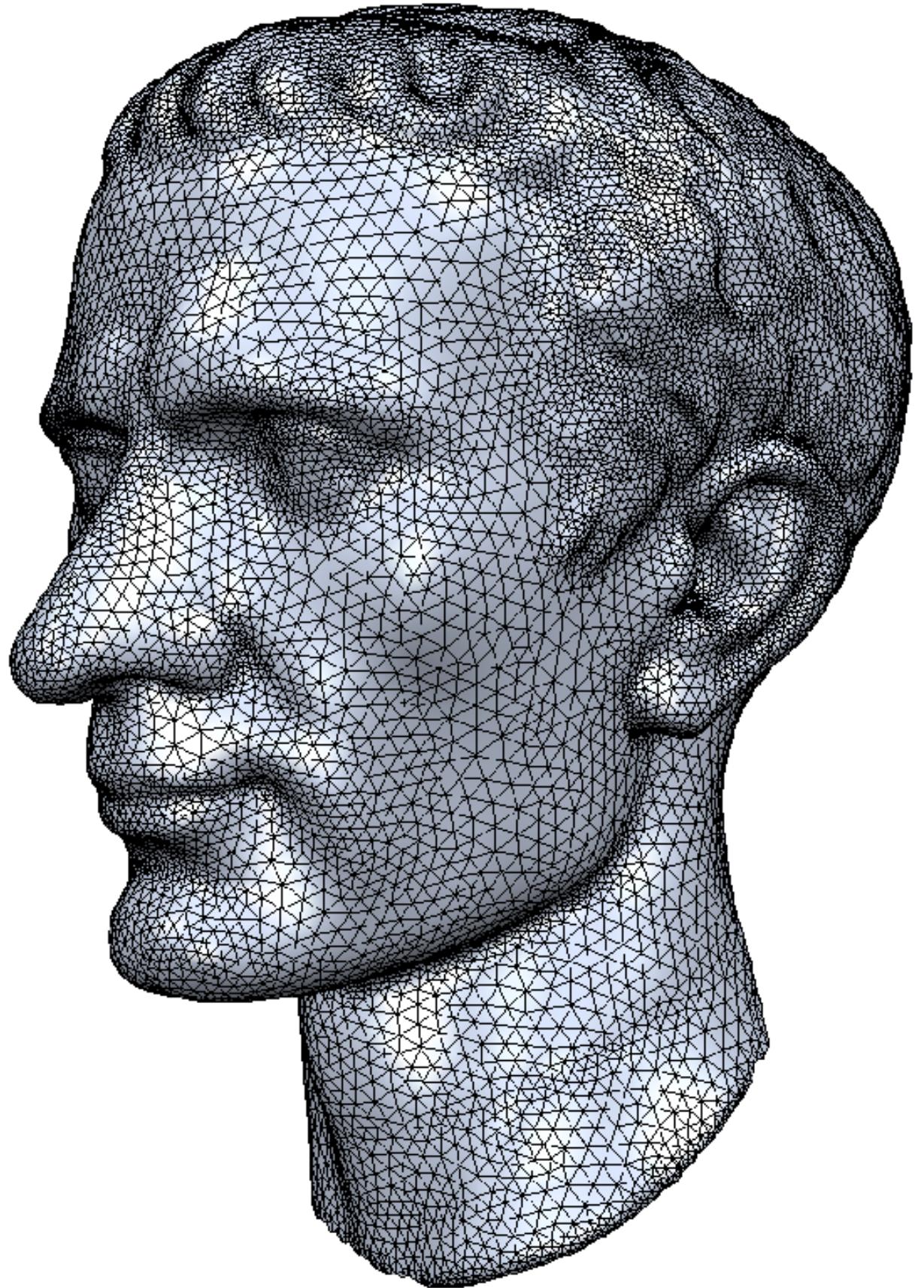
# 2. Surface Based



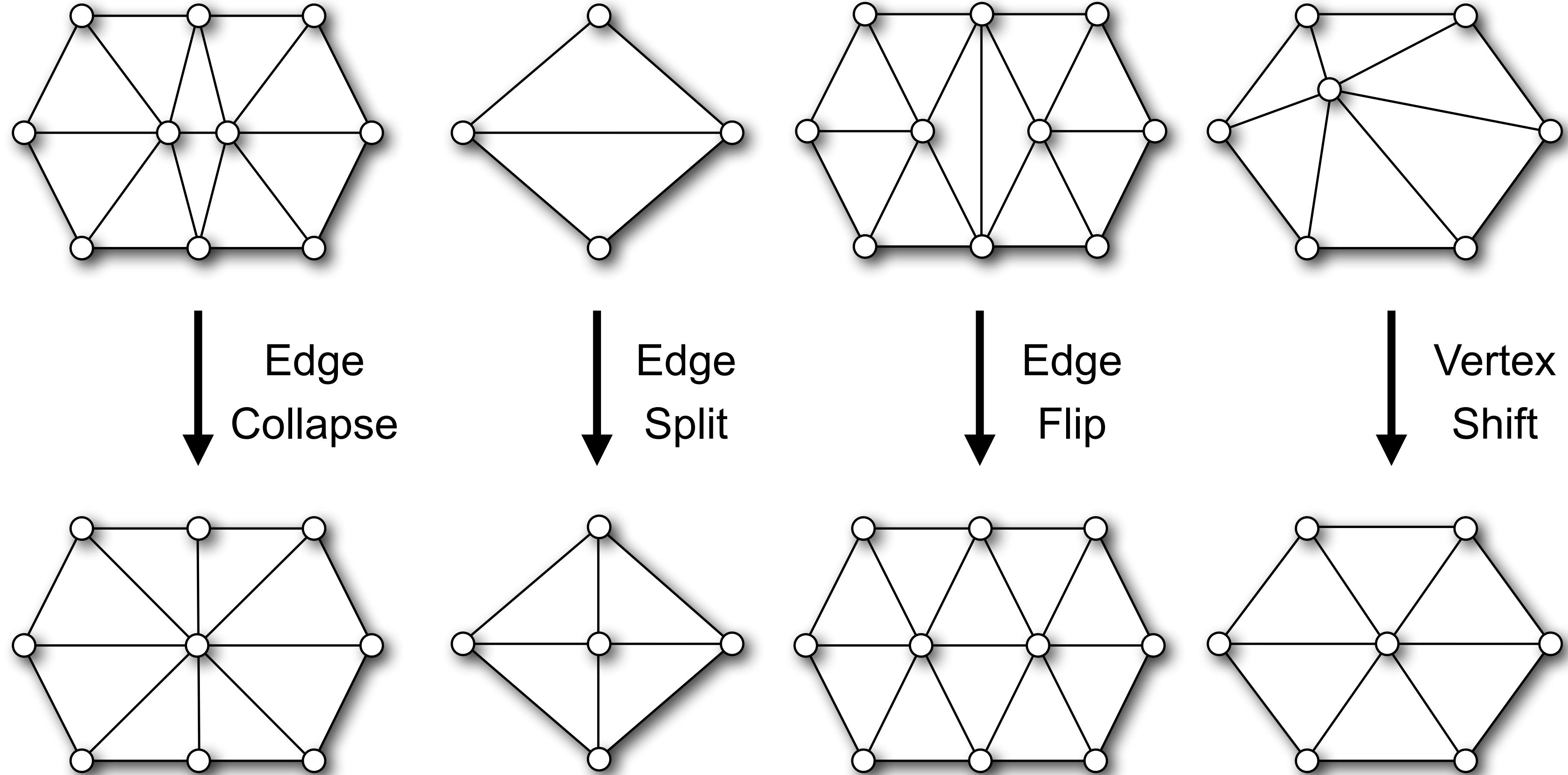
# Direct Surface Remeshing



- **Avoid** global parametrization
  - Numerically very sensitive
  - Topological restrictions
- Surface-oriented remeshing
  - Perform **local** mesh updates
  - Use **projections** to keep vertices on the surface
  - **Fast**: e.g., Resampling of 100k triangles in less than 5s



# Local Remeshing Operators



# Isotropic Remeshing

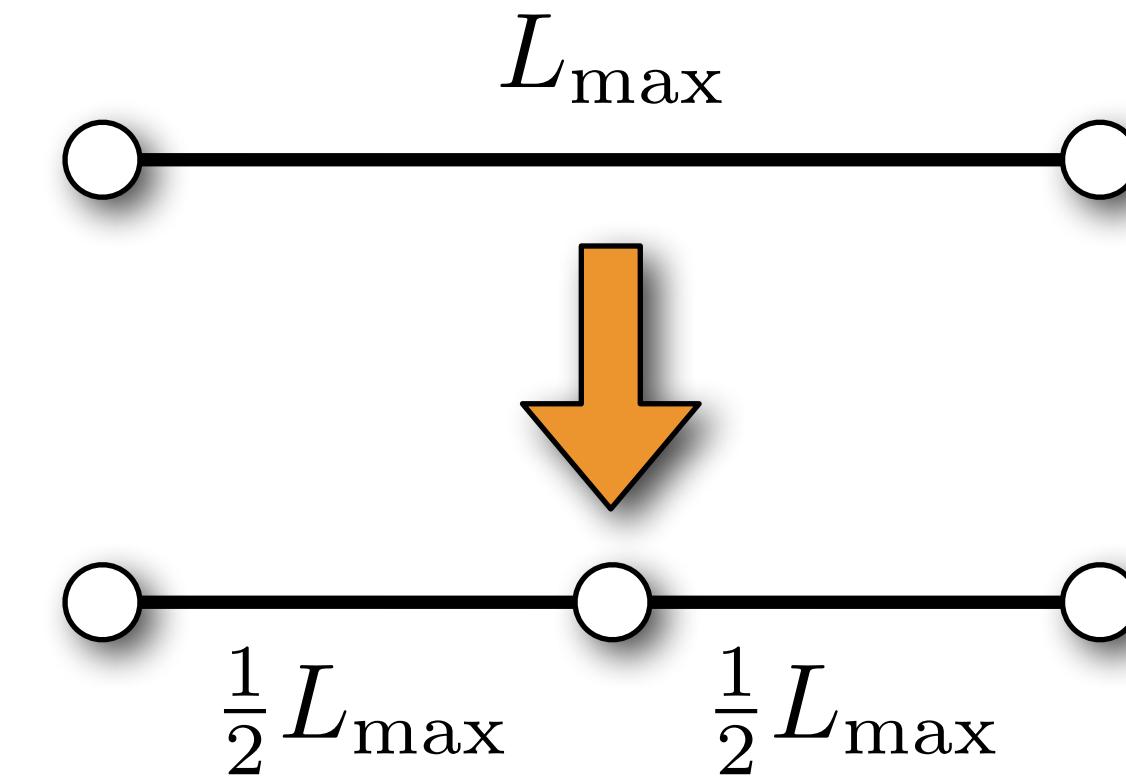


Specify target edge length  $L$

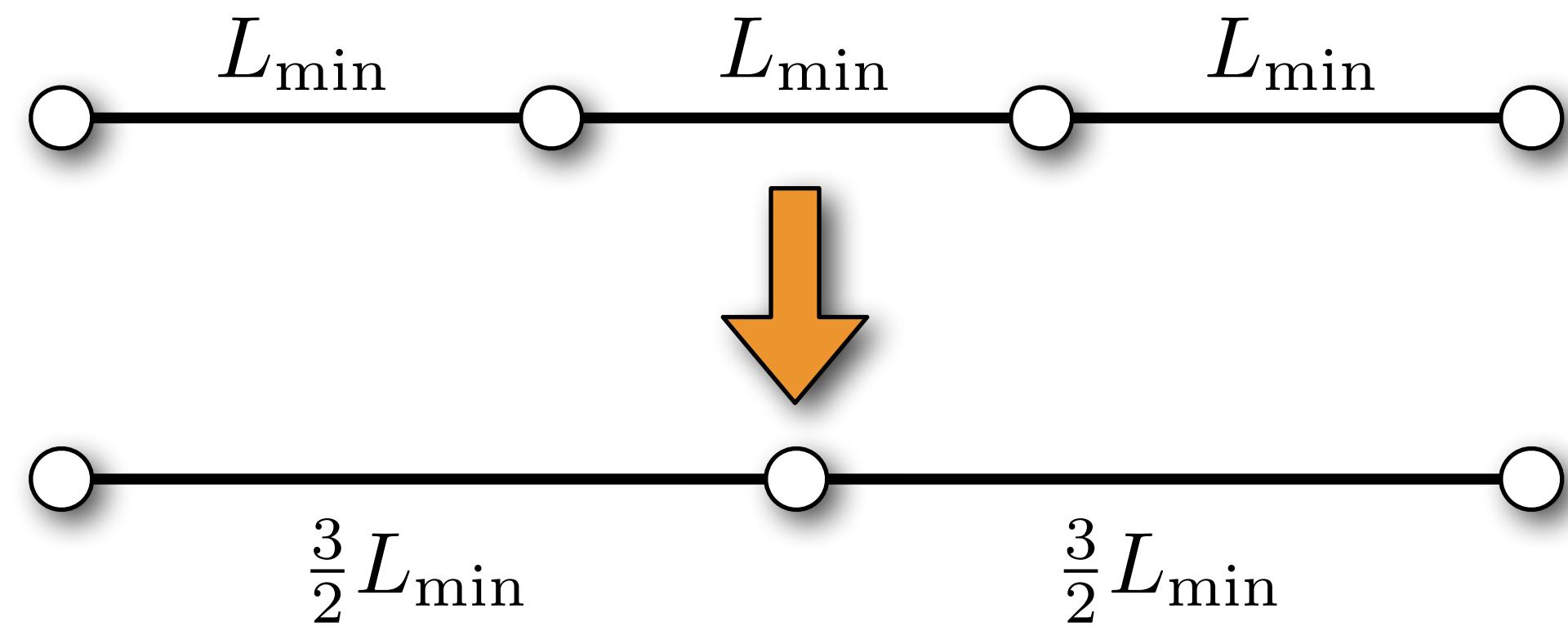
Iterate:

1. **Split** edges longer than  $L_{\max}$
2. **Collapse** edges shorter than  $L_{\min}$
3. **Flip** edges to get closer to valence 6
4. Vertex **shift** by tangential relaxation
5. **Project** vertices onto reference mesh

# Edge Split/Collapse



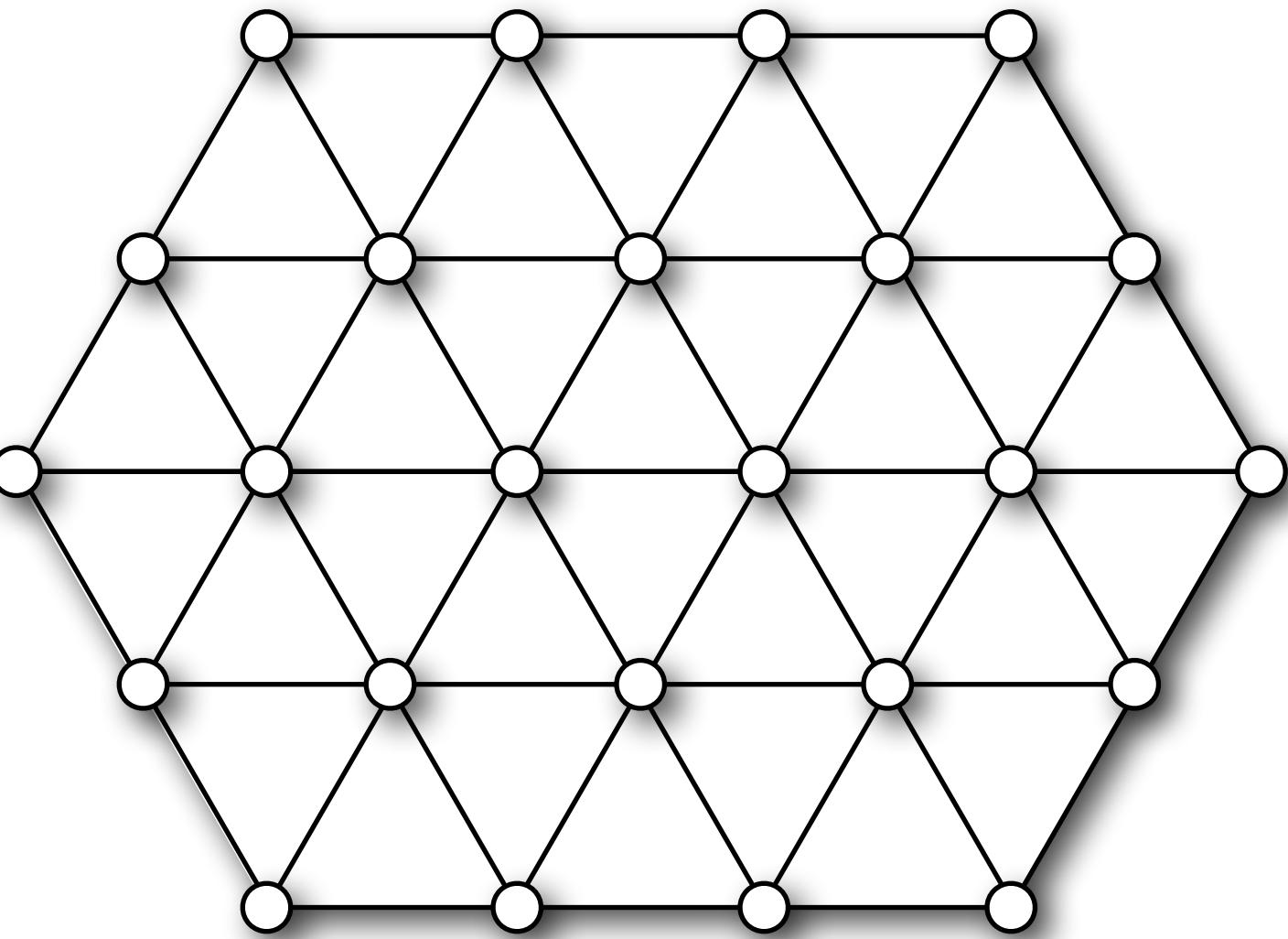
$$\begin{aligned}|L_{\max} - L| &= \left| \frac{1}{2}L_{\max} - L \right| \\ \Rightarrow L_{\max} &= \frac{4}{3}L\end{aligned}$$



$$\begin{aligned}|L_{\min} - L| &= \left| \frac{3}{2}L_{\min} - L \right| \\ \Rightarrow L_{\min} &= \frac{4}{5}L\end{aligned}$$

# Edge Flip

- Improve valences
  - Avg. valence is 6 (Euler)
  - Reduce variation
- Optimal valence is
  - 6 for interior vertices
  - 4 for boundary vertices

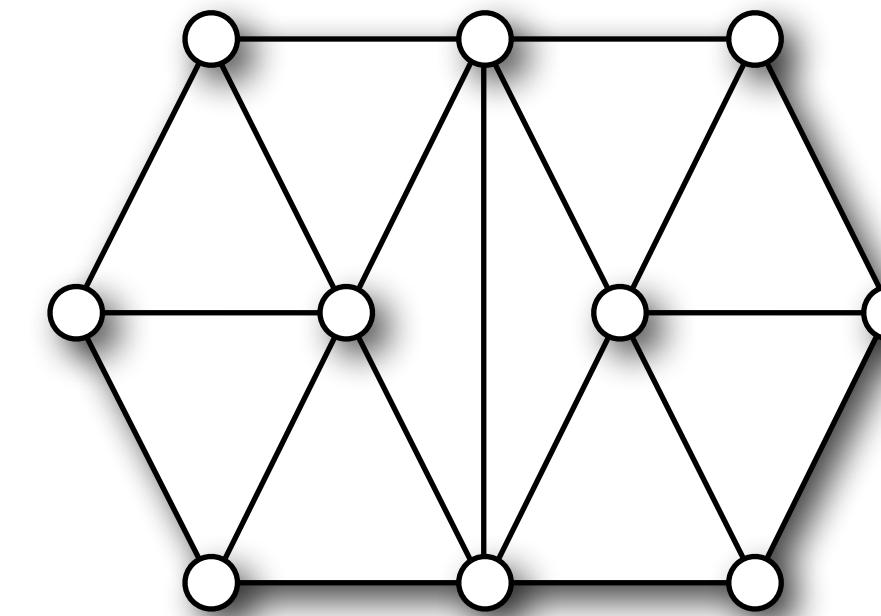




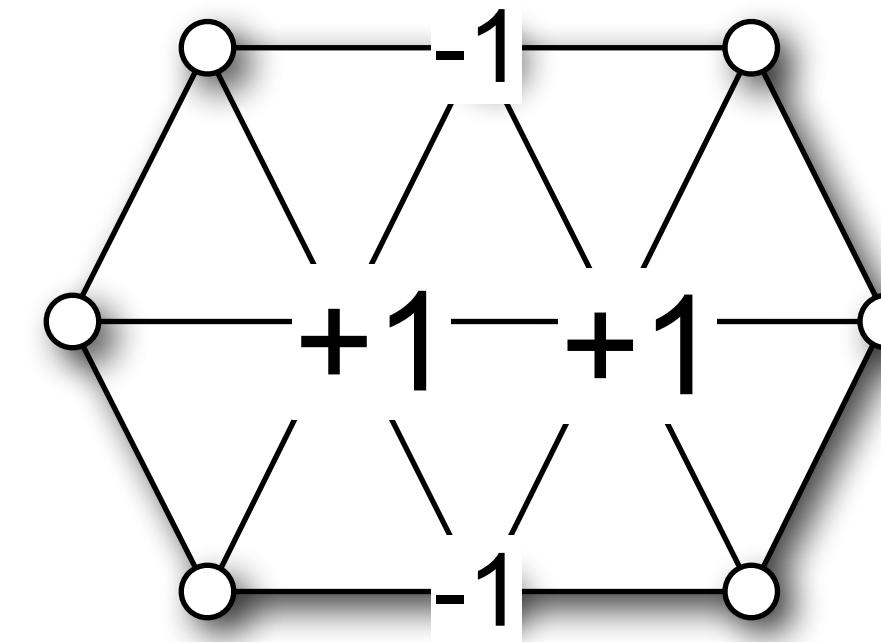
# Edge Flip

- Improve valences
  - Avg. valence is 6 (Euler)
  - Reduce variation
- Optimal valence is
  - 6 for interior vertices
  - 4 for boundary vertices
- Minimize valence excess

$$\sum_{i=1}^4 (\text{valence}(v_i) - \text{opt\_valence}(v_i))^2$$



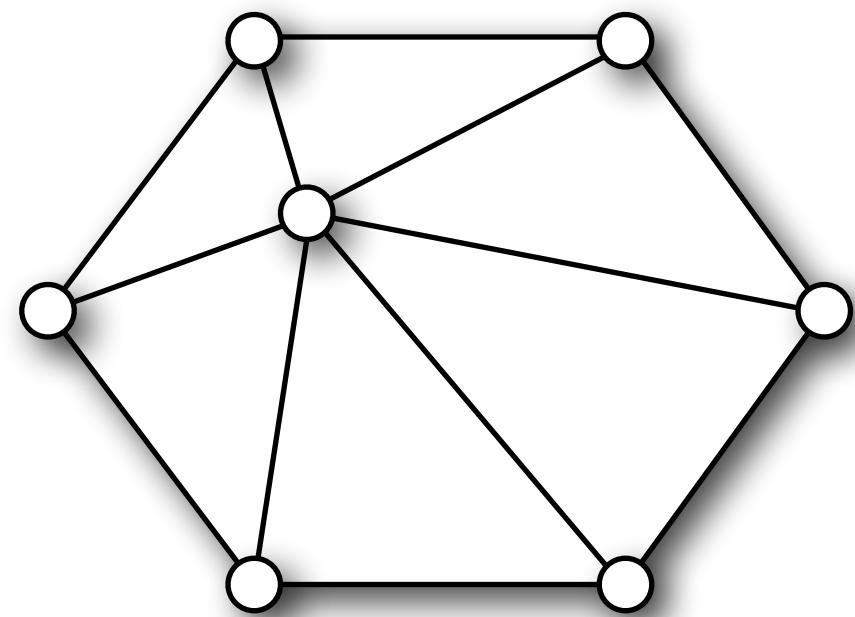
Edge  
Flip



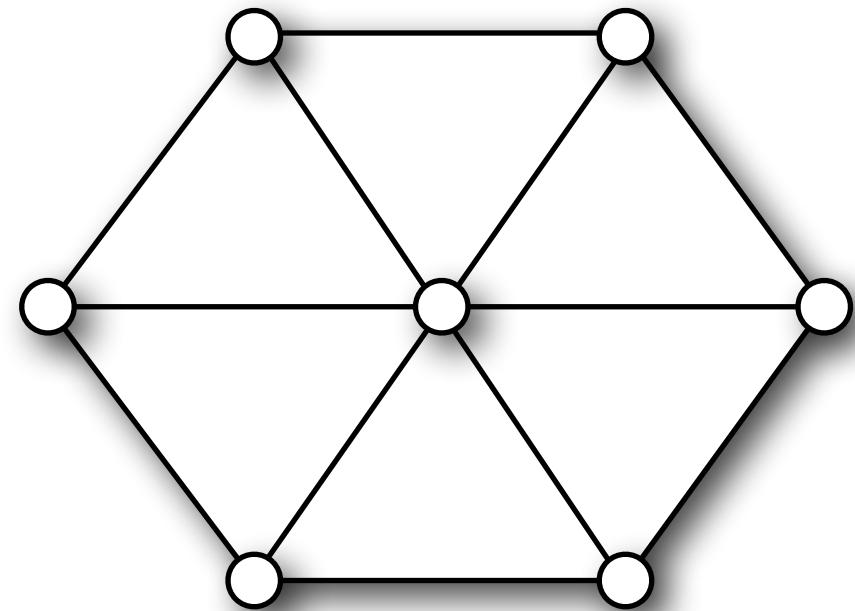
# Vertex Shift

- Local “spring” relaxation
  - Uniform Laplacian smoothing
  - Barycenter of one-ring neighbors

$$\mathbf{c}_i = \frac{1}{\text{valence}(v_i)} \sum_{j \in N(v_i)} \mathbf{p}_j$$



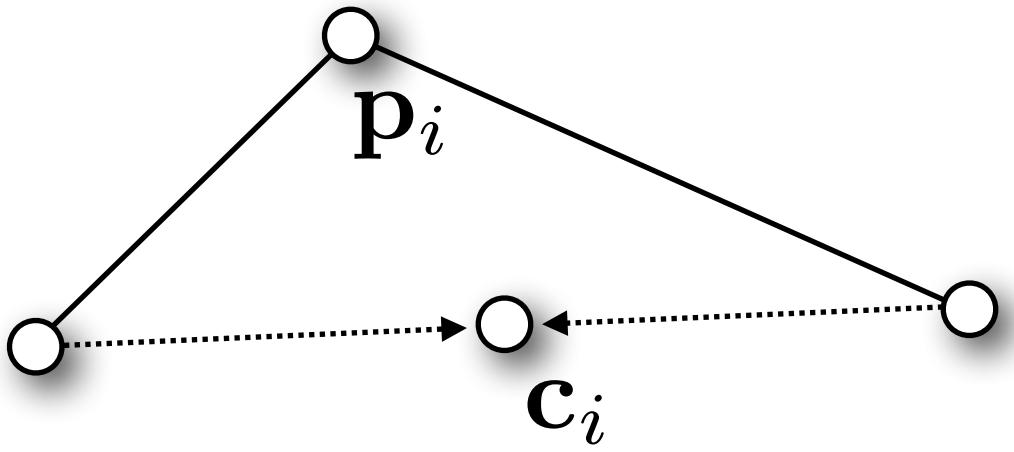
↓  
Vertex  
Shift



# Vertex Shift



- Local “spring” relaxation
  - Uniform Laplacian smoothing
  - Barycenter of one-ring neighbors



$$\mathbf{c}_i = \frac{1}{\text{valence}(v_i)} \sum_{j \in N(v_i)} \mathbf{p}_j$$

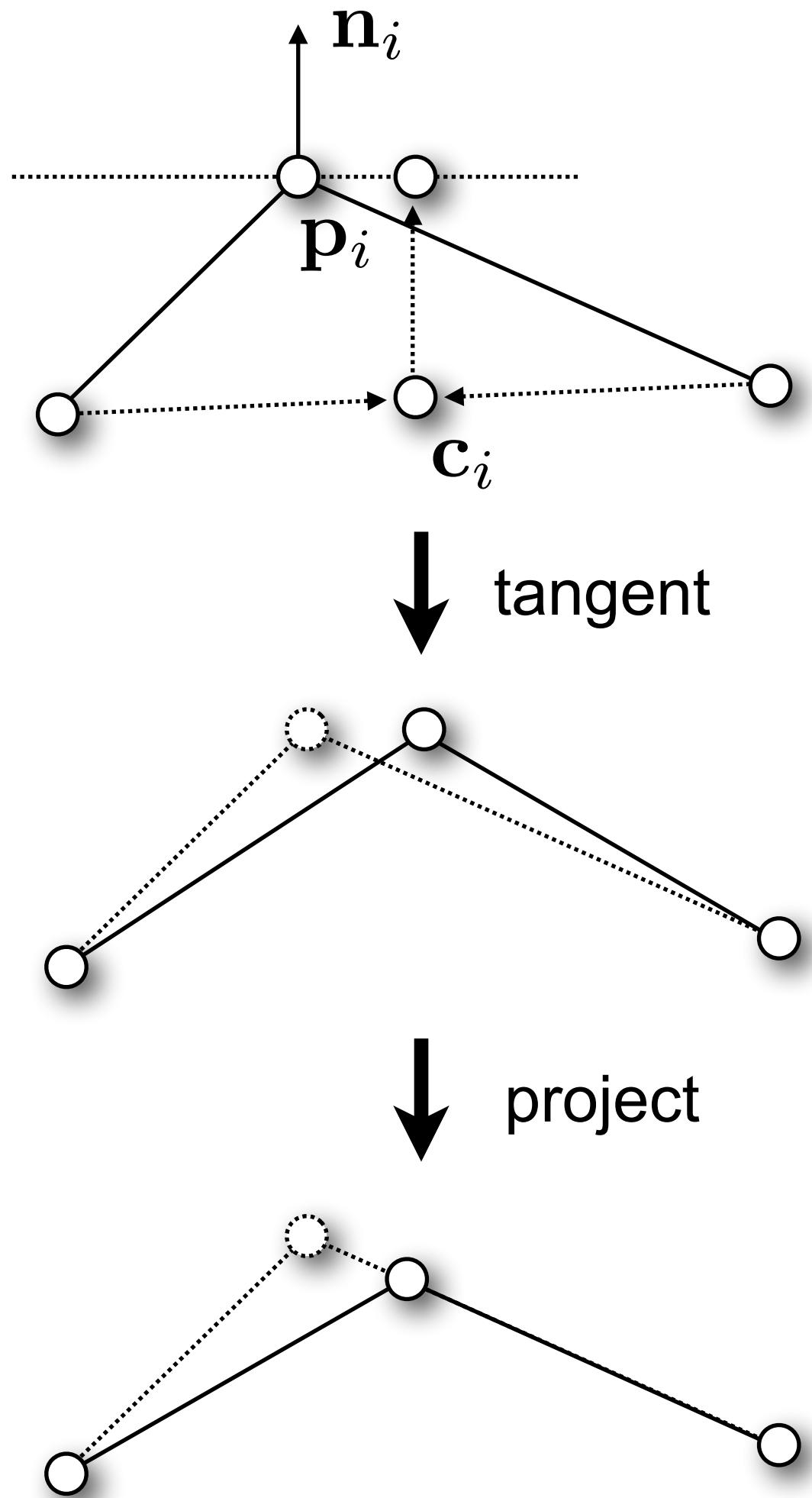
# Vertex Shift

- Local “spring” relaxation
  - Uniform Laplacian smoothing
  - Barycenter of one-ring neighbors

$$\mathbf{c}_i = \frac{1}{\text{valence}(v_i)} \sum_{j \in N(v_i)} \mathbf{p}_j$$

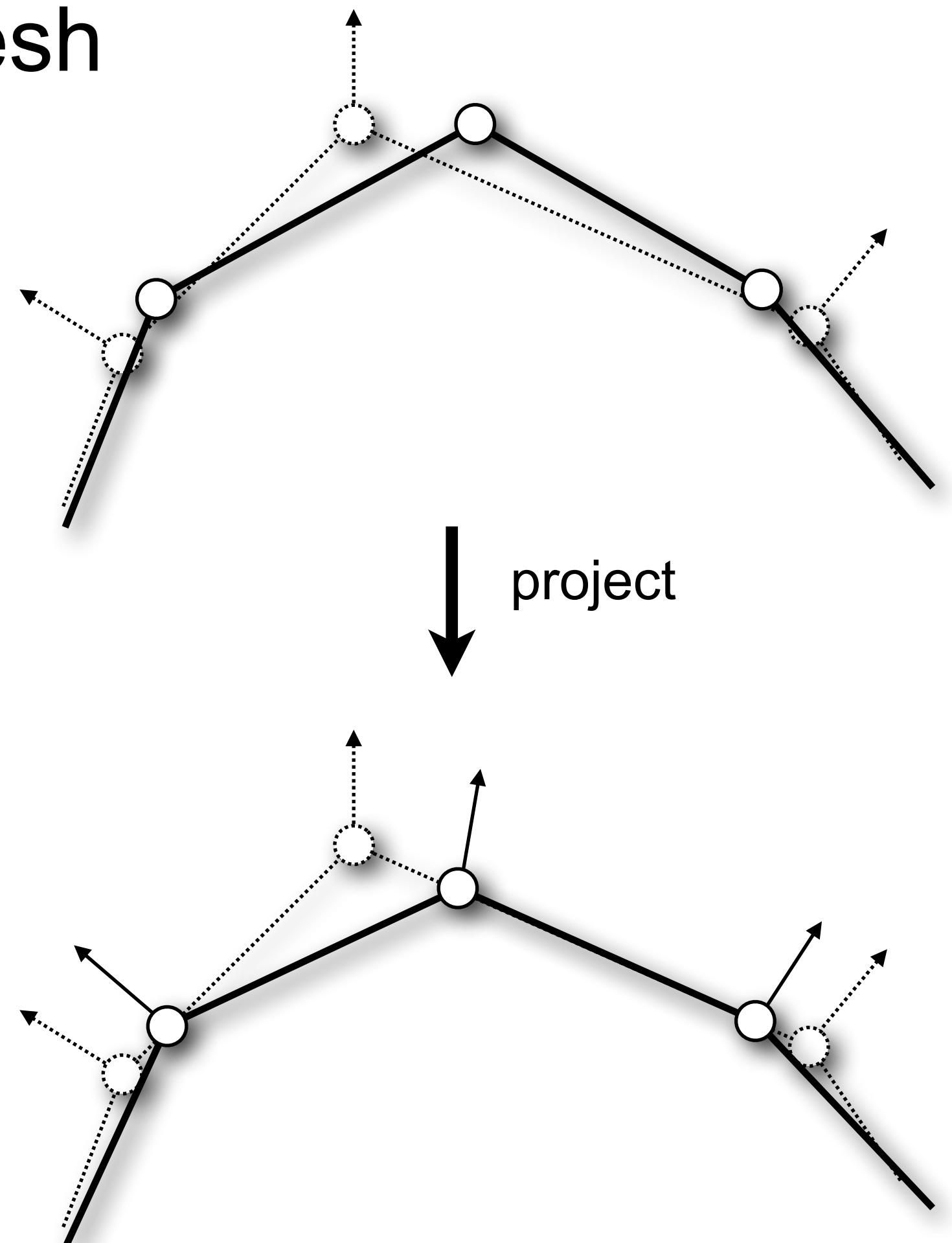
- Keep vertex (approx.) on surface
  - Restrict movement to tangent plane

$$\mathbf{p}_i \leftarrow \mathbf{p}_i + \lambda(\mathbf{I} - \mathbf{n}_i \mathbf{n}_i^T)(\mathbf{c}_i - \mathbf{p}_i)$$



# Vertex Projection

- Project vertices onto original reference mesh
  - Find closest triangle
  - Use BSP  $\rightarrow O(\log n)$
- Compute position & normal by barycentric interpolation



# Isotropic Remeshing

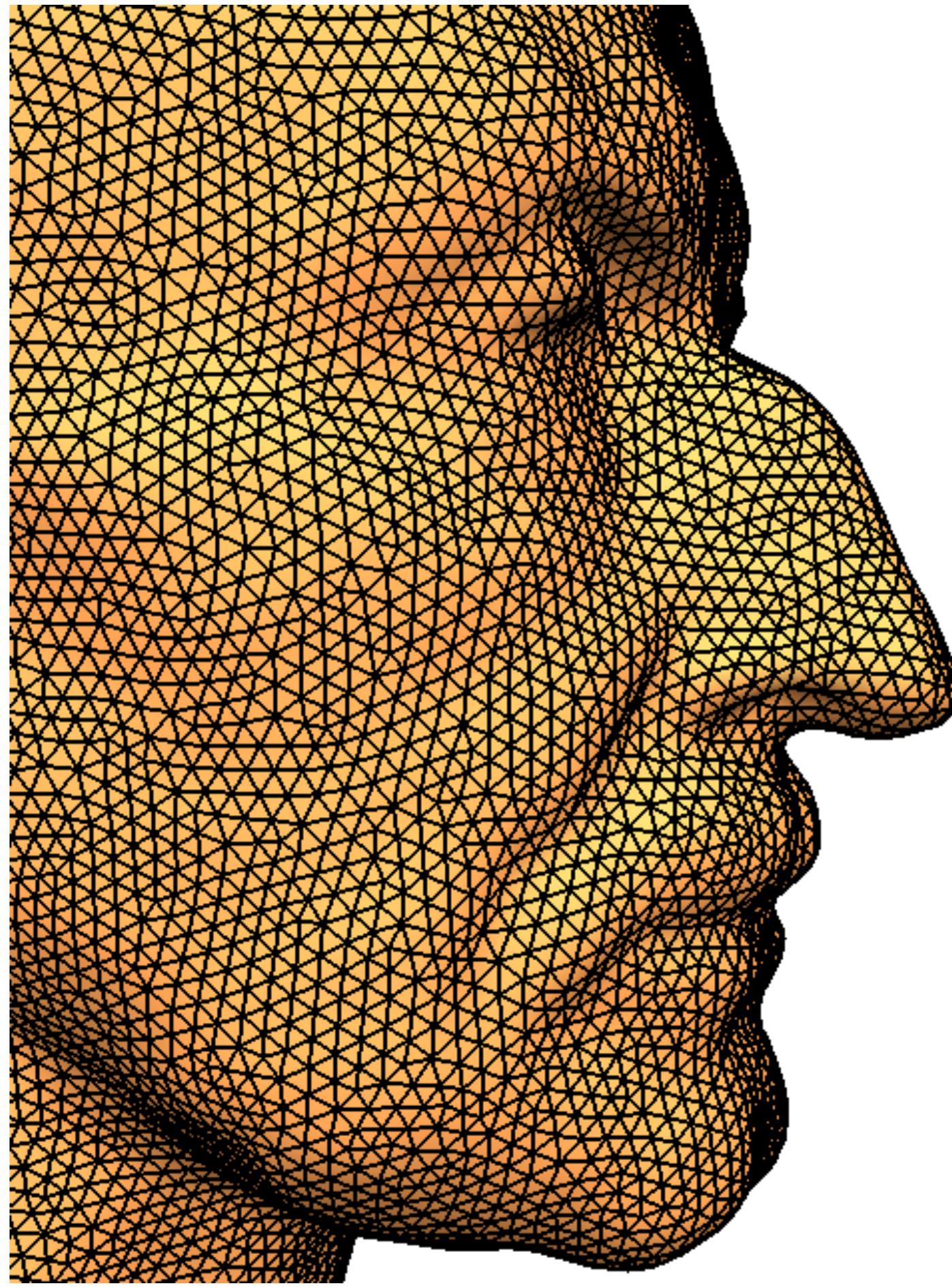
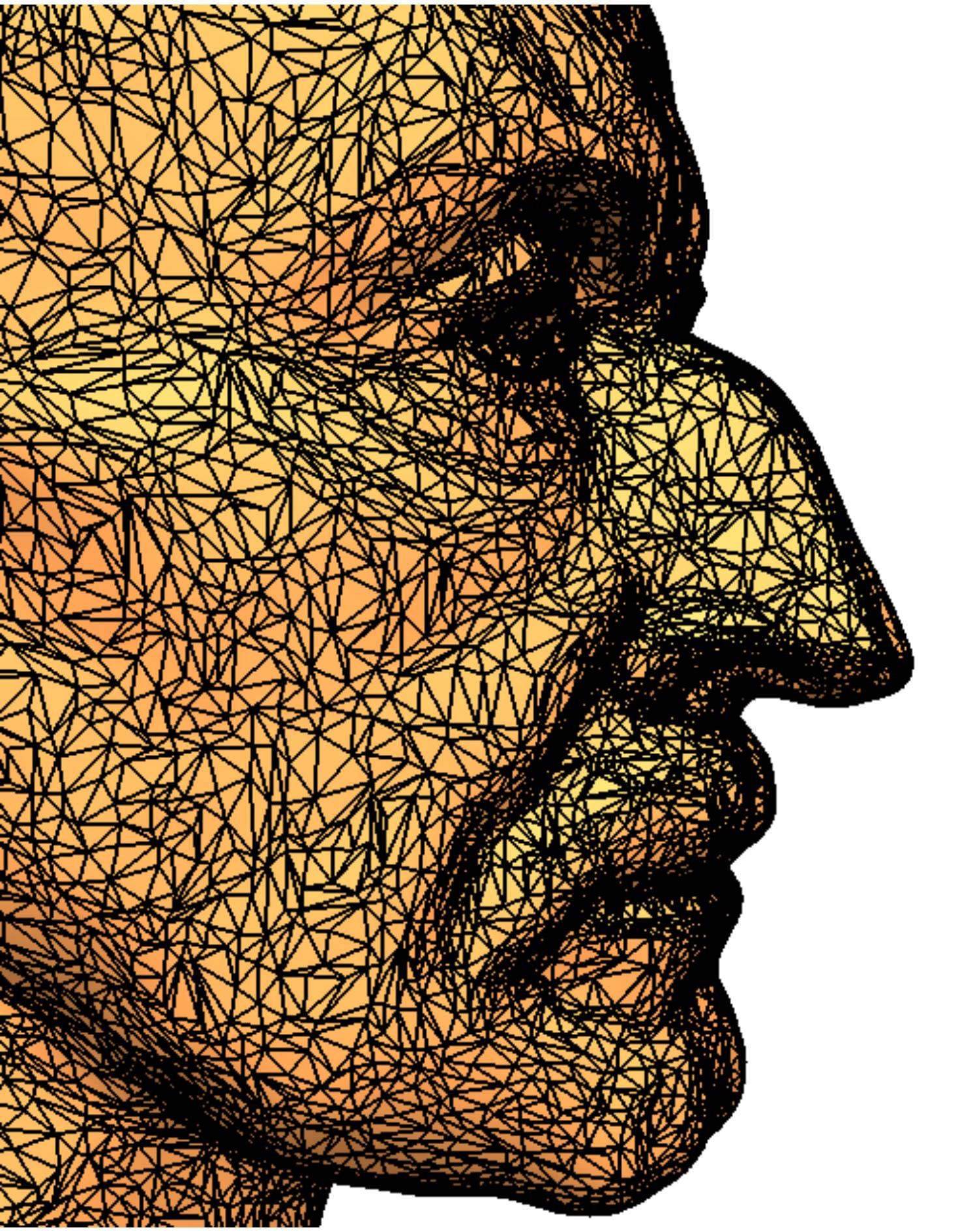


Specify target edge length  $L$

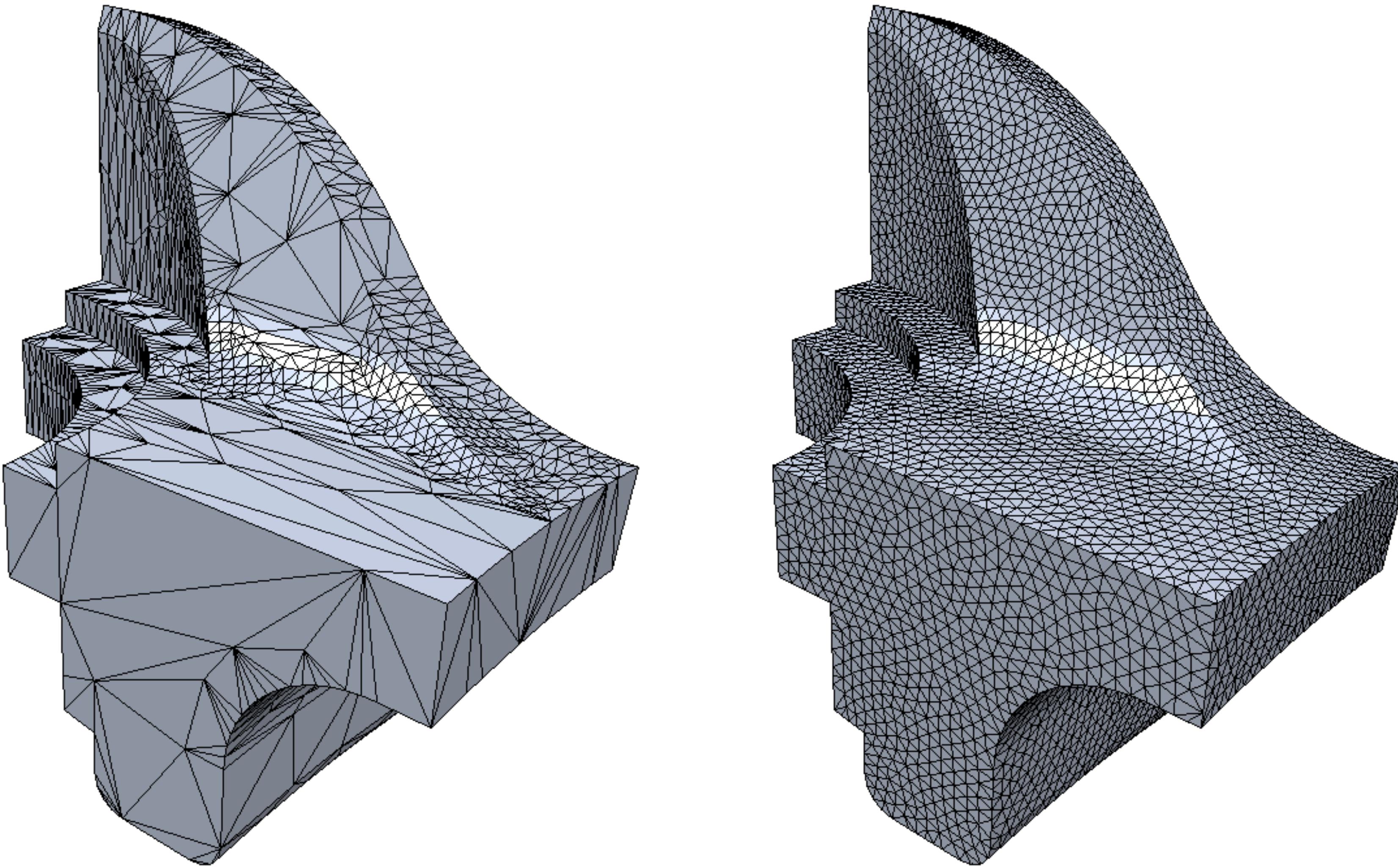
Iterate:

1. **Split** edges longer than  $L_{\max}$
2. **Collapse** edges shorter than  $L_{\min}$
3. **Flip** edges to get closer to valence 6
4. Vertex **shift** by tangential relaxation
5. **Project** vertices onto reference mesh

# Remeshing Results

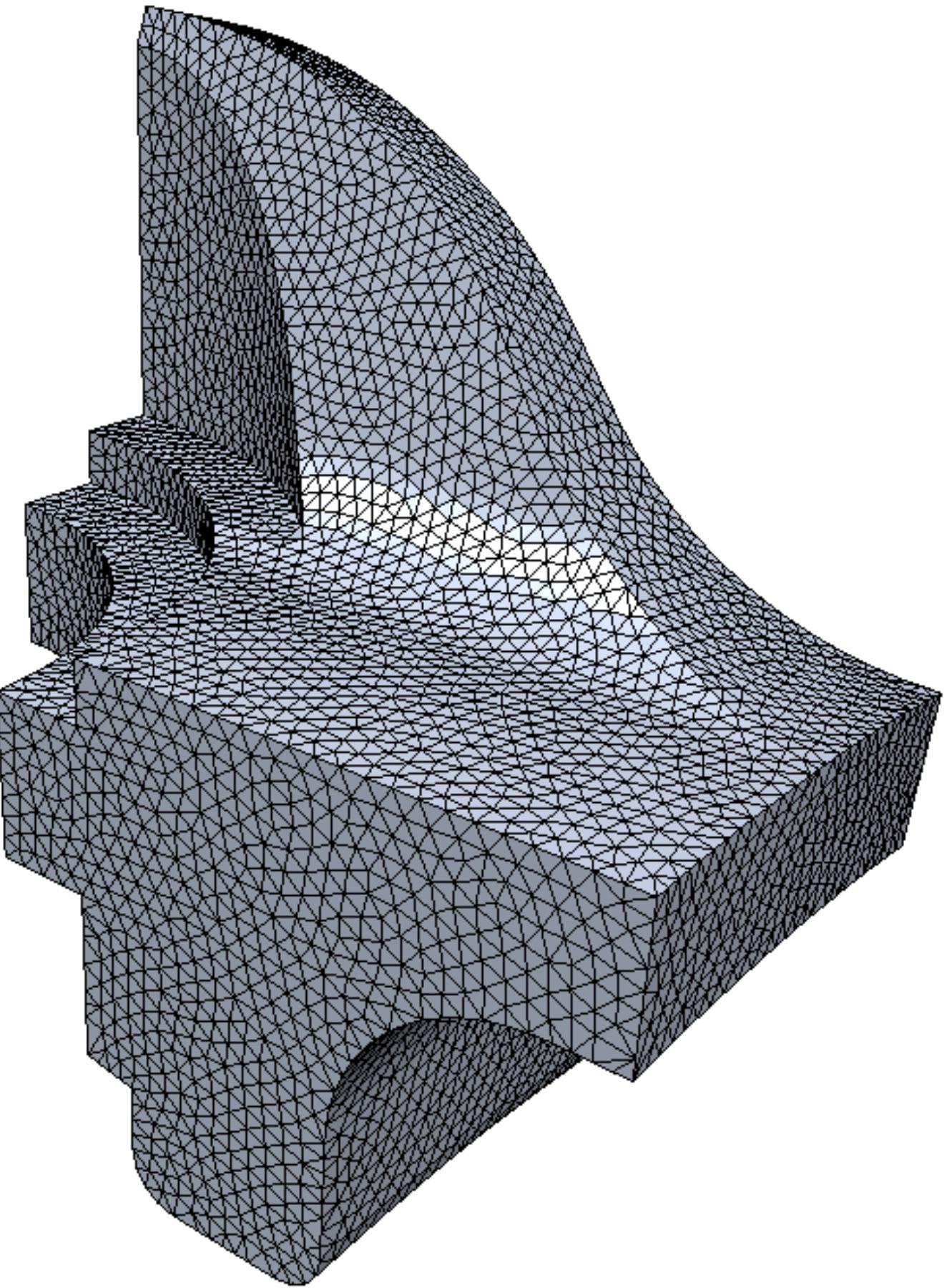


# Feature Preservation?



# Feature Preservation

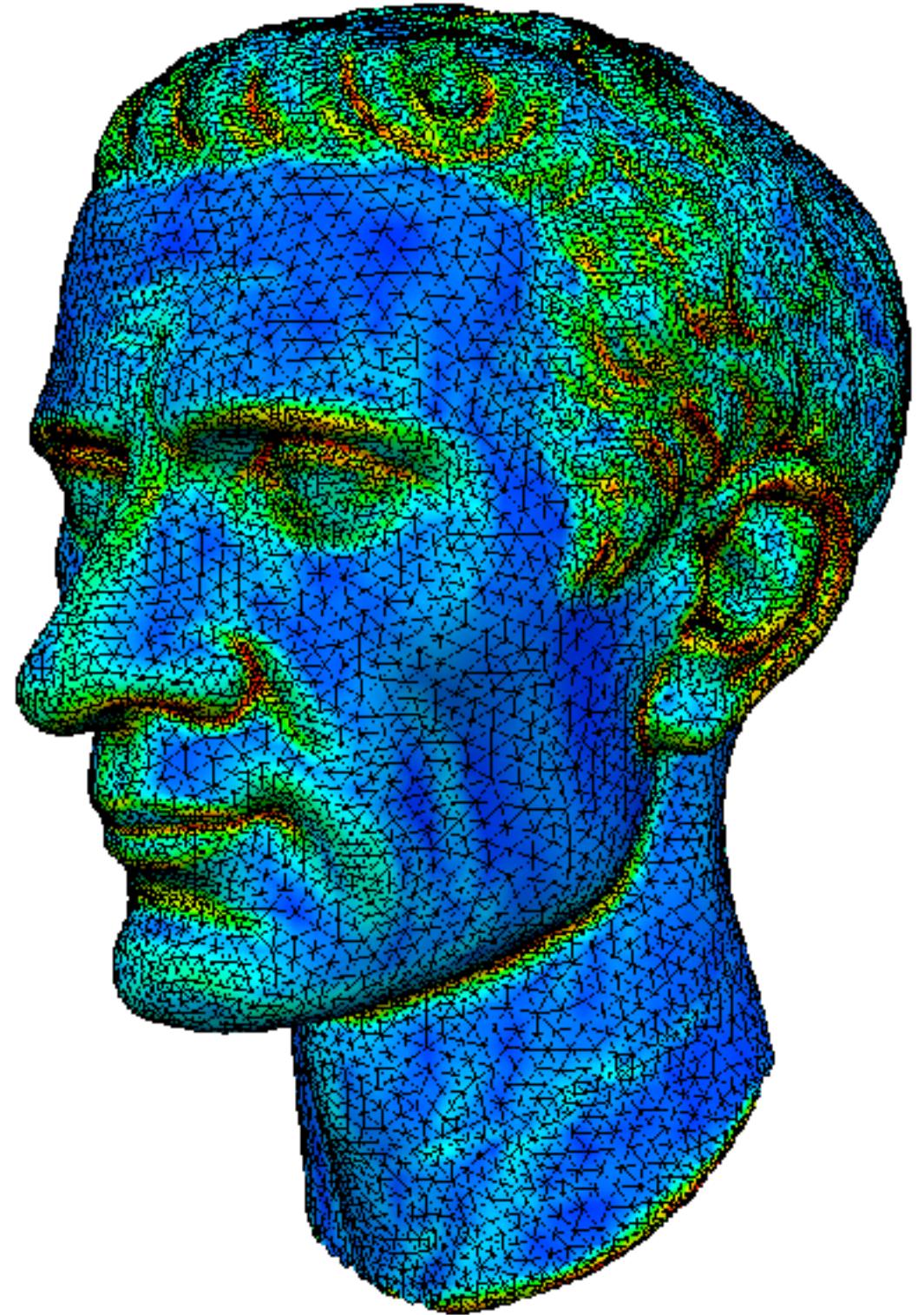
- Define feature edges / vertices
  - Large dihedral angles
  - Material boundaries
- Adjust local operators
  - Don't flip feature edges
  - Collapse only along features
  - Univariate smoothing
  - Project to feature curves
  - Don't touch feature vertices



# Adaptive Remeshing



- Compute maximum principle curvature on reference mesh
- Determine **local** target edge length from max-curvature
- Adjust split & collapse criteria accordingly



# Remeshing Approaches



- Parametrization based
  - Map complex 3D problem to simpler 2D problem
  - Parameterization is the difficult part
  - Computationally more involved
- Surface oriented
  - Local mesh operators on 3D surface
  - Project vertices onto reference surface
  - Projection works best on dense meshes

# Remeshing Components



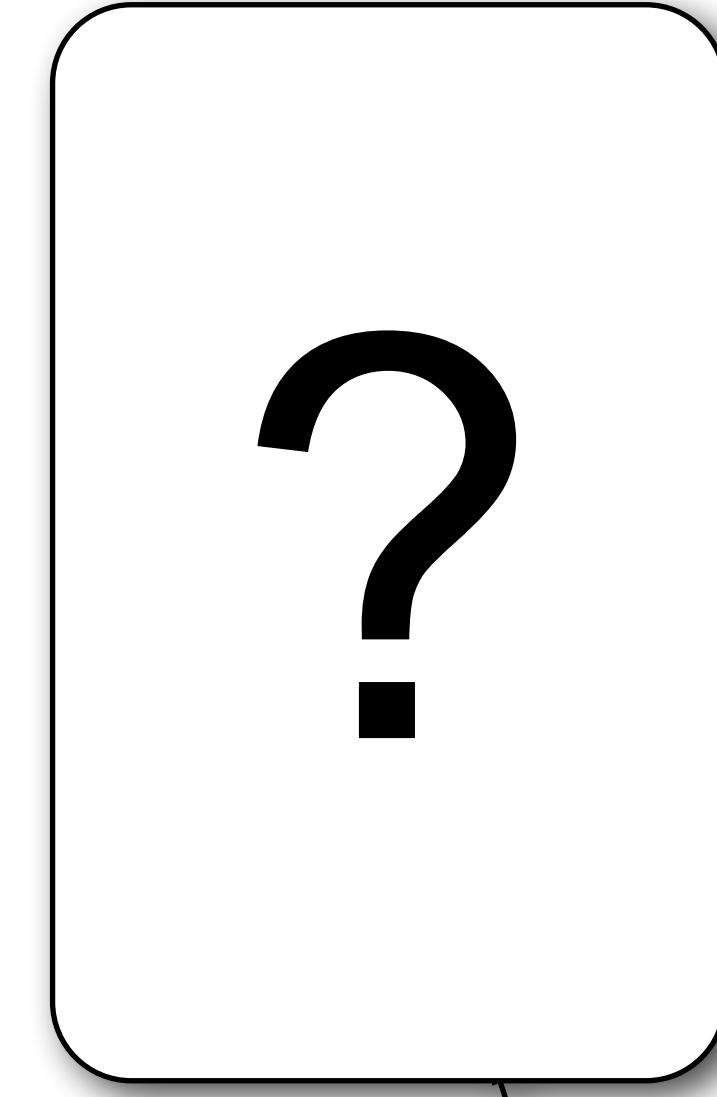
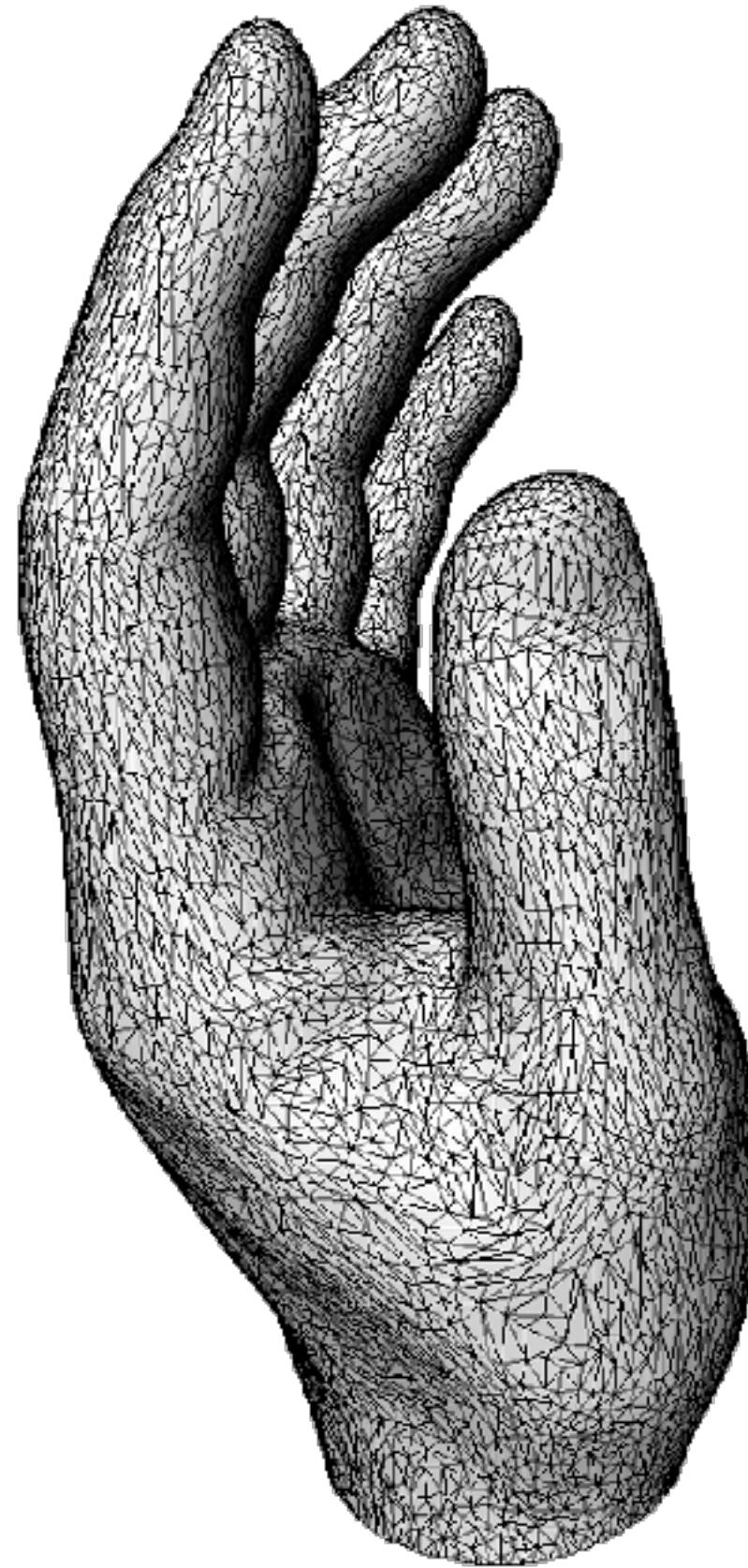
- **Correspondence**
  - Global / local parameterization vs. projections
- **Vertex density** control
  - Uniform vs. adaptive
- **Local alignment**
  - Optimal shape approximation ( $\rightarrow$  quad meshing)
- **Global alignment**
  - Preservation of sharp features

# Overview



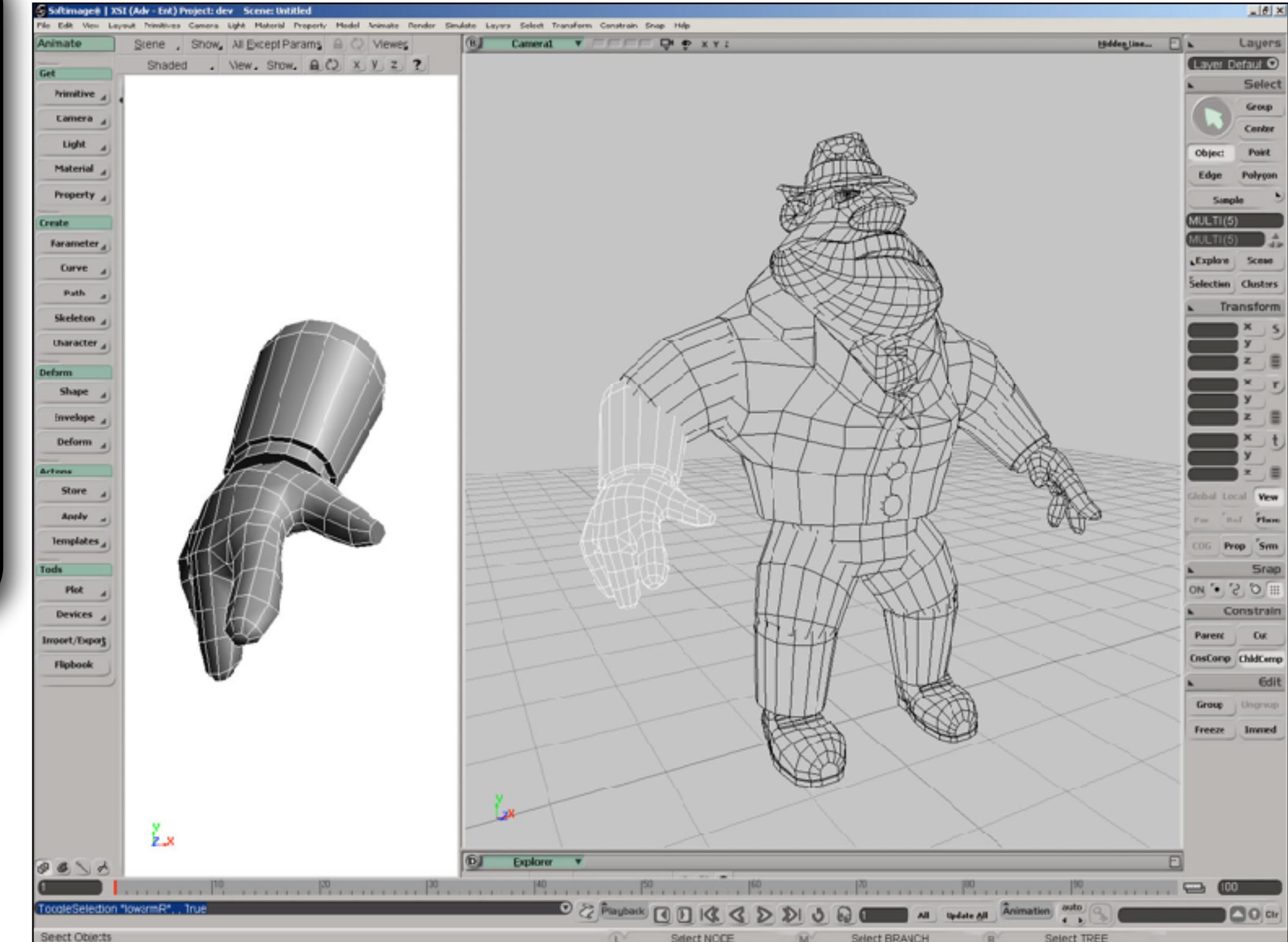
- Isotropic Remeshing
  - Parameterization-based [Alliez 2002]
  - Surface-based [Botsch 2004]
- **Anisotropic Remeshing**
  - Parameterization-based [Alliez 2003]
  - Surface-based [Marinov 2004]

# Anisotropic Remeshing



remeshing

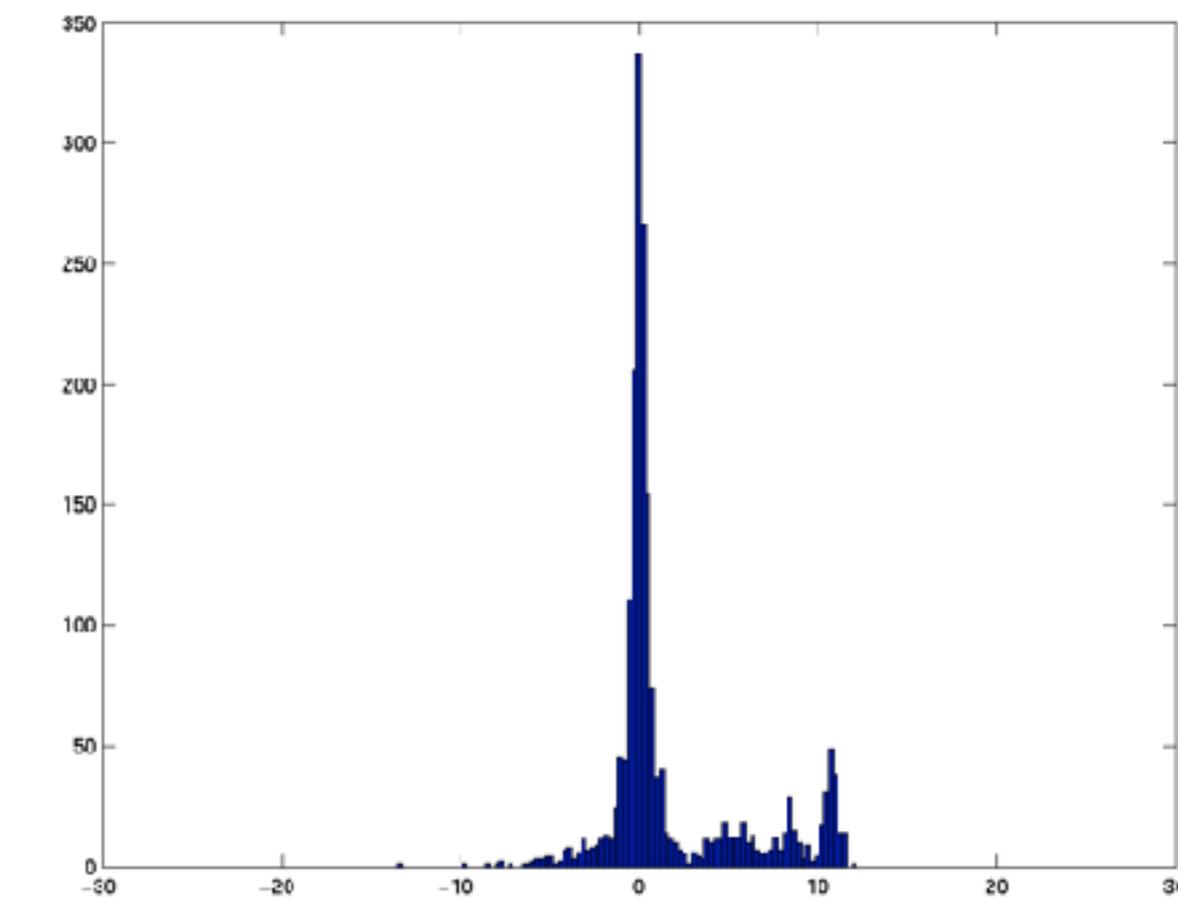
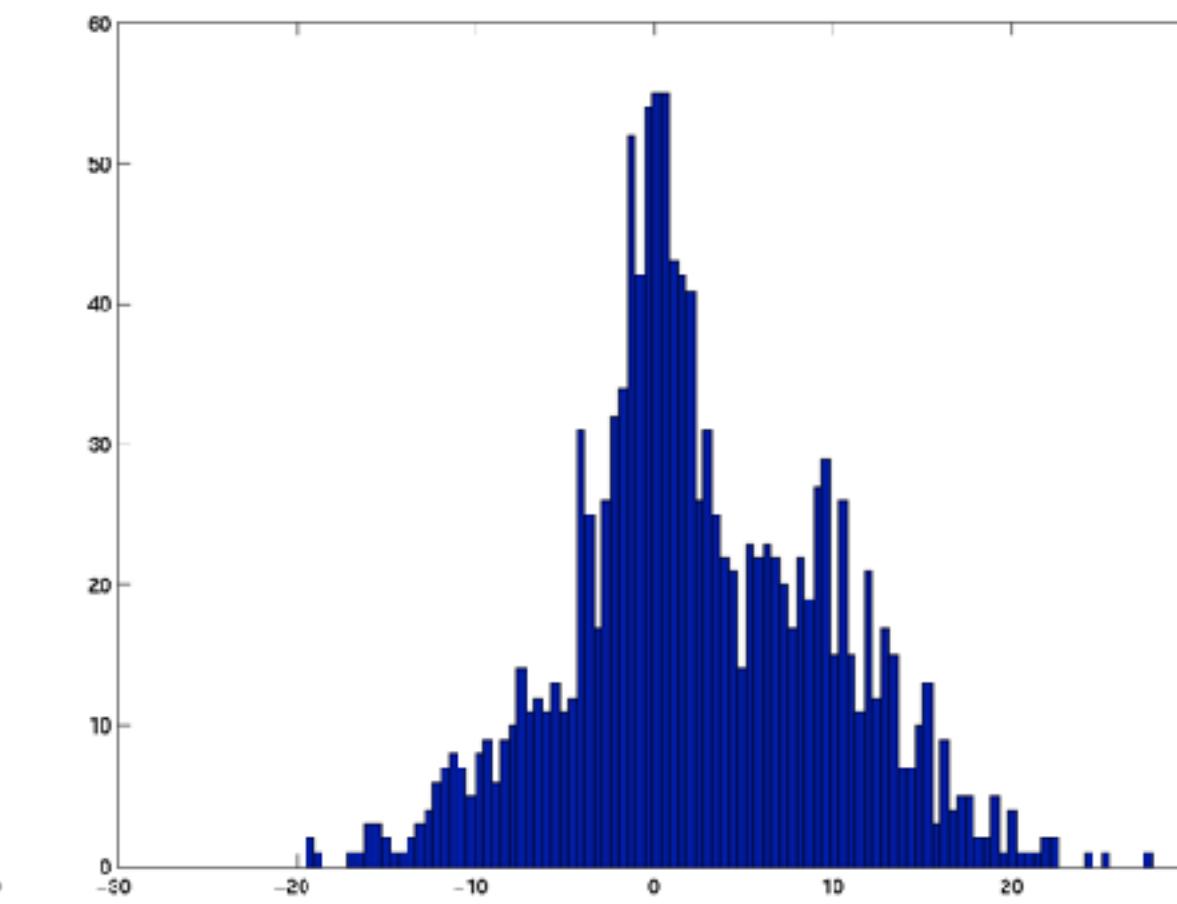
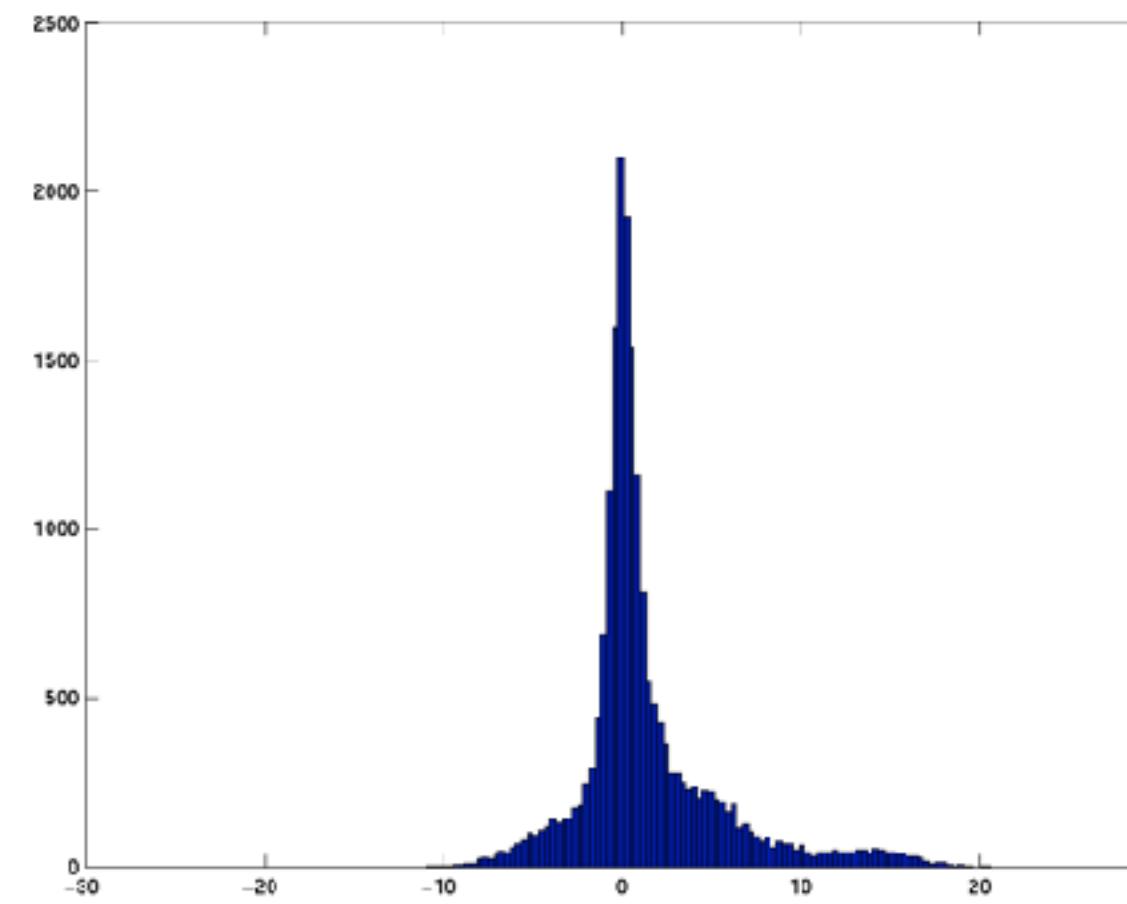
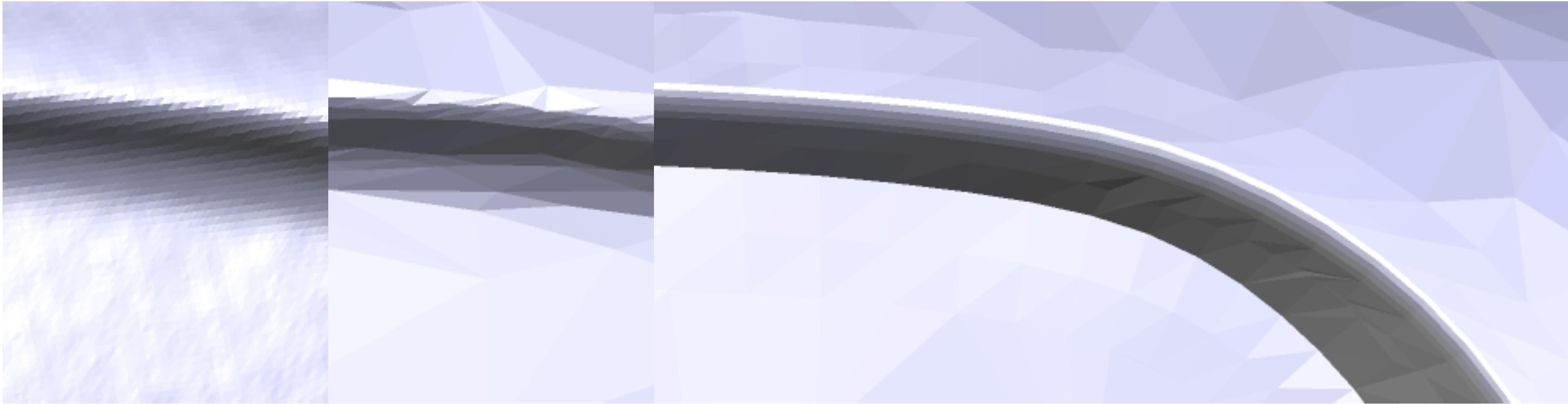
scanned  
surface  
geometry



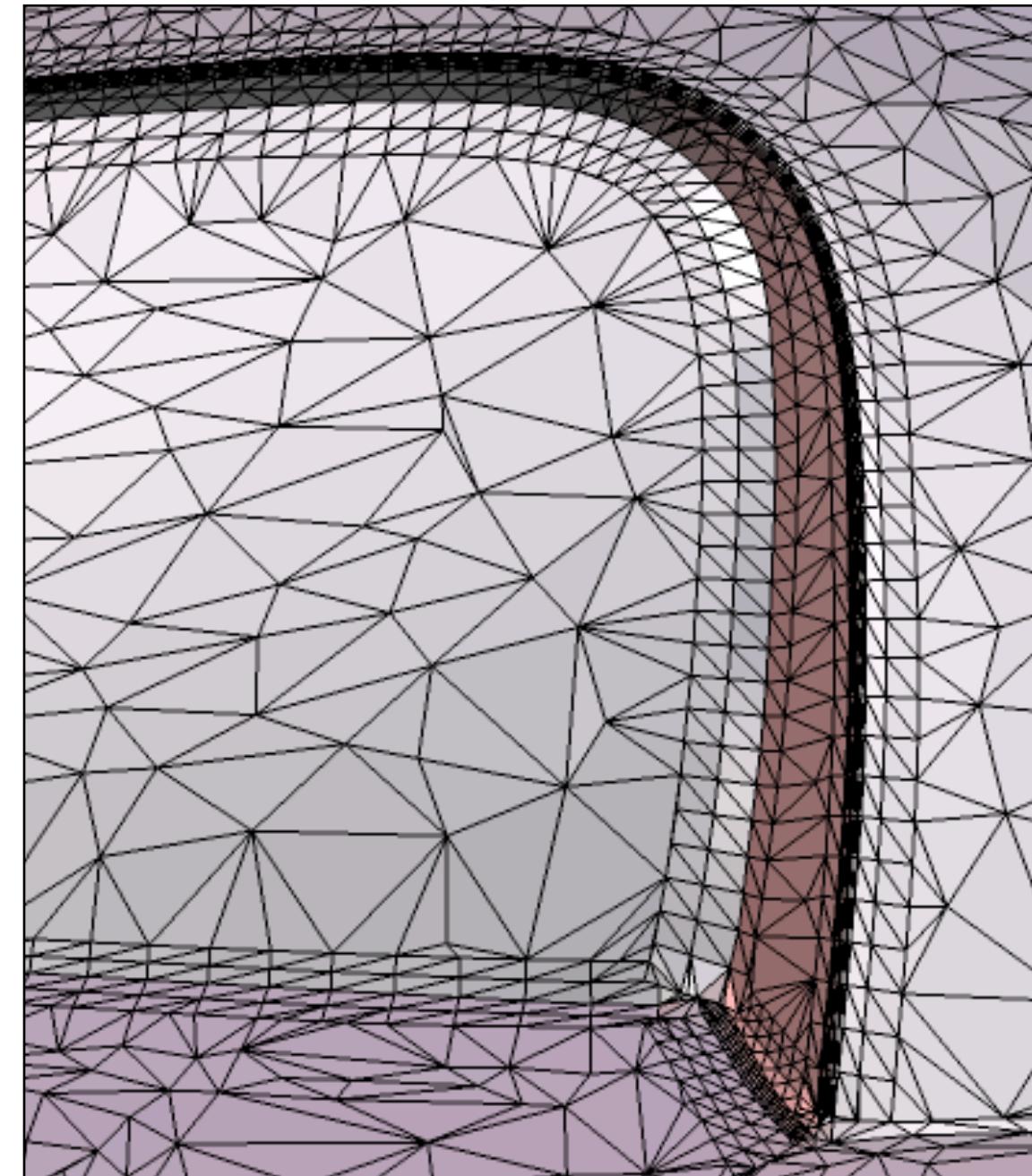
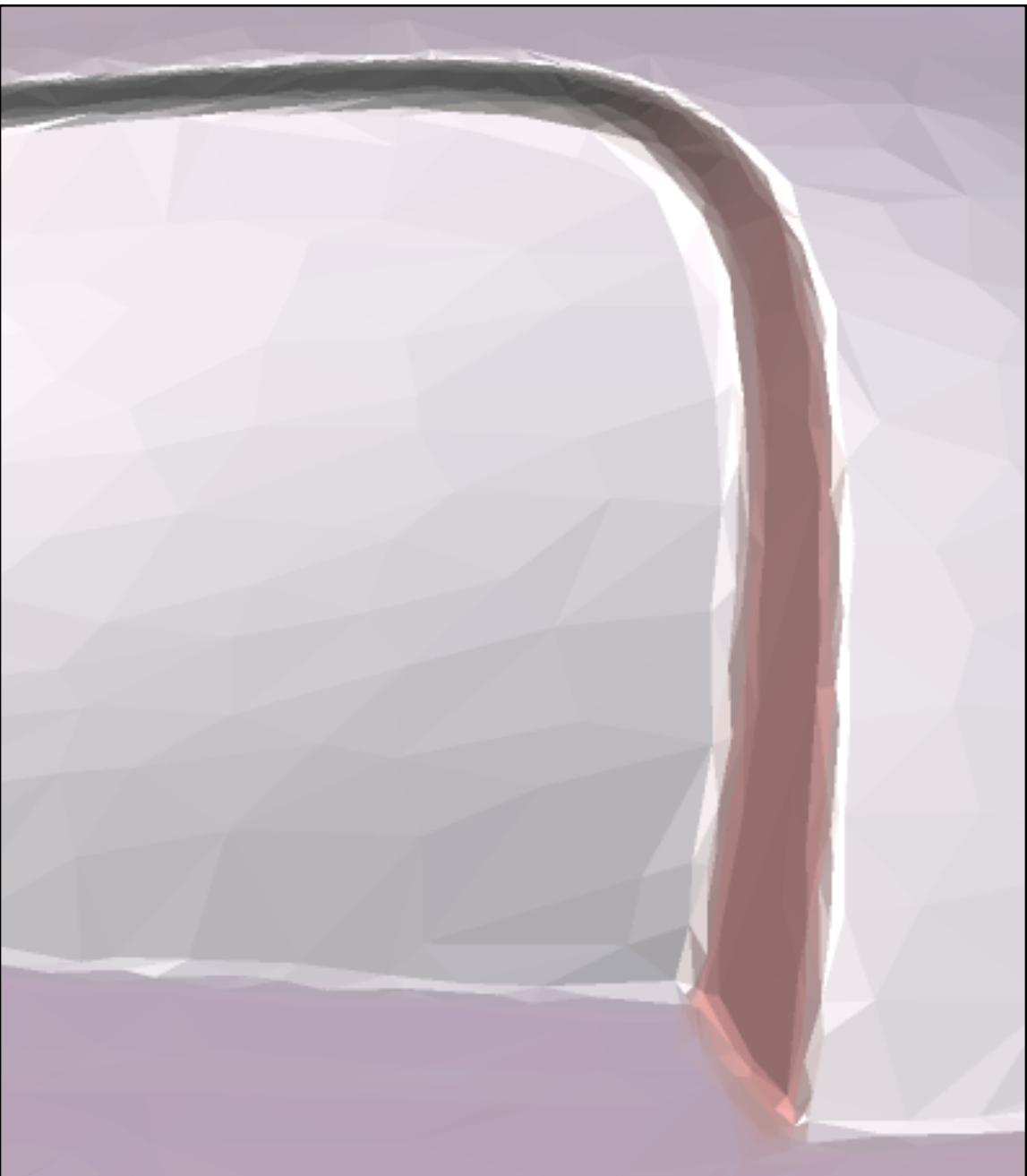
carefully designed model

[www.viewpoint.com](http://www.viewpoint.com)

# Normal Noise



# Anisotropic Remeshing



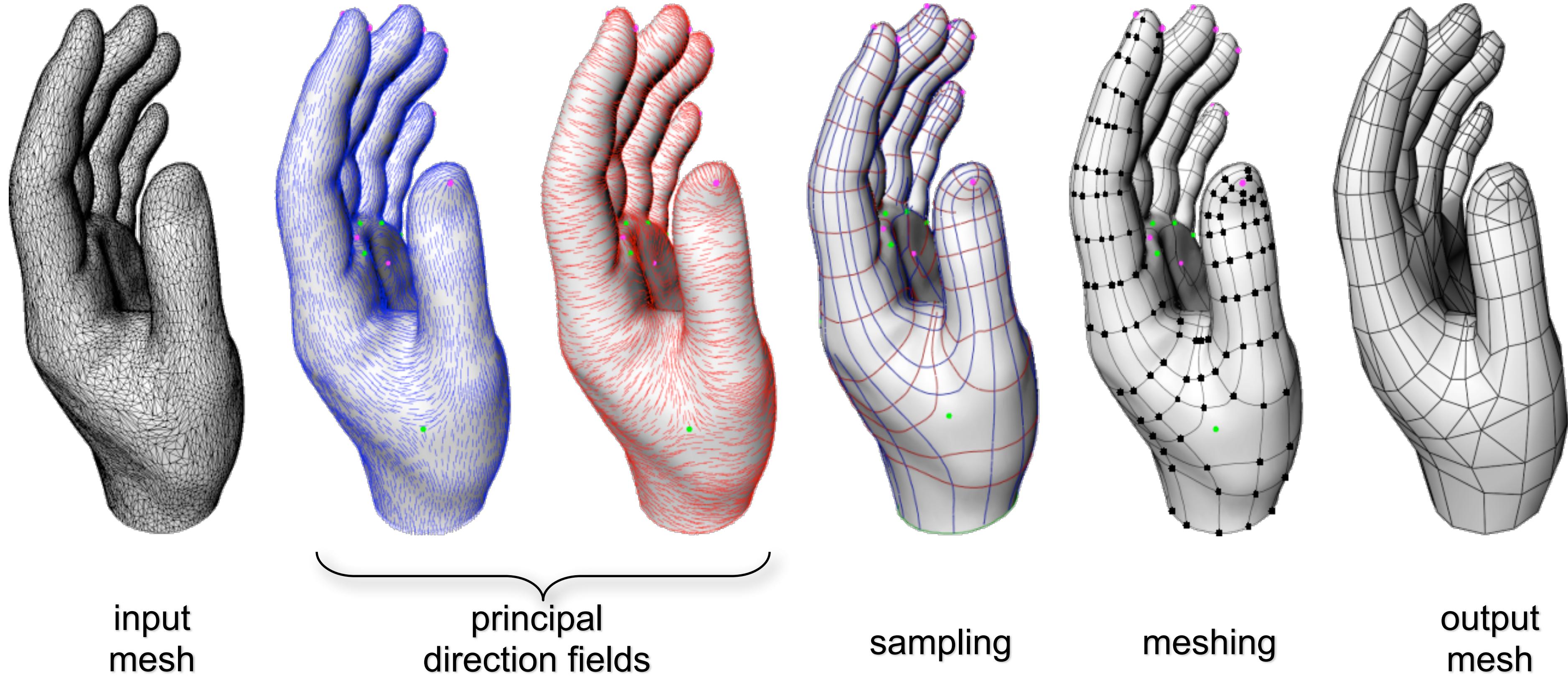


# Overview



- Isotropic Remeshing
  - Parameterization-based [Alliez 2002]
  - Surface-based [Botsch 2004]
- Anisotropic Remeshing
  - **Parameterization-based** [Alliez 2003]
  - Surface-based [Marinov 2004]

# Anisotropic Remeshing



input  
mesh

principal  
direction fields

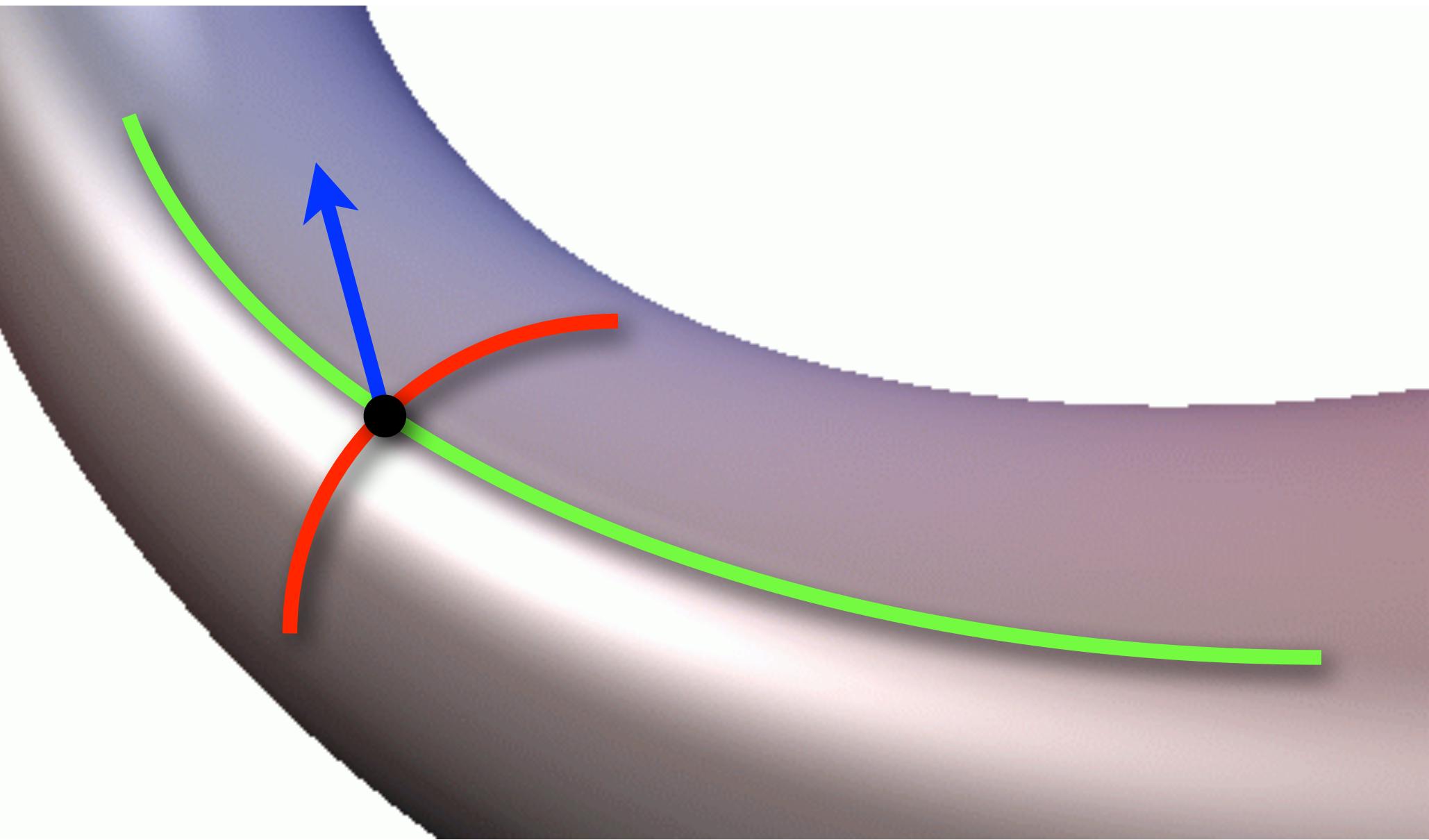
sampling

meshing

output  
mesh

# Anisotropy

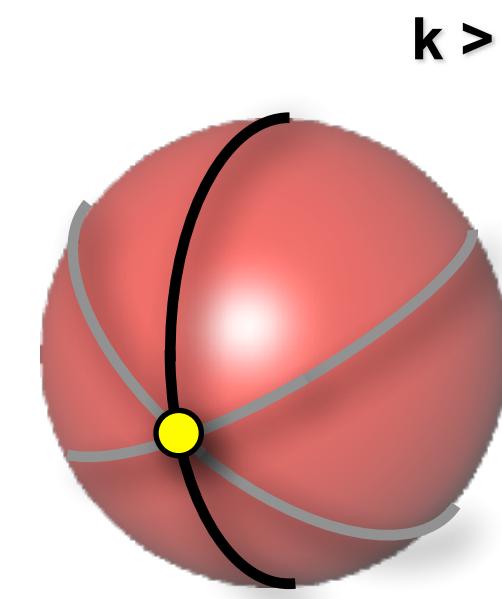
- Differential geometry
  - 2nd fundamental form defines a local **orthogonal** frame (min- / max-curvature directions and the normal)



# 3D Curvature Tensor

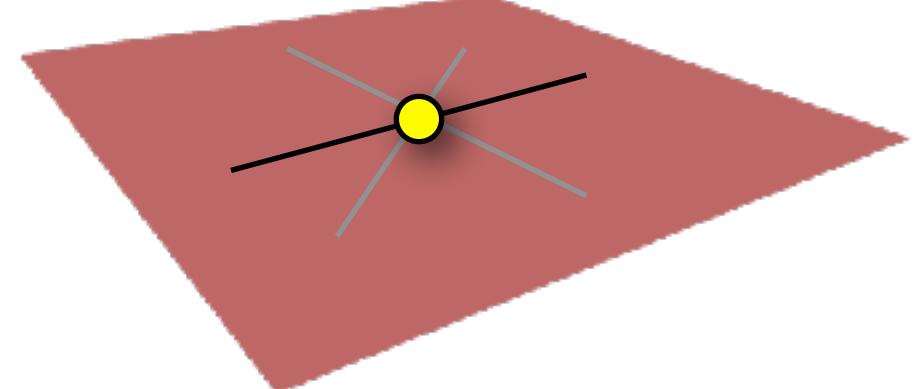


**Isotropic**



spherical

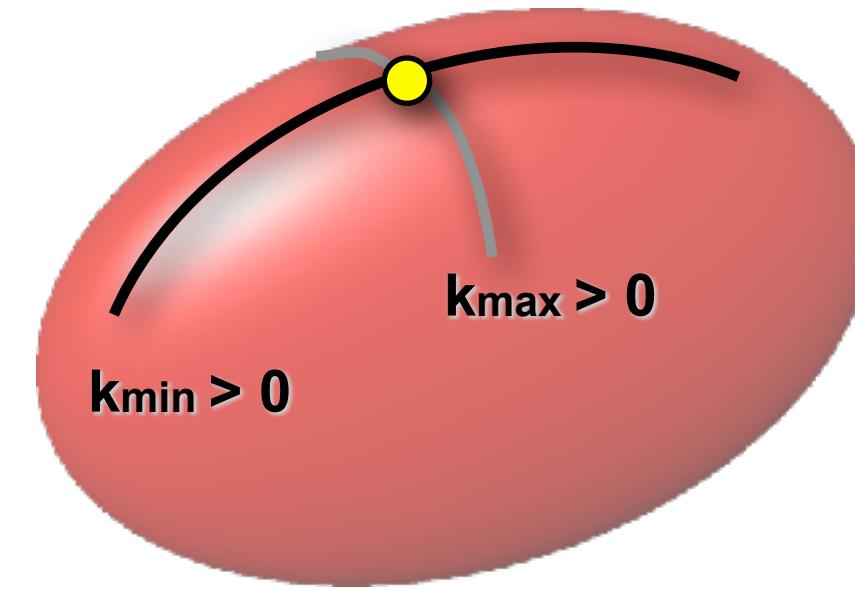
$k = 0$



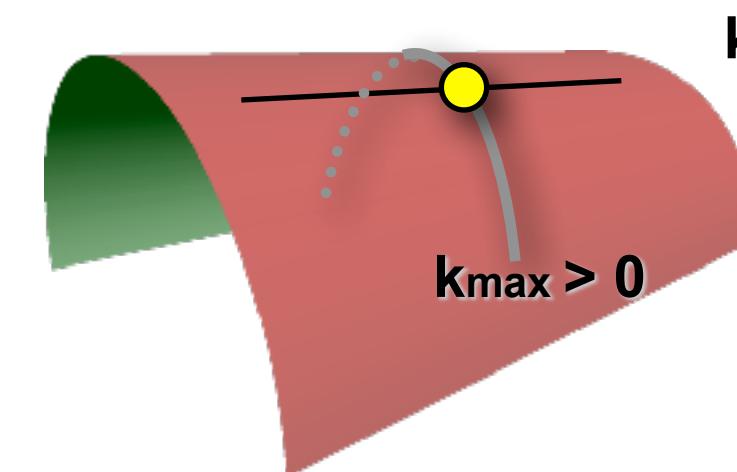
planar

**Anisotropic**

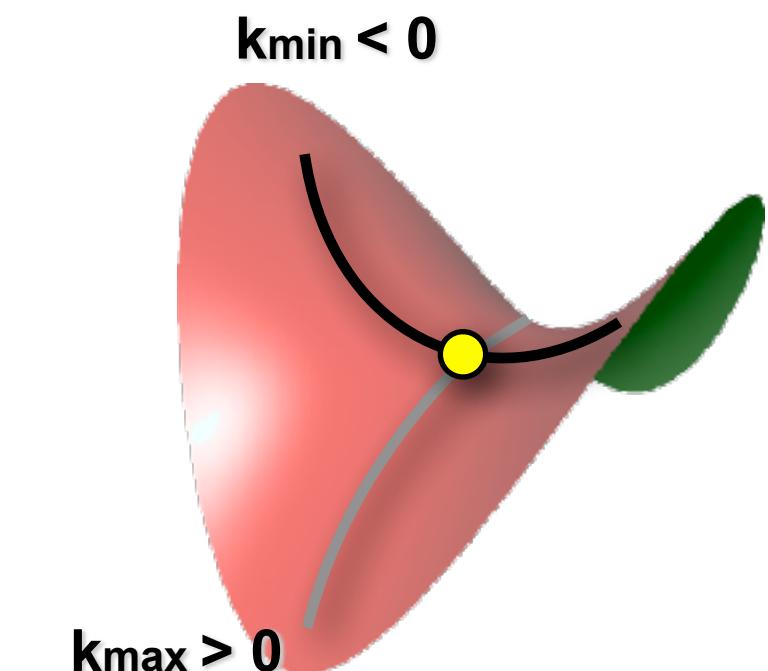
2 principal directions



elliptic

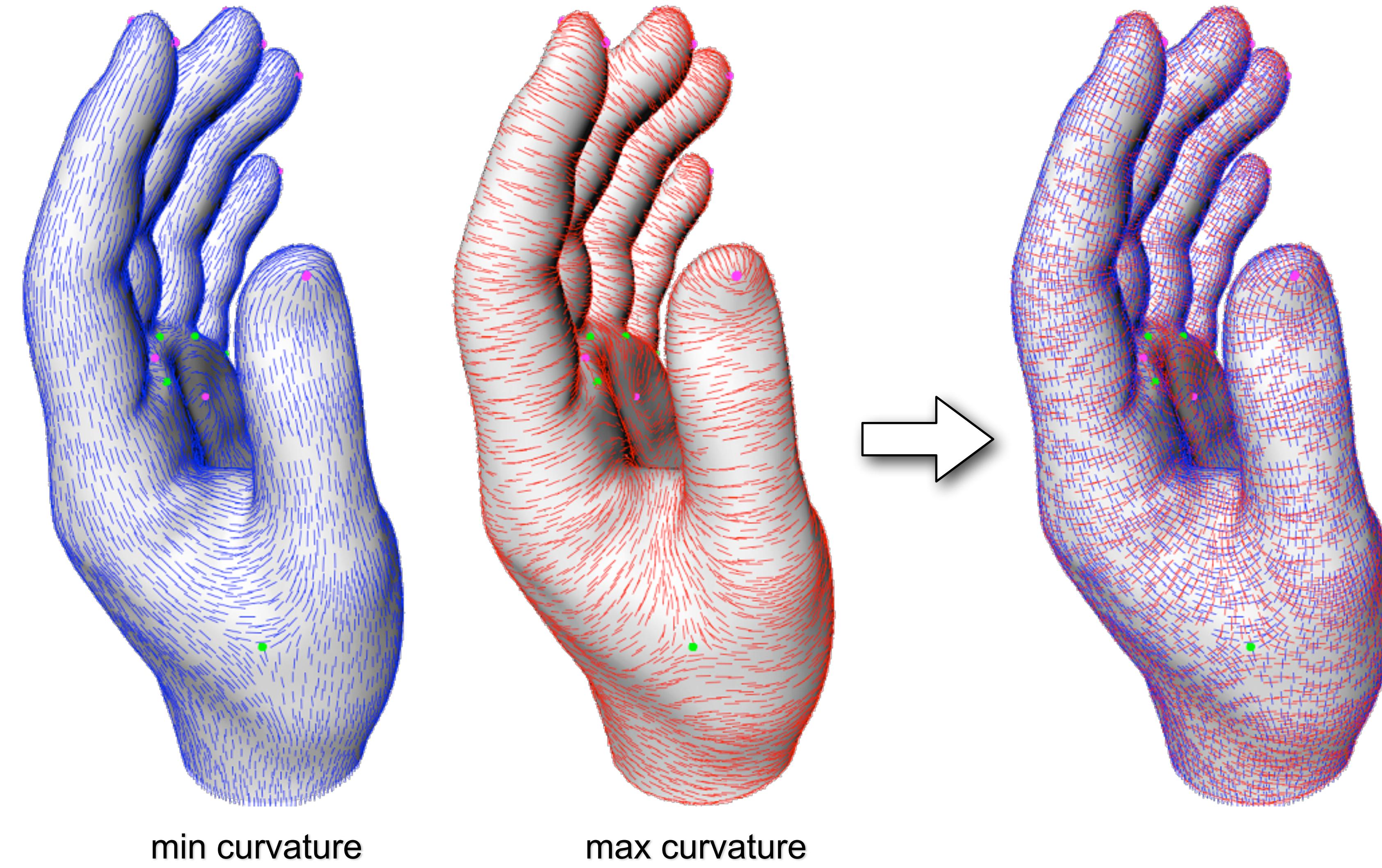


parabolic



hyperbolic

# Principal Directions Fields



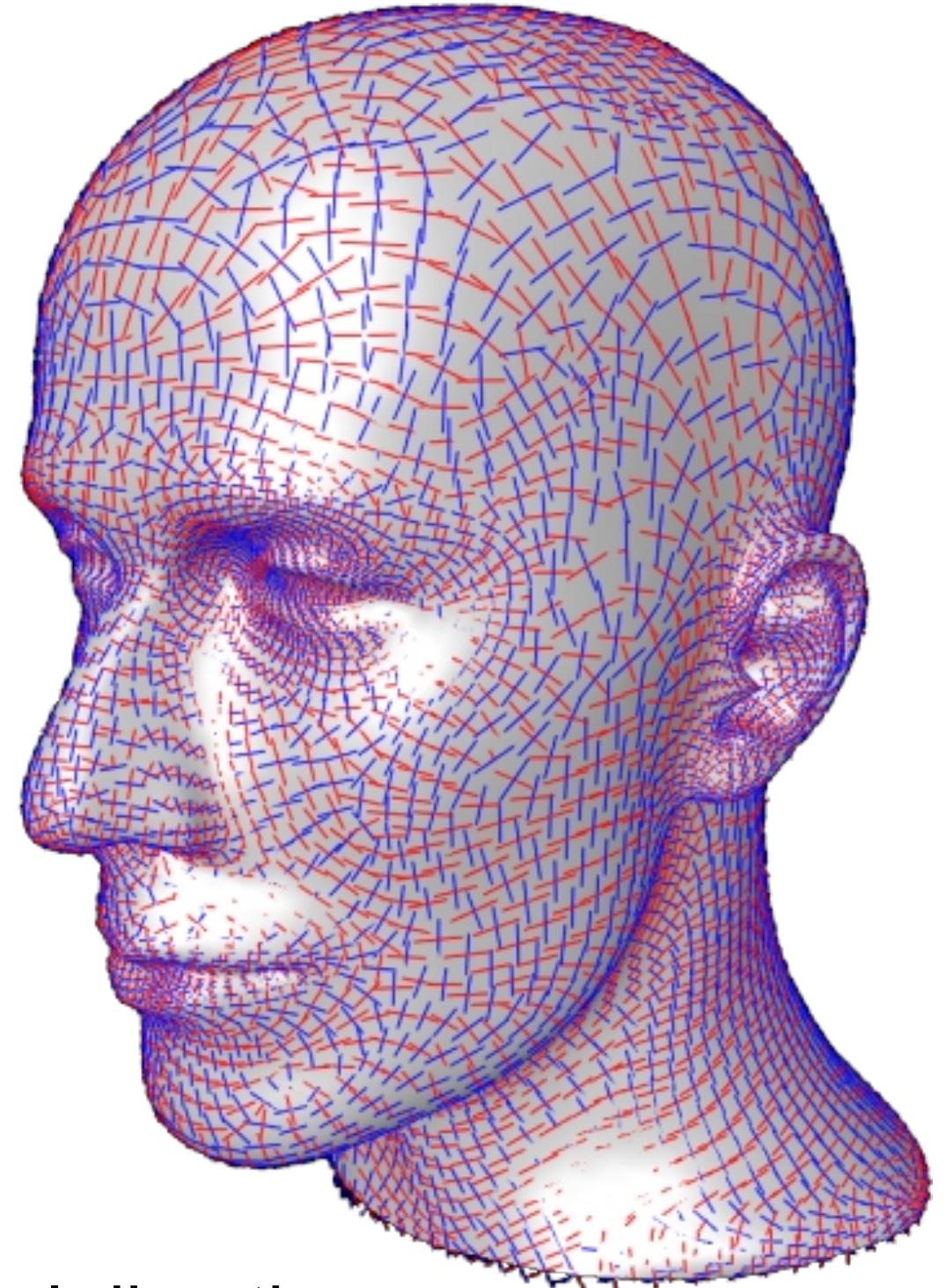
min curvature

max curvature

# Principal Curvature Directions

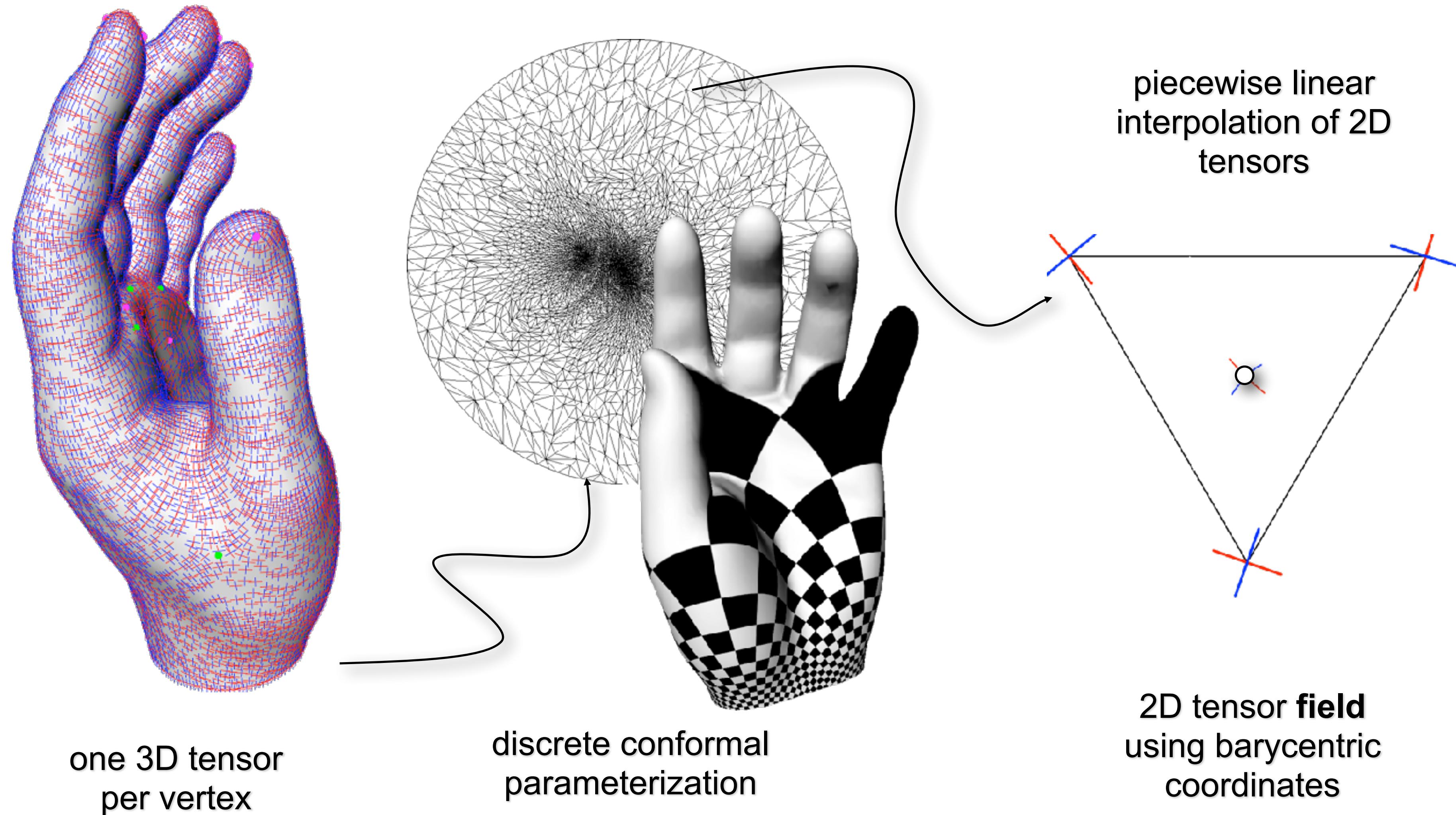


- P. Alliez: *Estimating Curvature Tensors on Triangle Meshes* (source code)
  - <http://www-sop.inria.fr/geometrica/team/Pierre.Alliez/demos/curvature/>



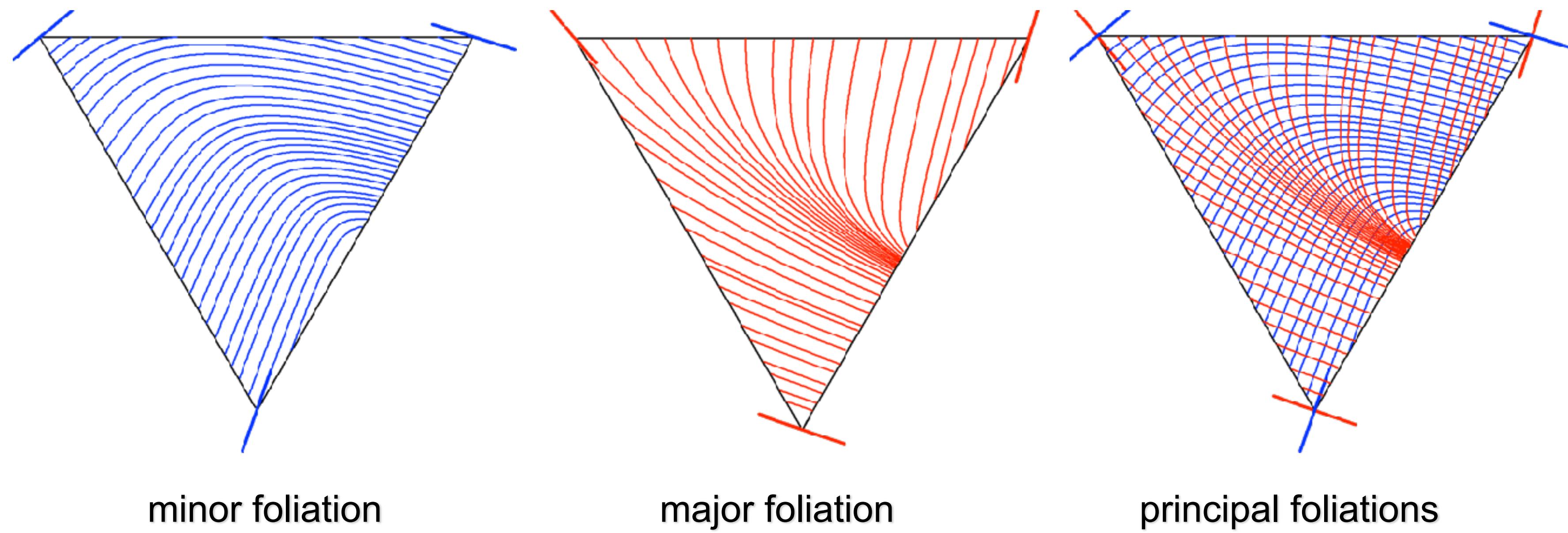
principal directions

# Flattening to 2D



# 2D Direction Fields

- Regular case



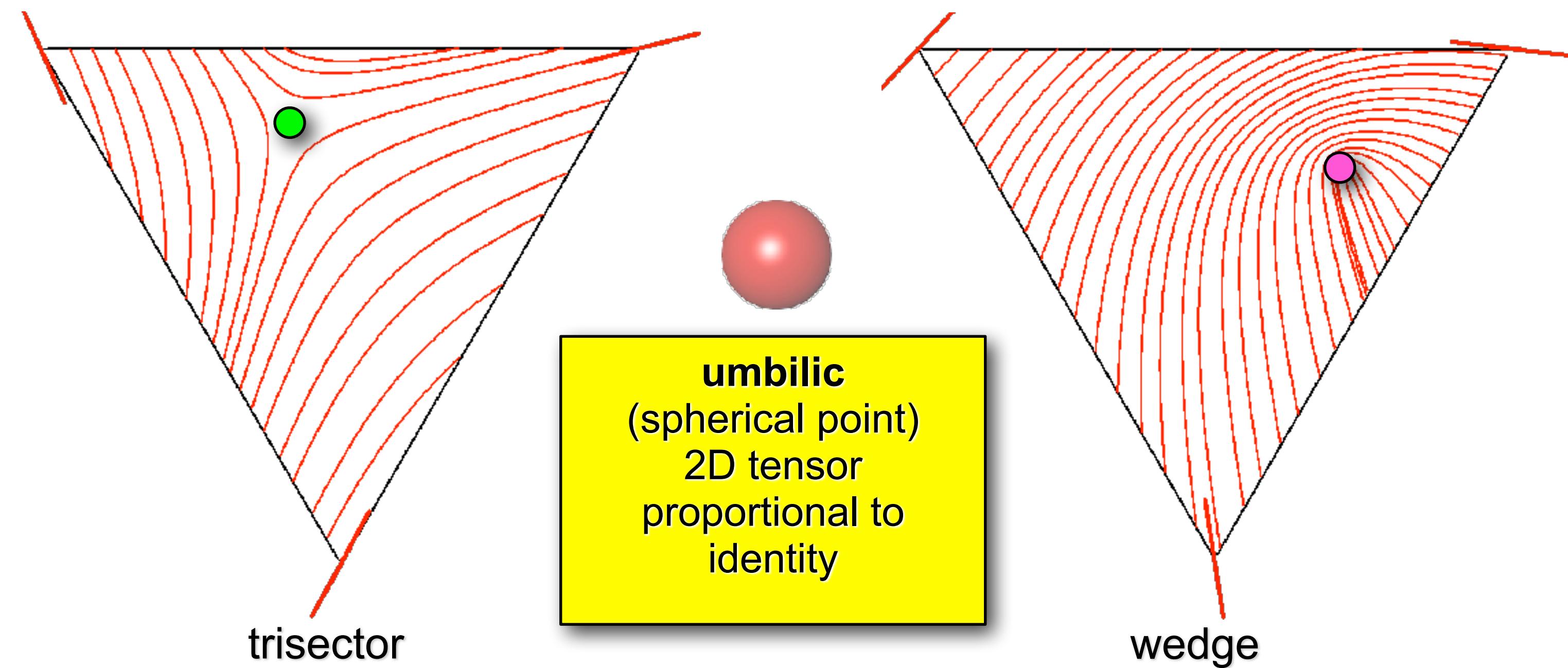
minor foliation

major foliation

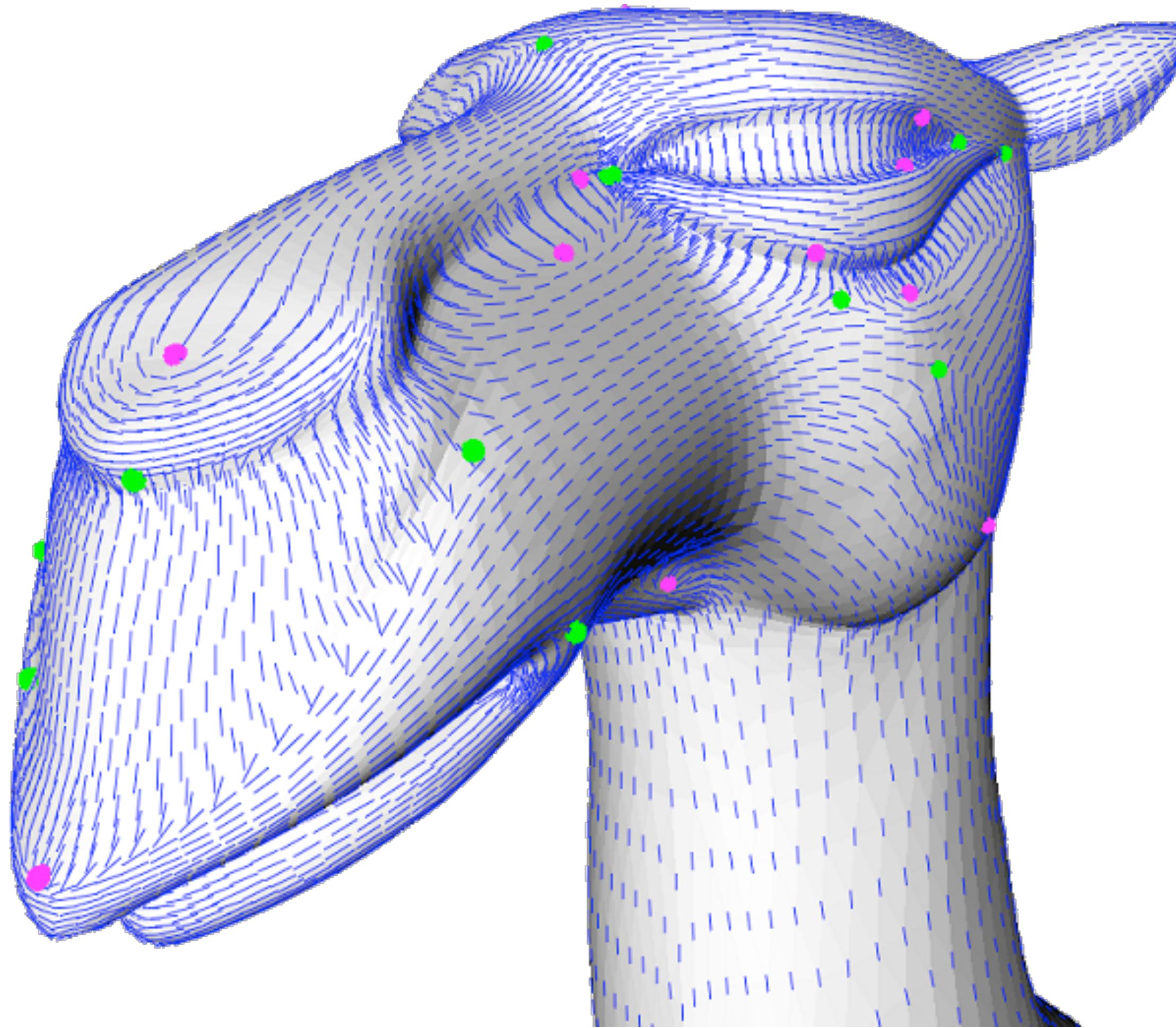
principal foliations

# 2D Direction Fields

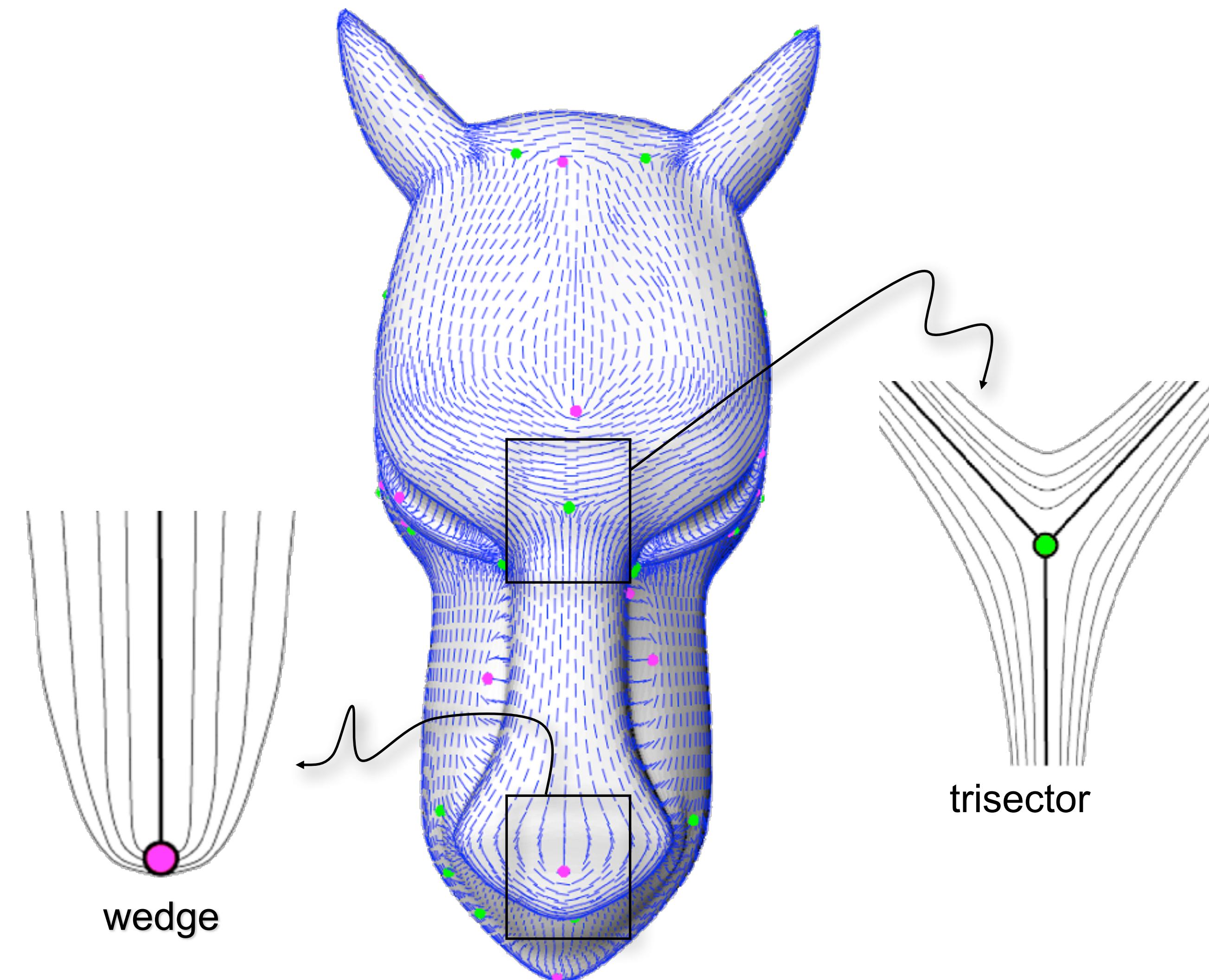
- Singularities



# Umbilics

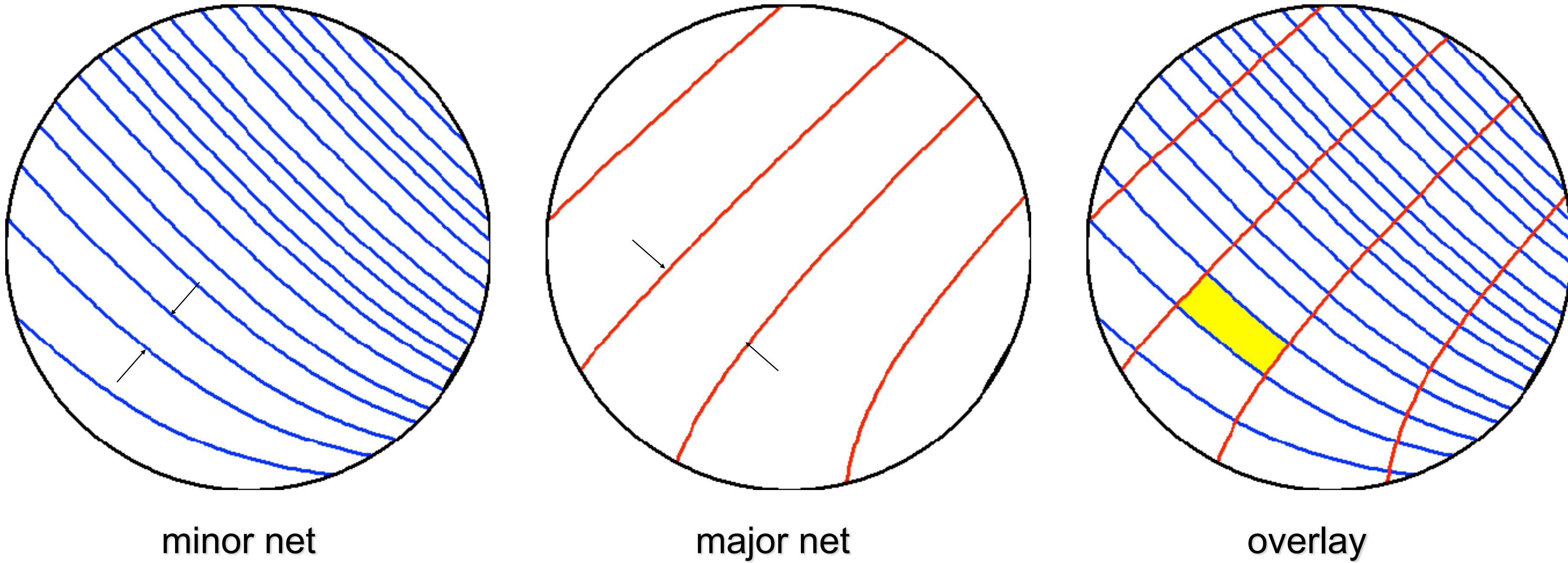


# Umbilics



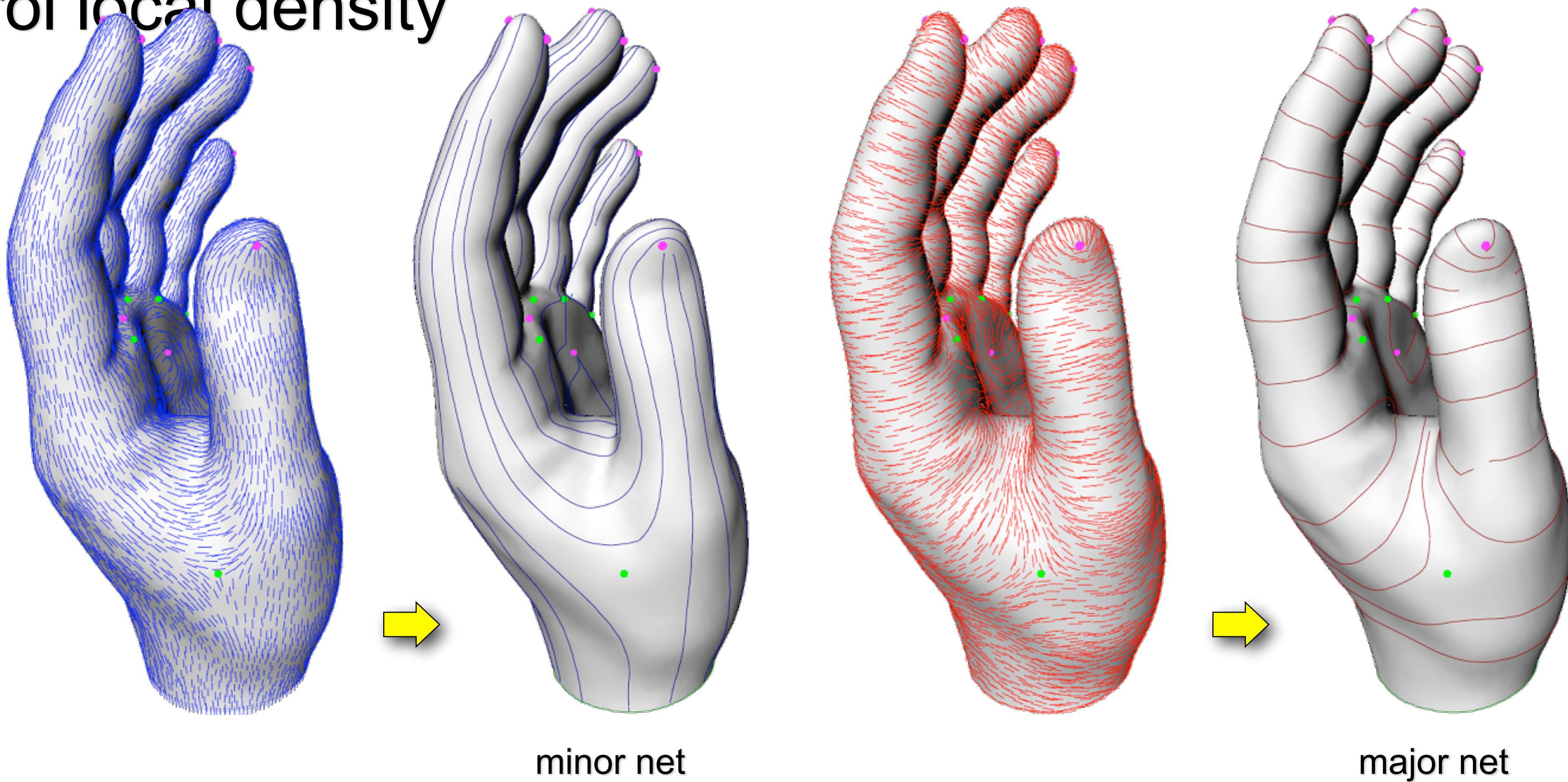
# Lines of Curvature

- Control local density



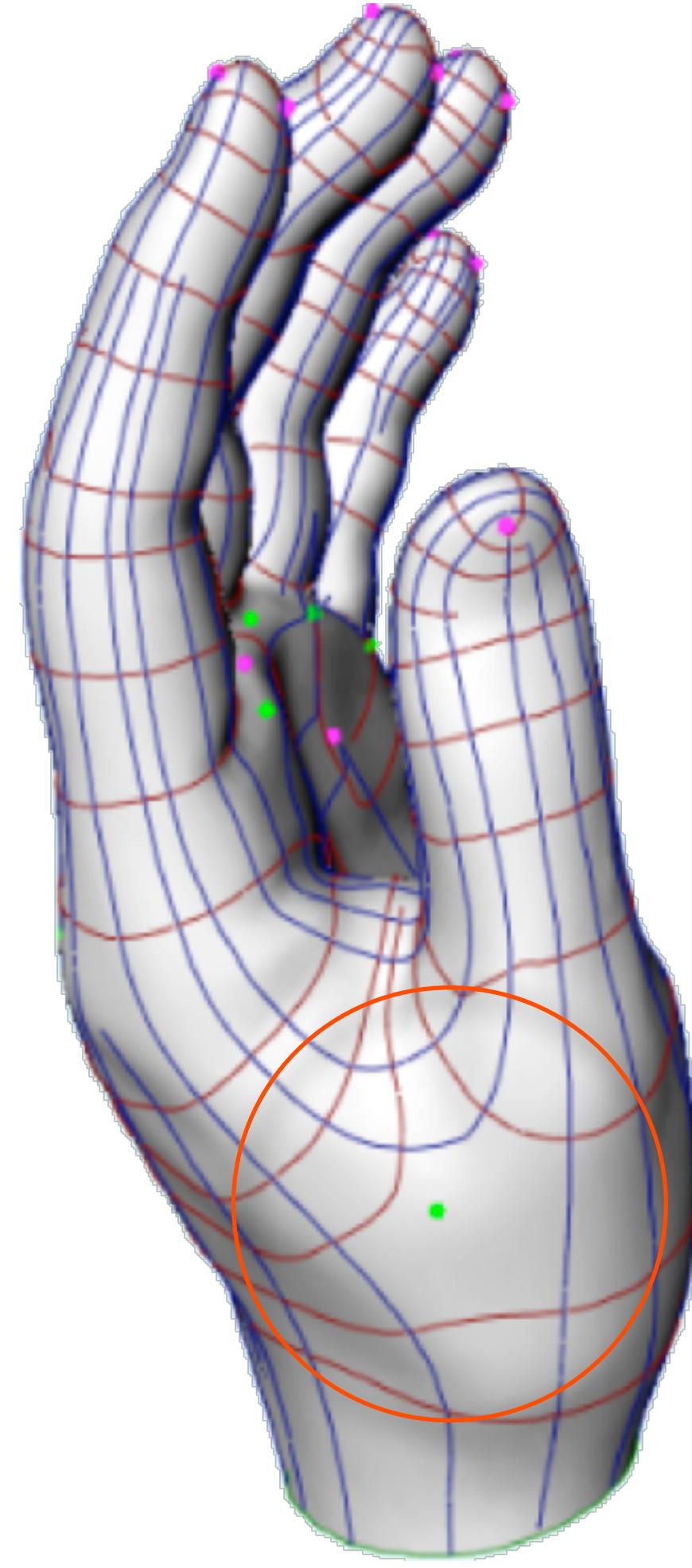
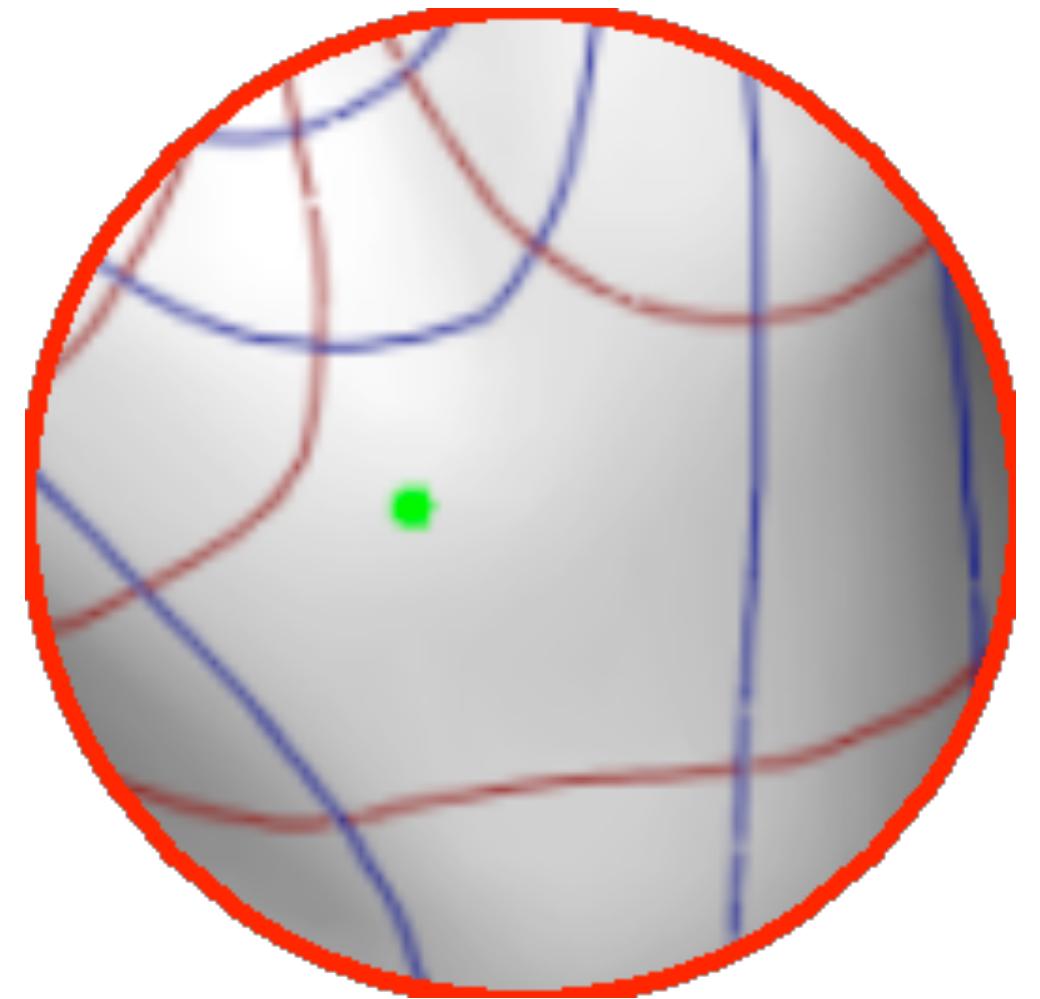
# Lines of Curvature

- Control local density

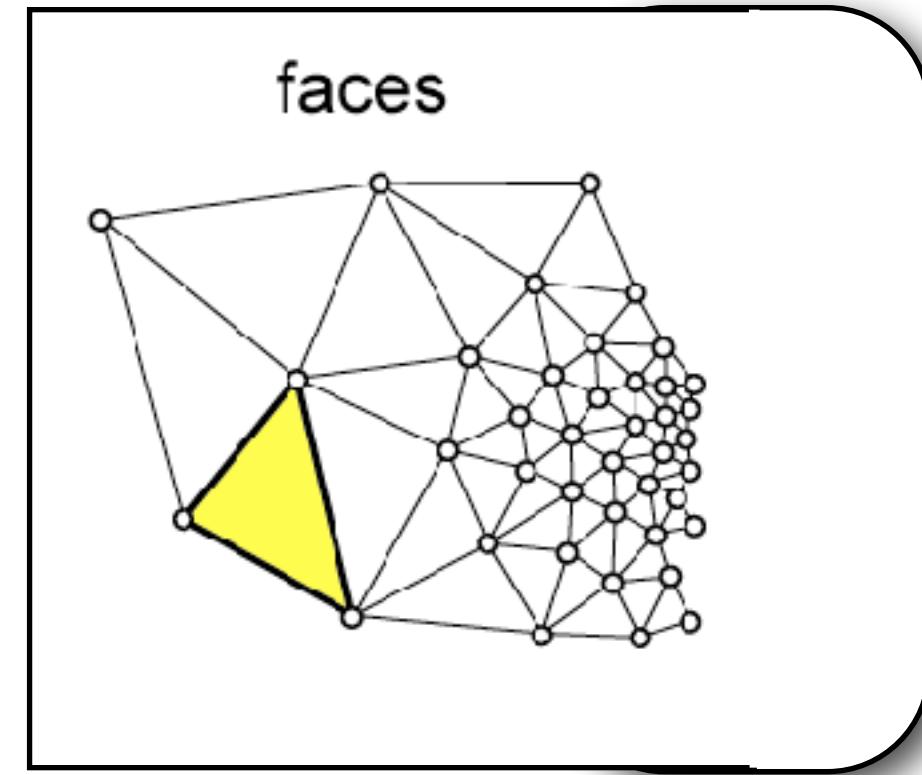
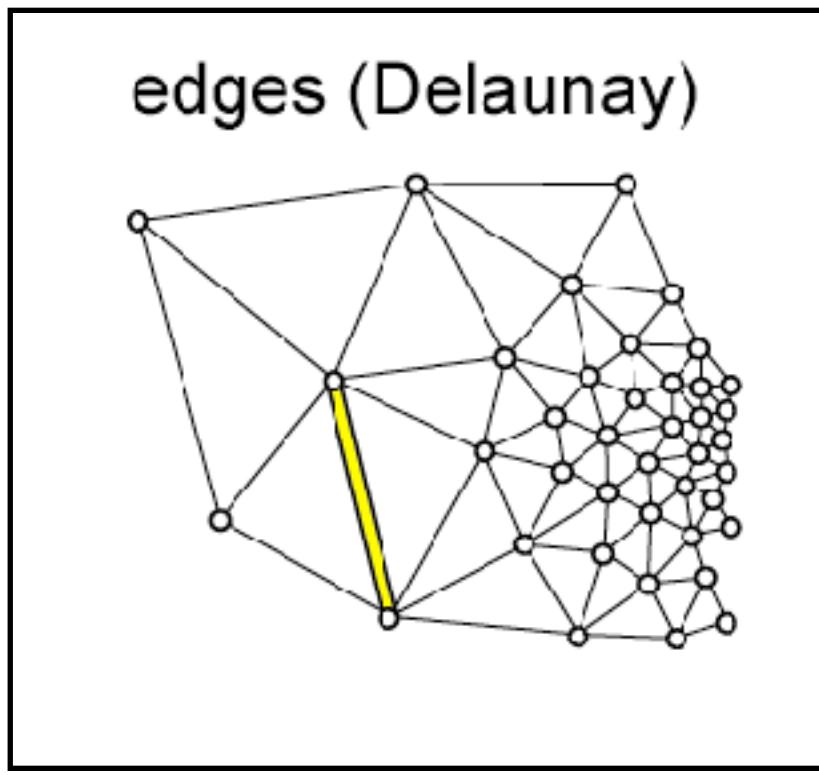
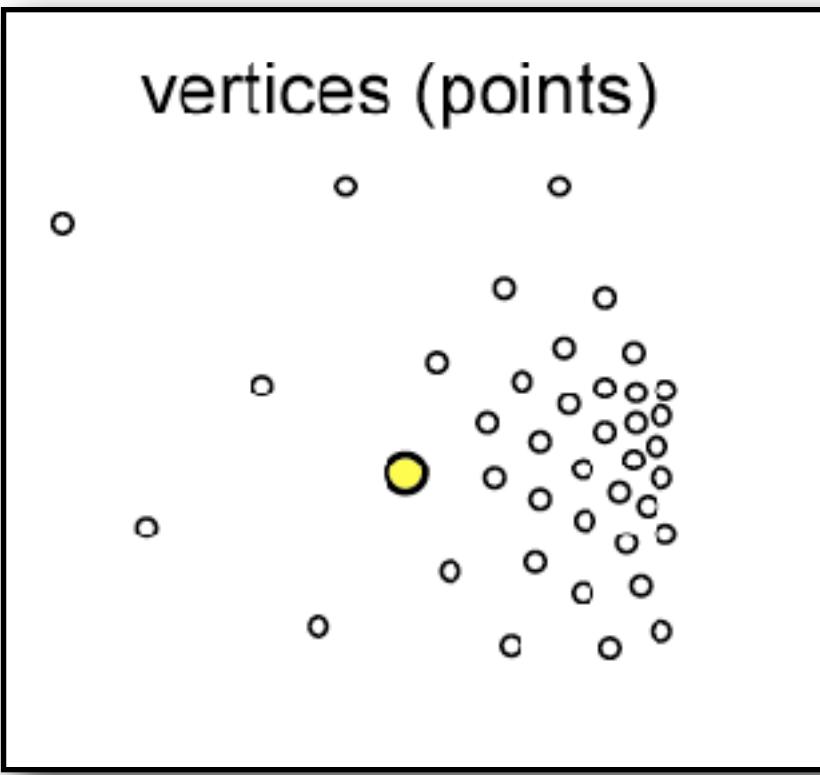
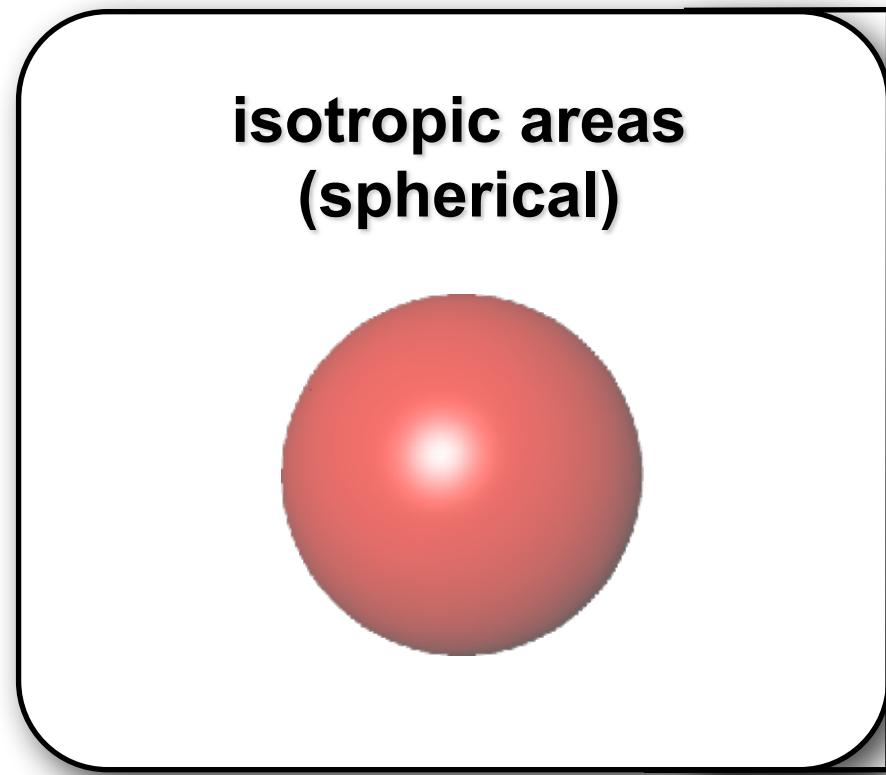
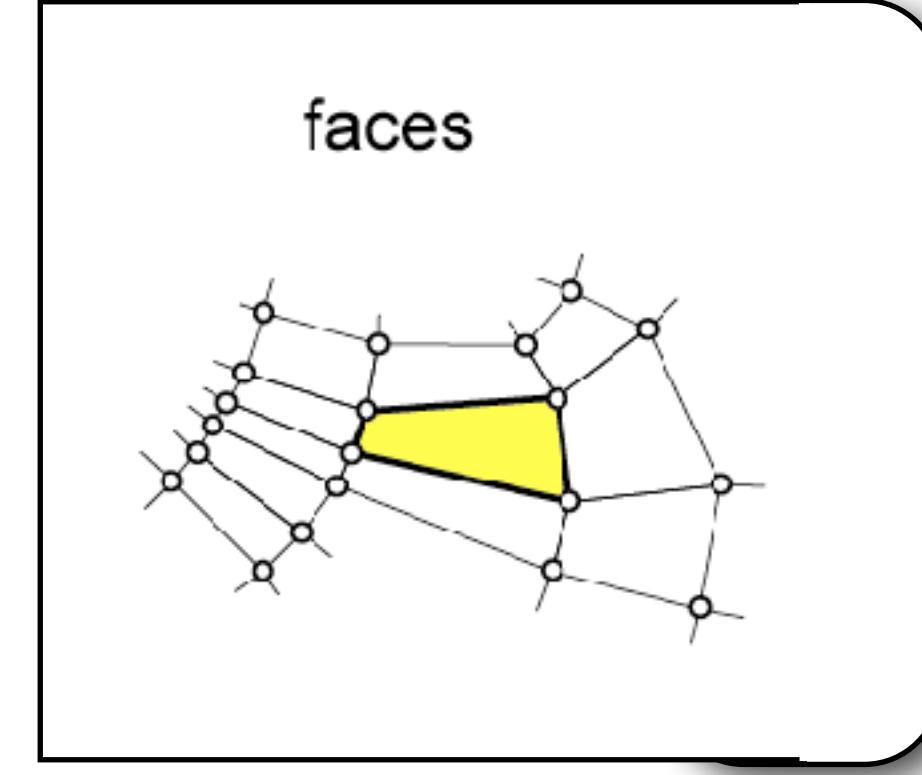
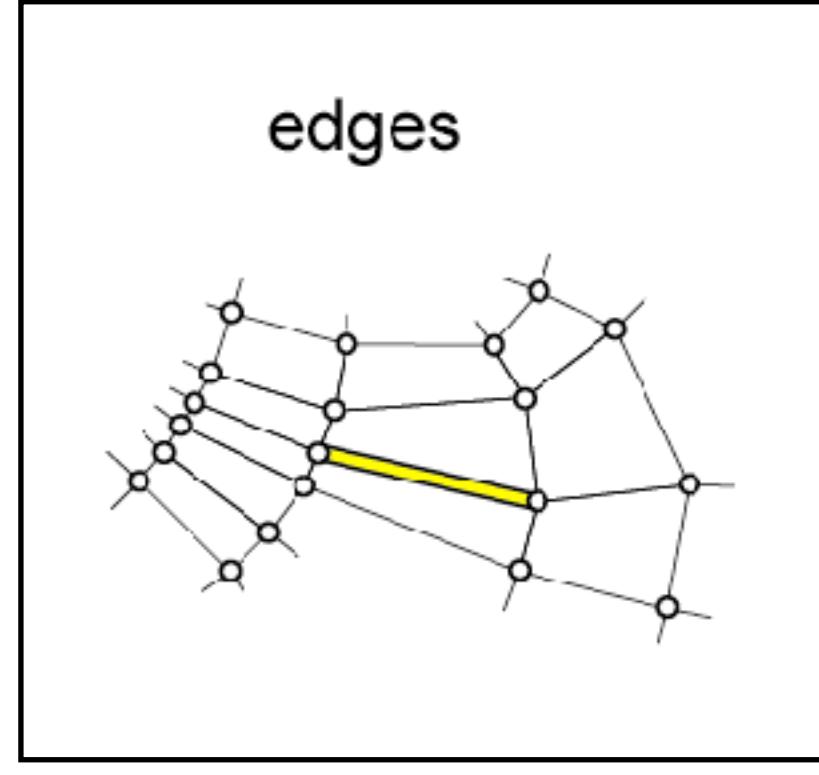
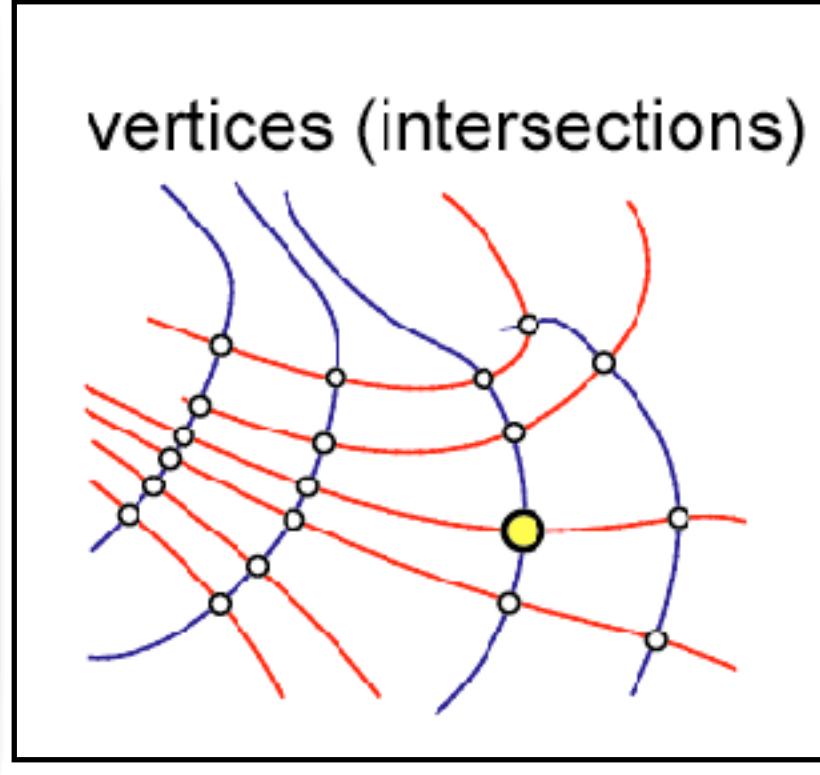
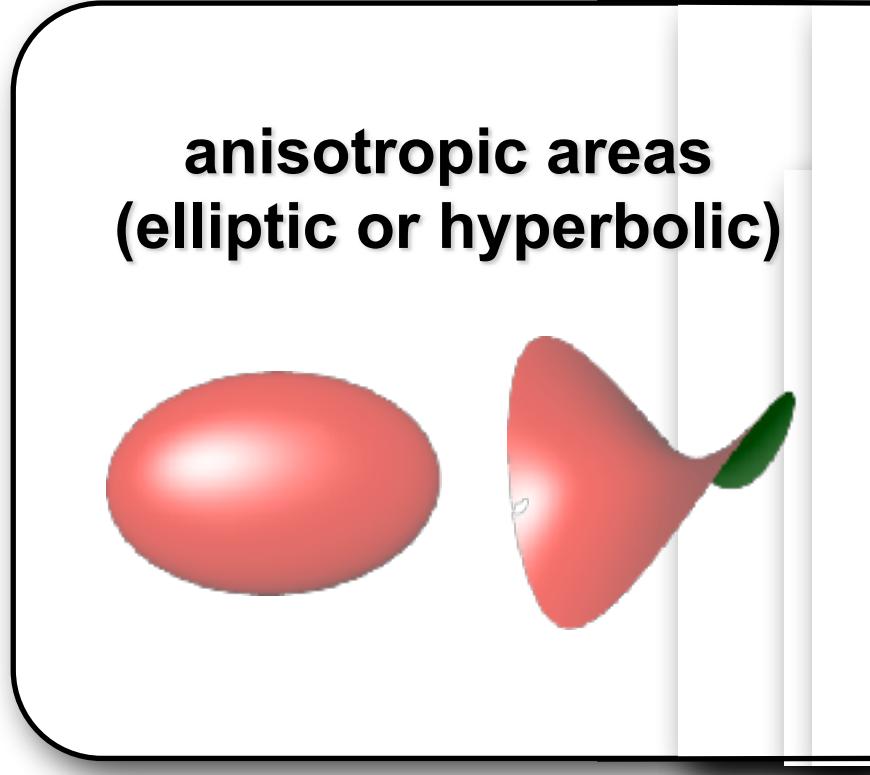


# Overlay

- Overlay curvature lines in anisotropic regions
- Add umbilic points in isotropic regions

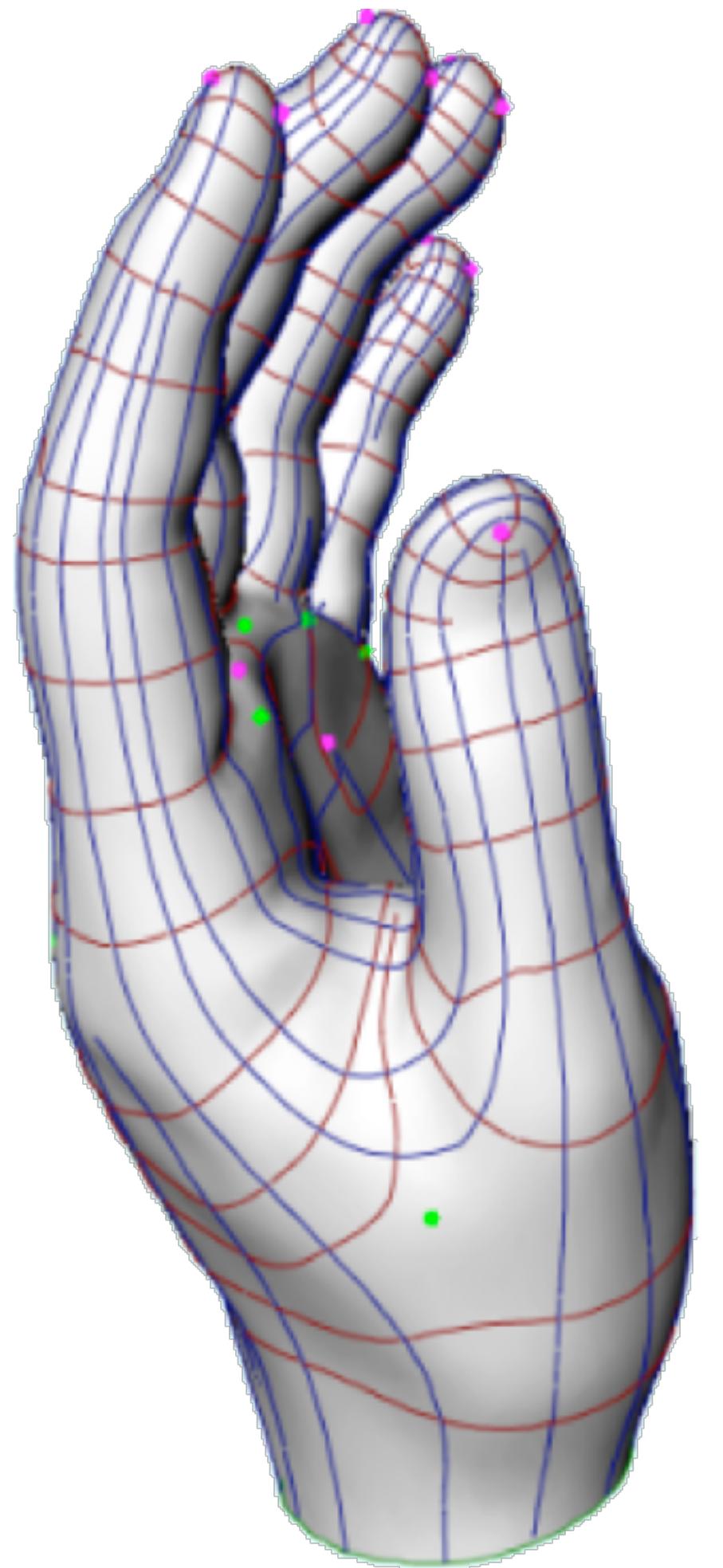


# Meshing

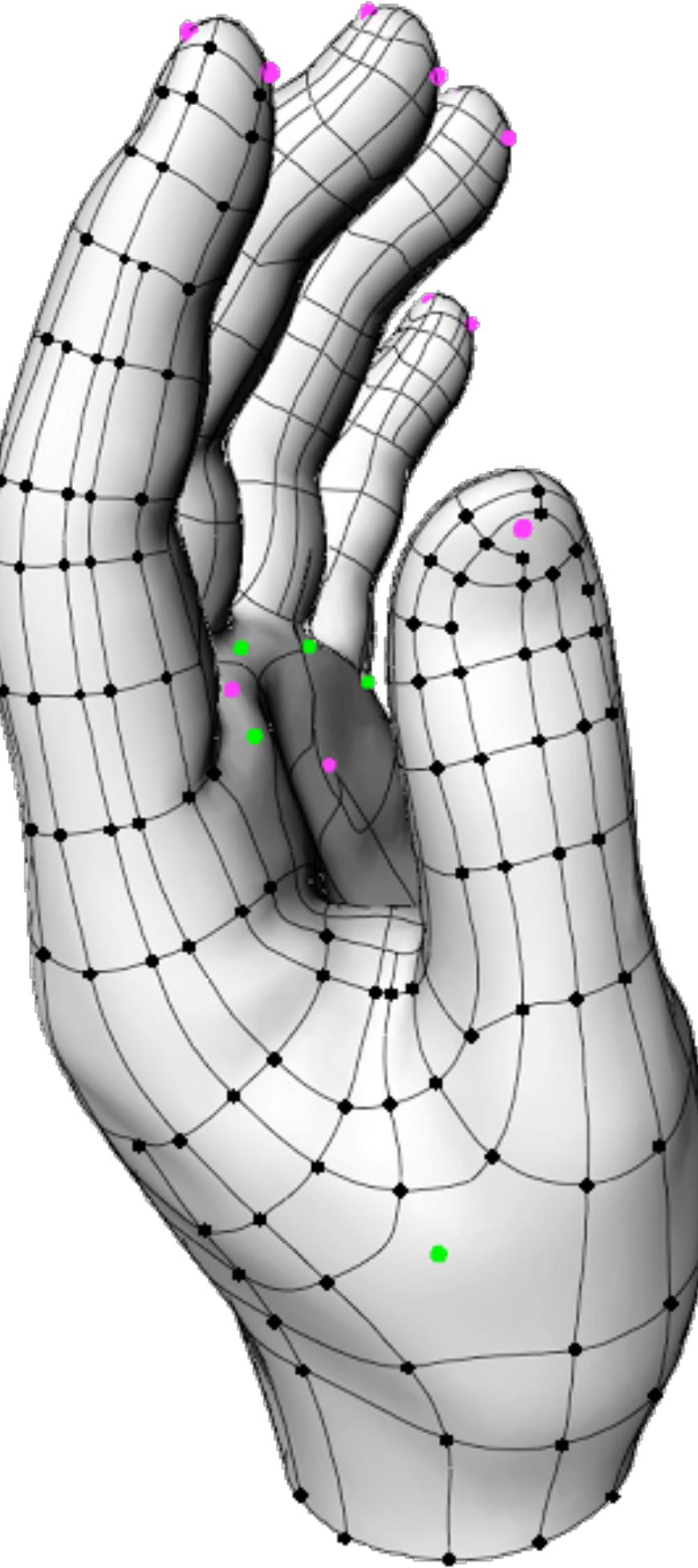


**[CGAL]** [www.cgal.org](http://www.cgal.org)

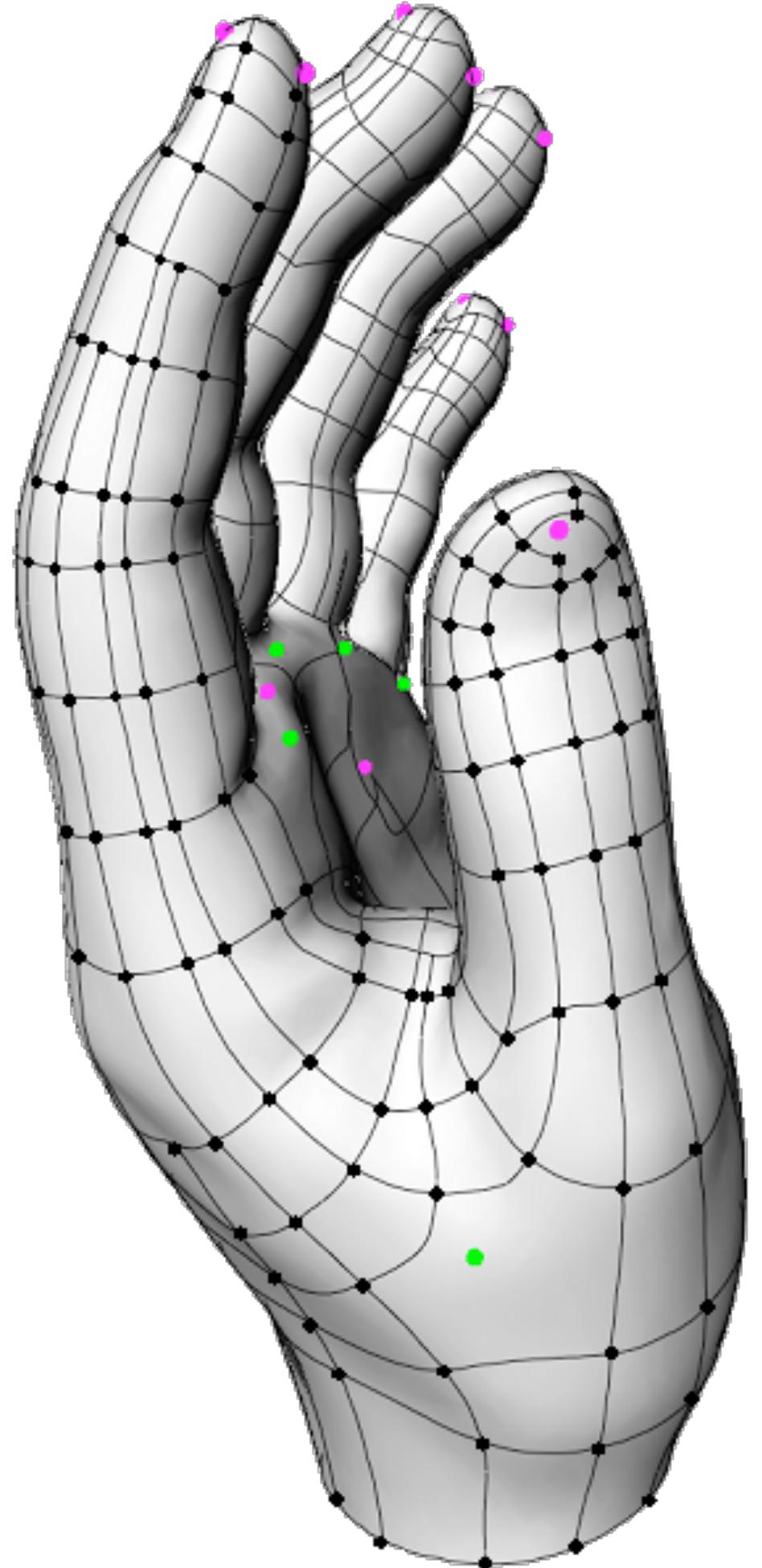
# Vertices



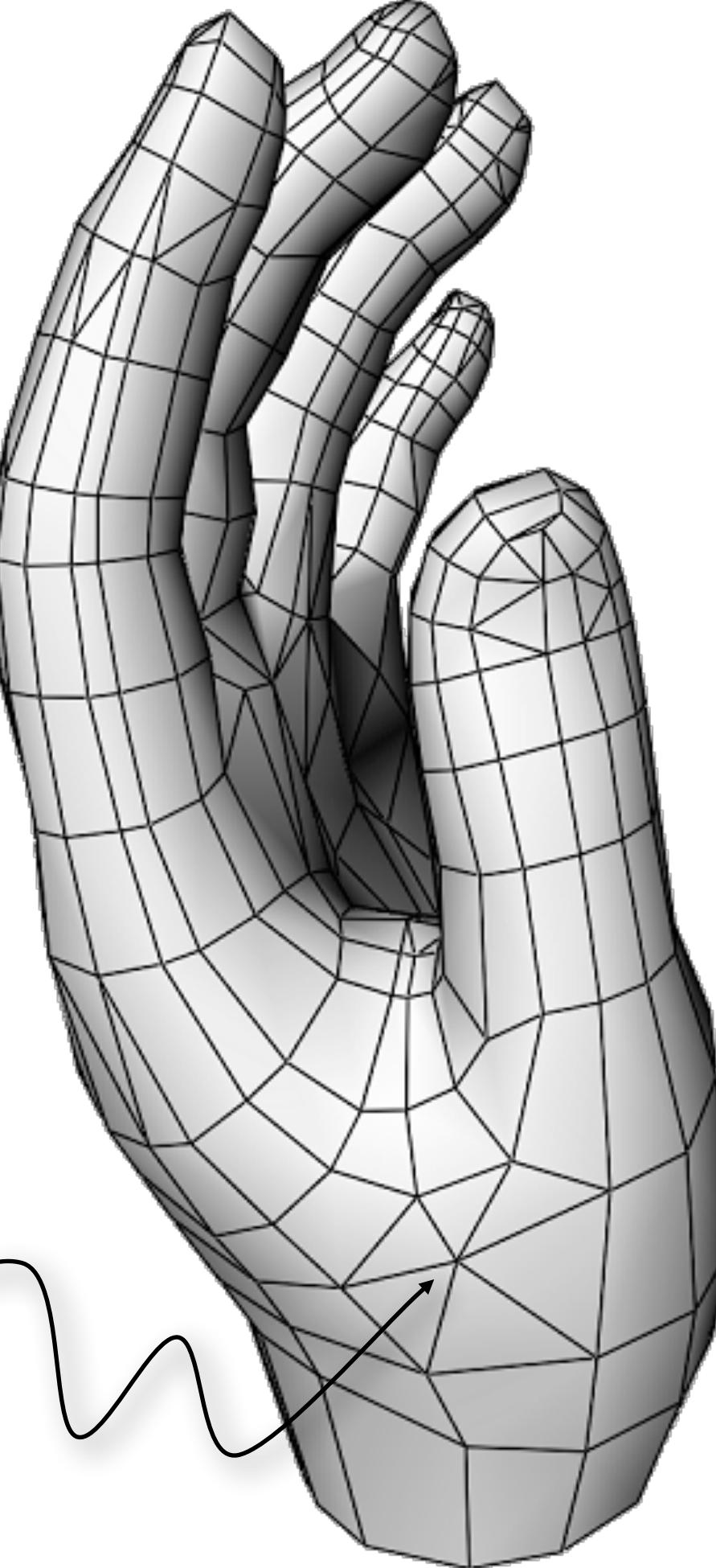
intersect lines of  
curvatures



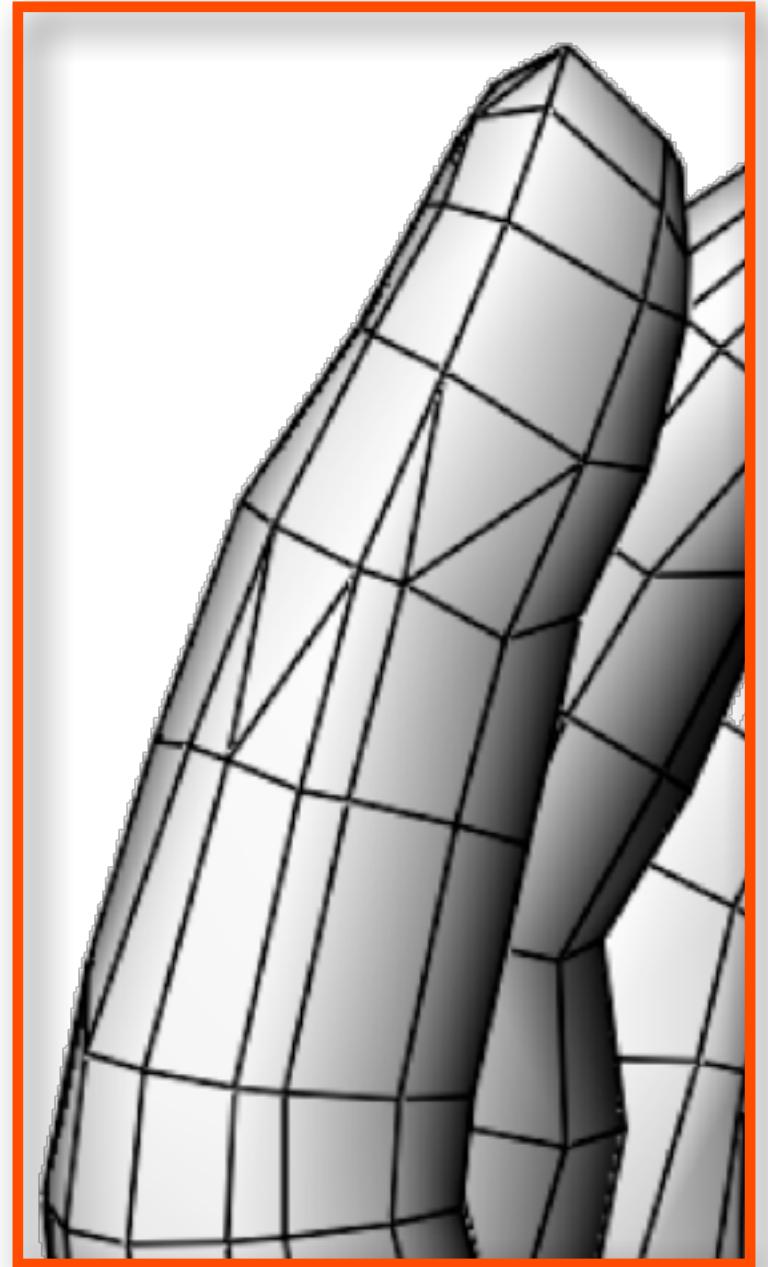
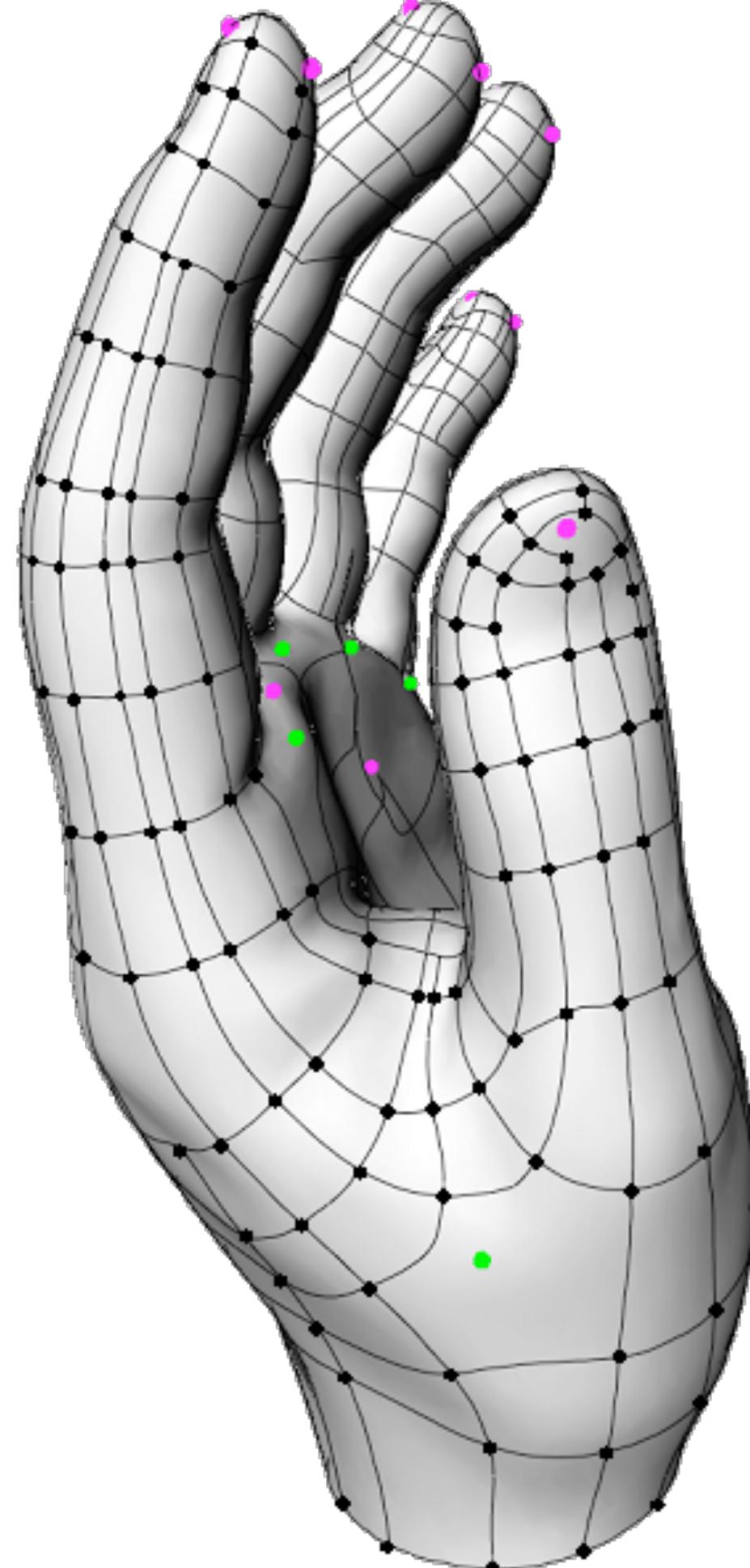
# Edges



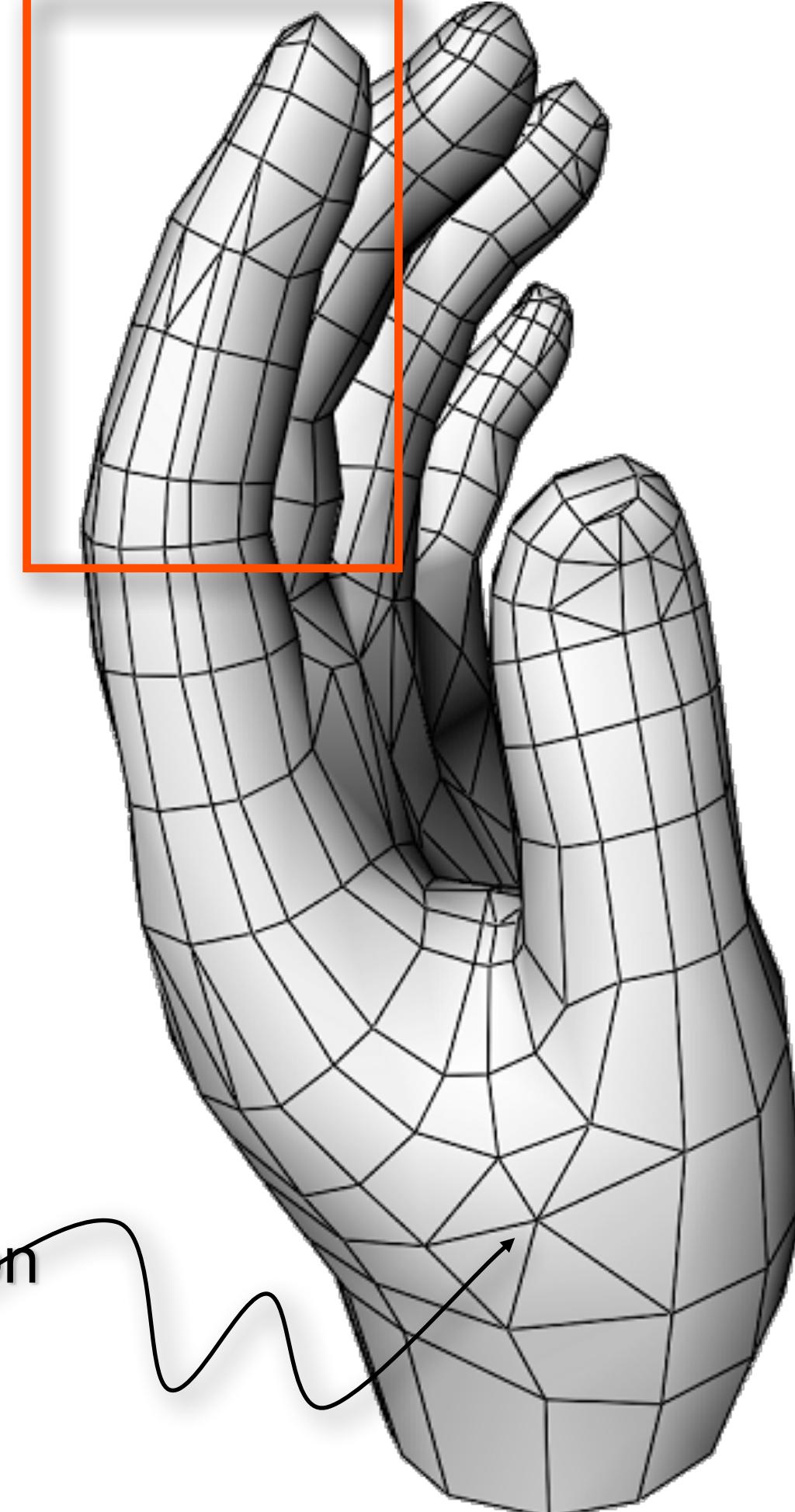
straighten lines of  
curvatures  
+  
Delaunay triangulation  
near umbilics



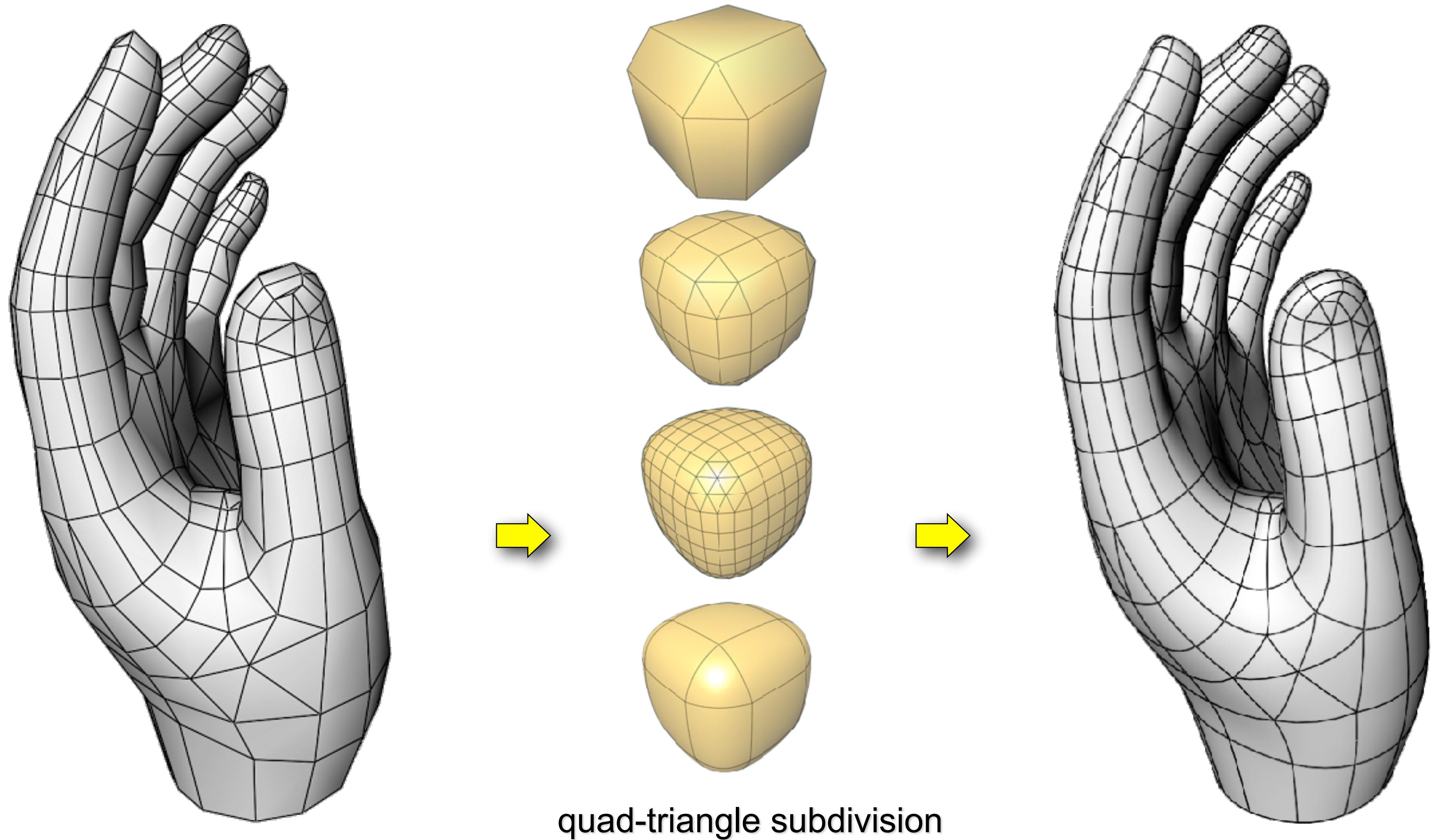
# Edges



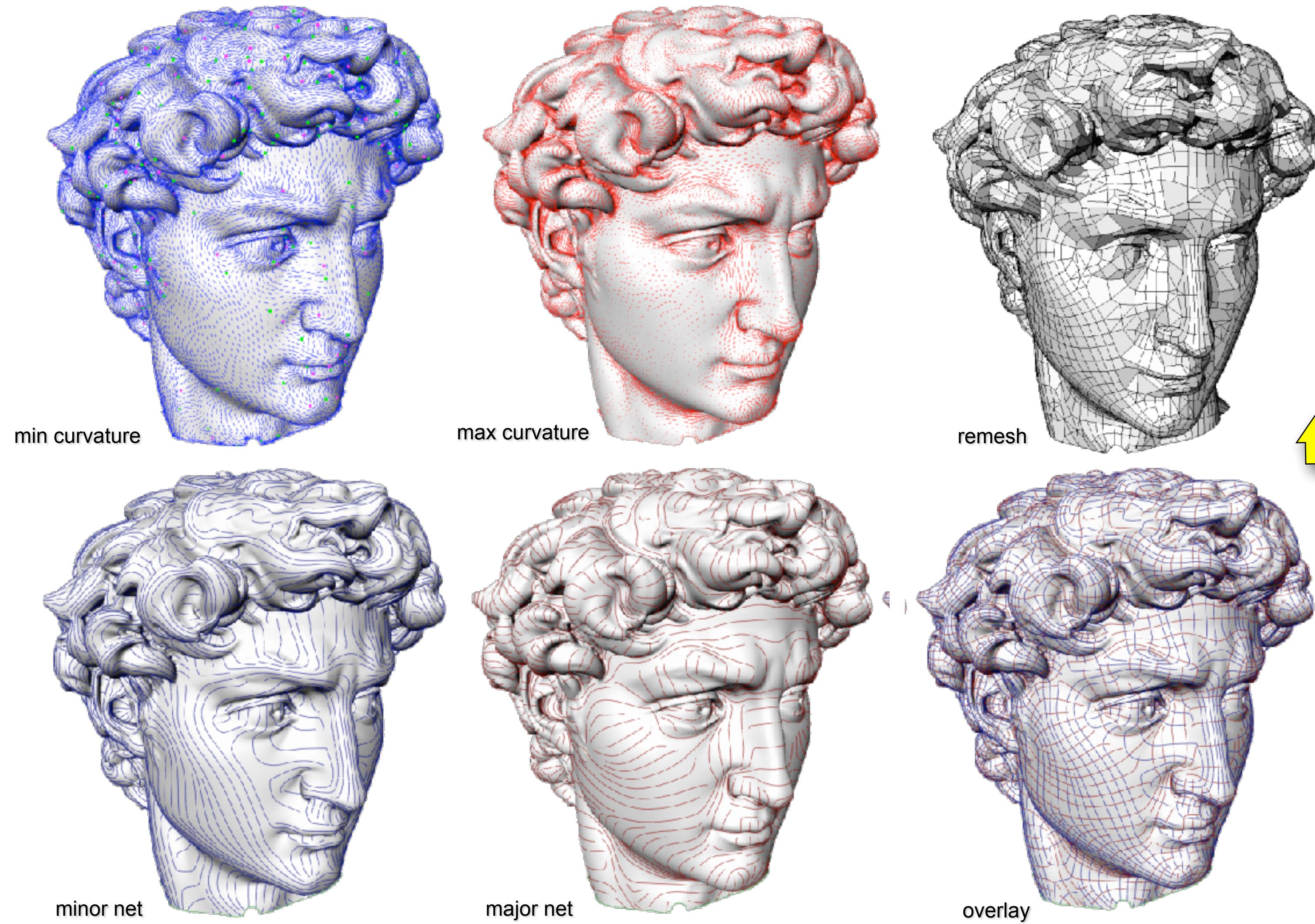
straighten lines of  
curvatures  
+  
Delaunay triangulation  
near umbilics



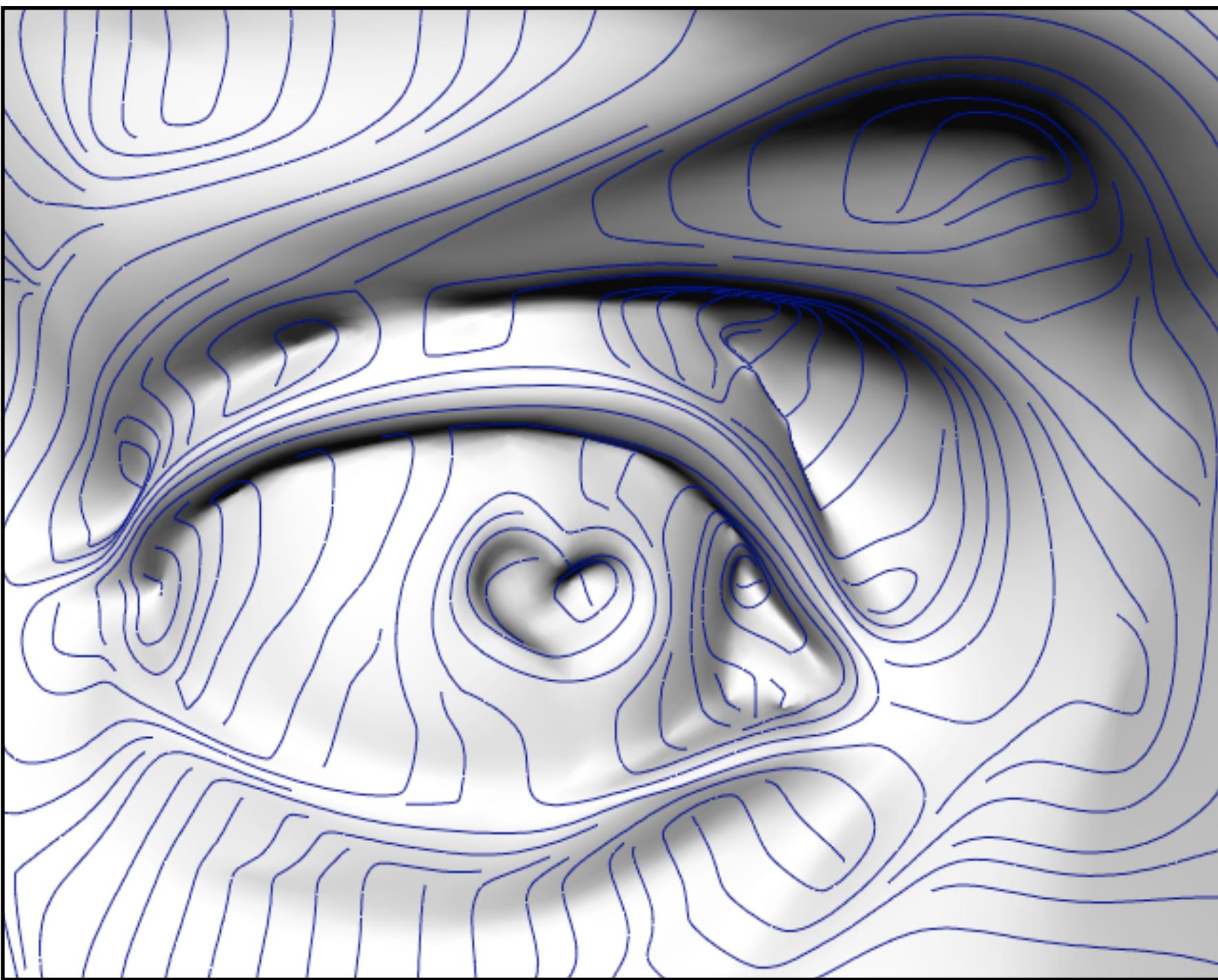
# Smoothing by Subdivision



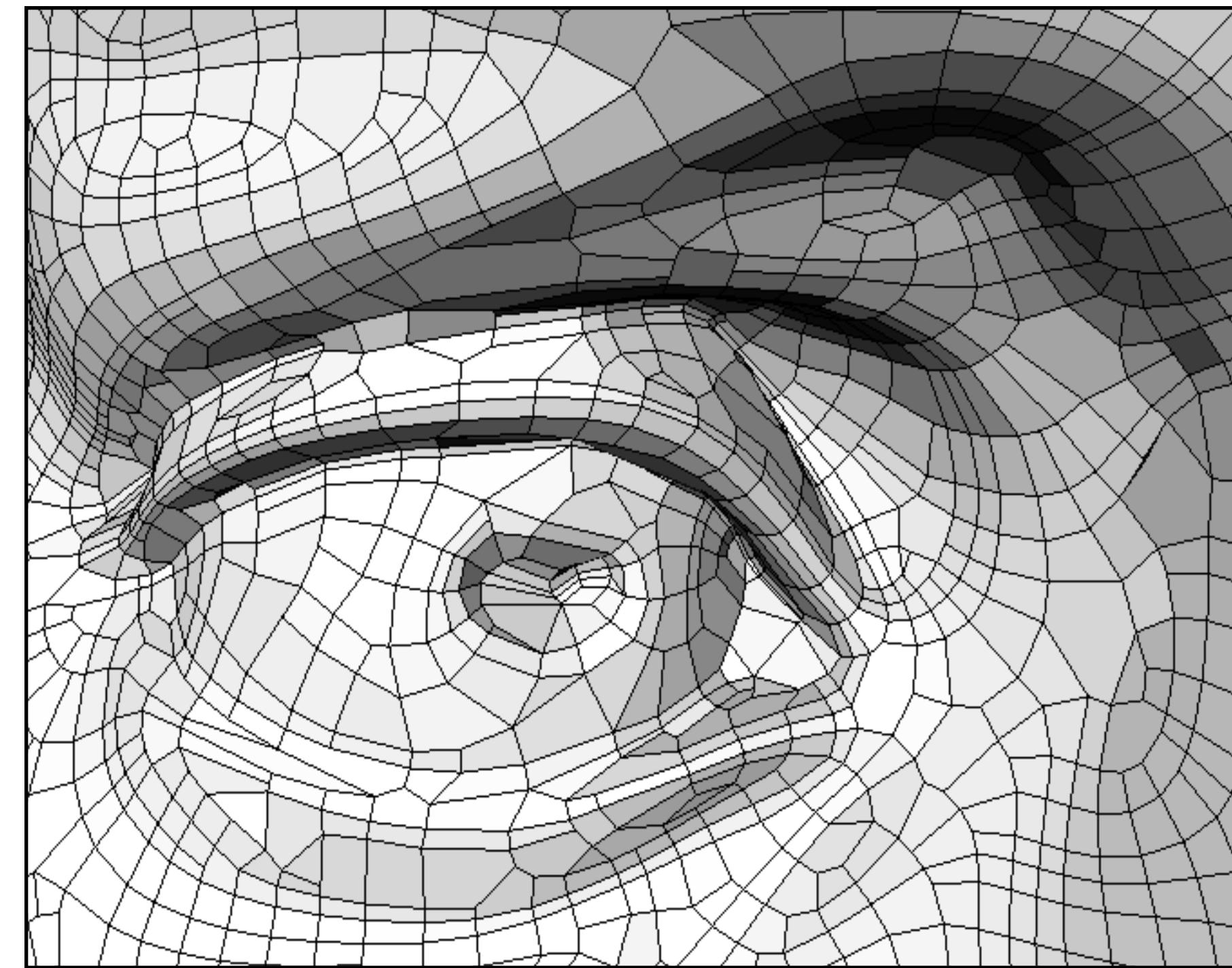
# Results



# Close-Up



minor net



remesh

# Limitations



- **Global parameterization**
  - Smart cutting required
  - Low distortion parameterization
  - Numerical issues
- **Lines of curvature**
  - Robust curvature tensor computation
  - Tensor smoothing required
  - Optimal placement of streamlines difficult

# Overview

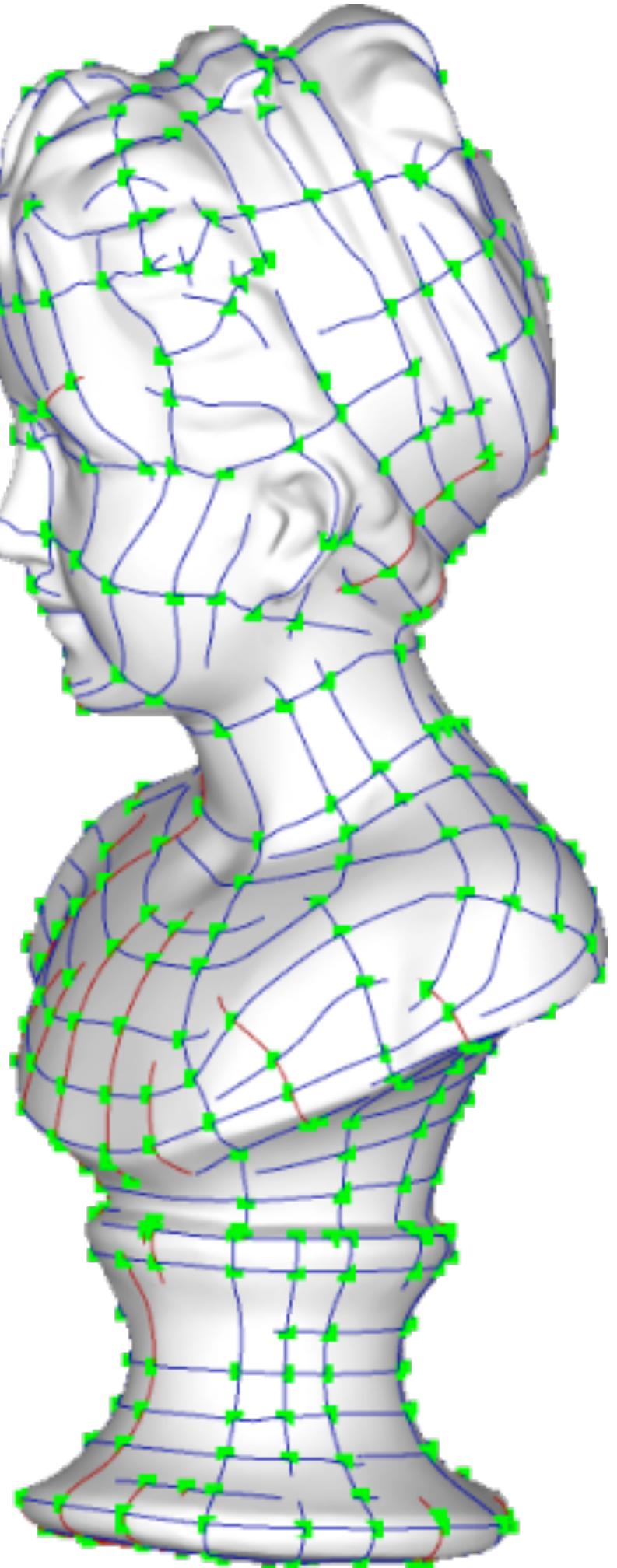


- Isotropic Remeshing
  - Parameterization-based [Alliez 2002]
  - Surface-based [Botsch 2004]
- Anisotropic Remeshing
  - Parameterization-based [Alliez 2003]
  - **Surface-based** [Marinov 2004]

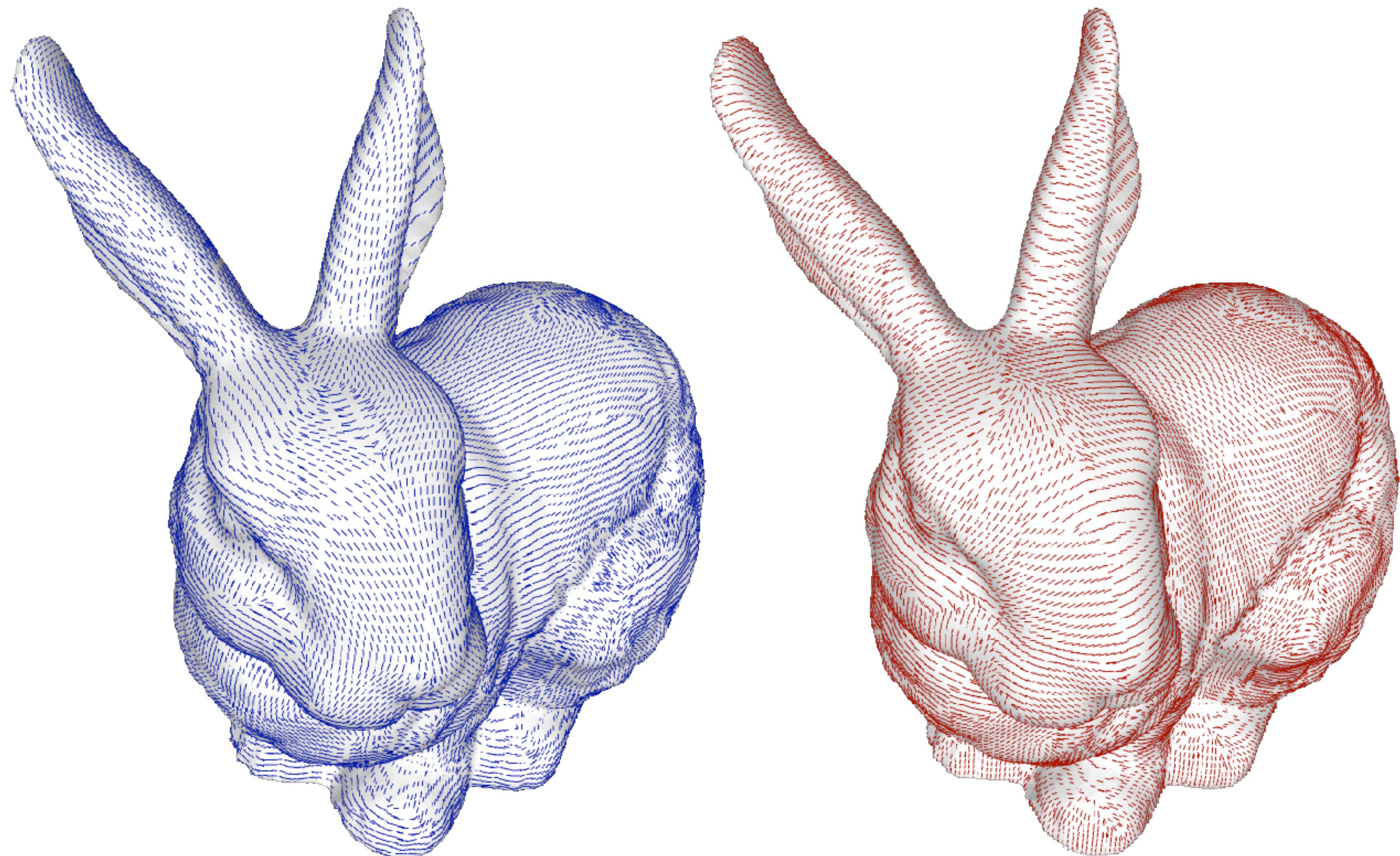
# Marinov: Direct Aniso. Remeshing



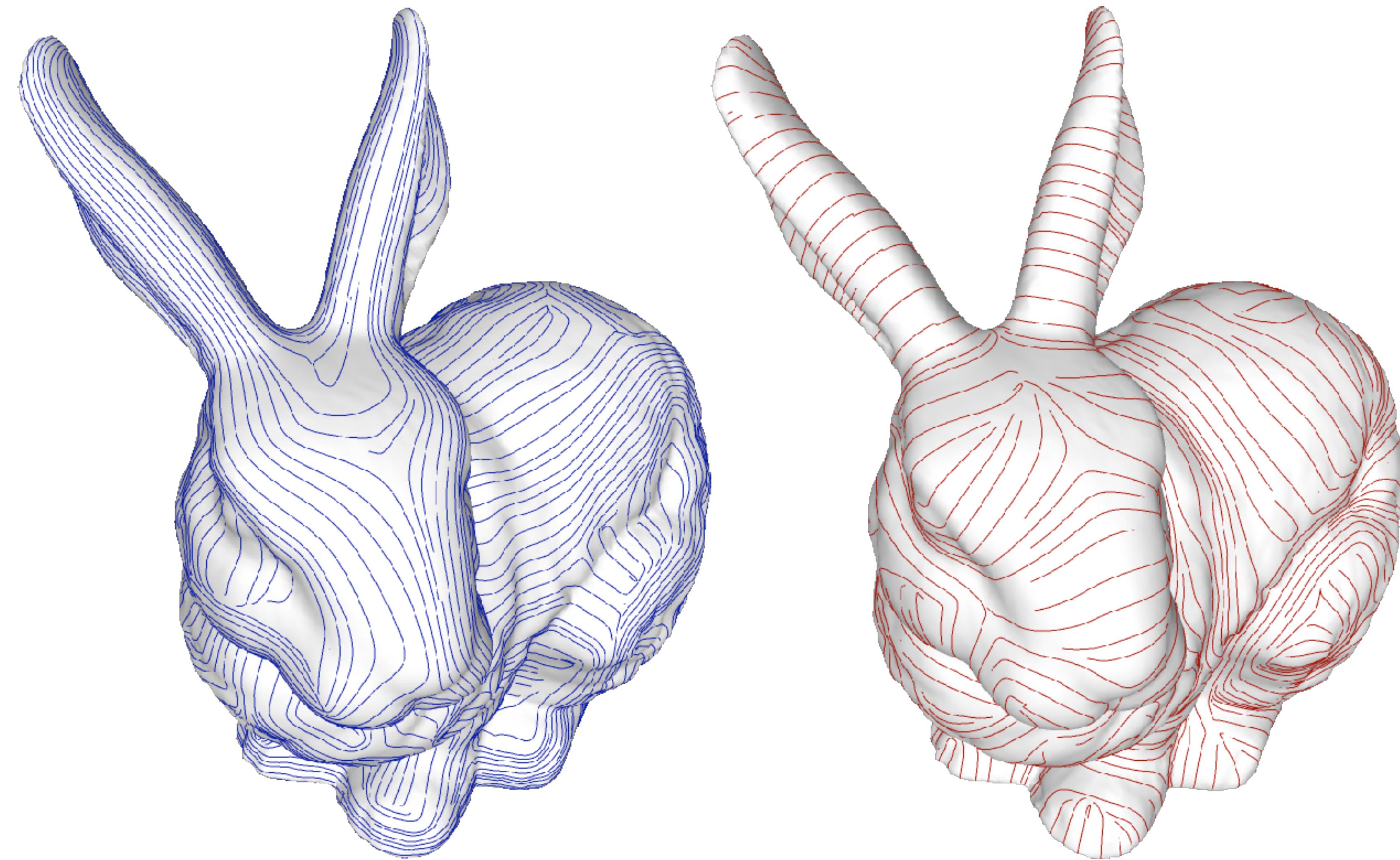
- Compute **curvature tensor** on the mesh
  - Smoothing in the tangent plane
- Integrate **curvature lines** on the mesh
  - Follow min / max curvature in aniso. regions
  - Straight geodesics in isotropic regions
  - Line snapping
- **Mesh directly** on the mesh
  - Lines intersections give vertices
  - Convex partitioning



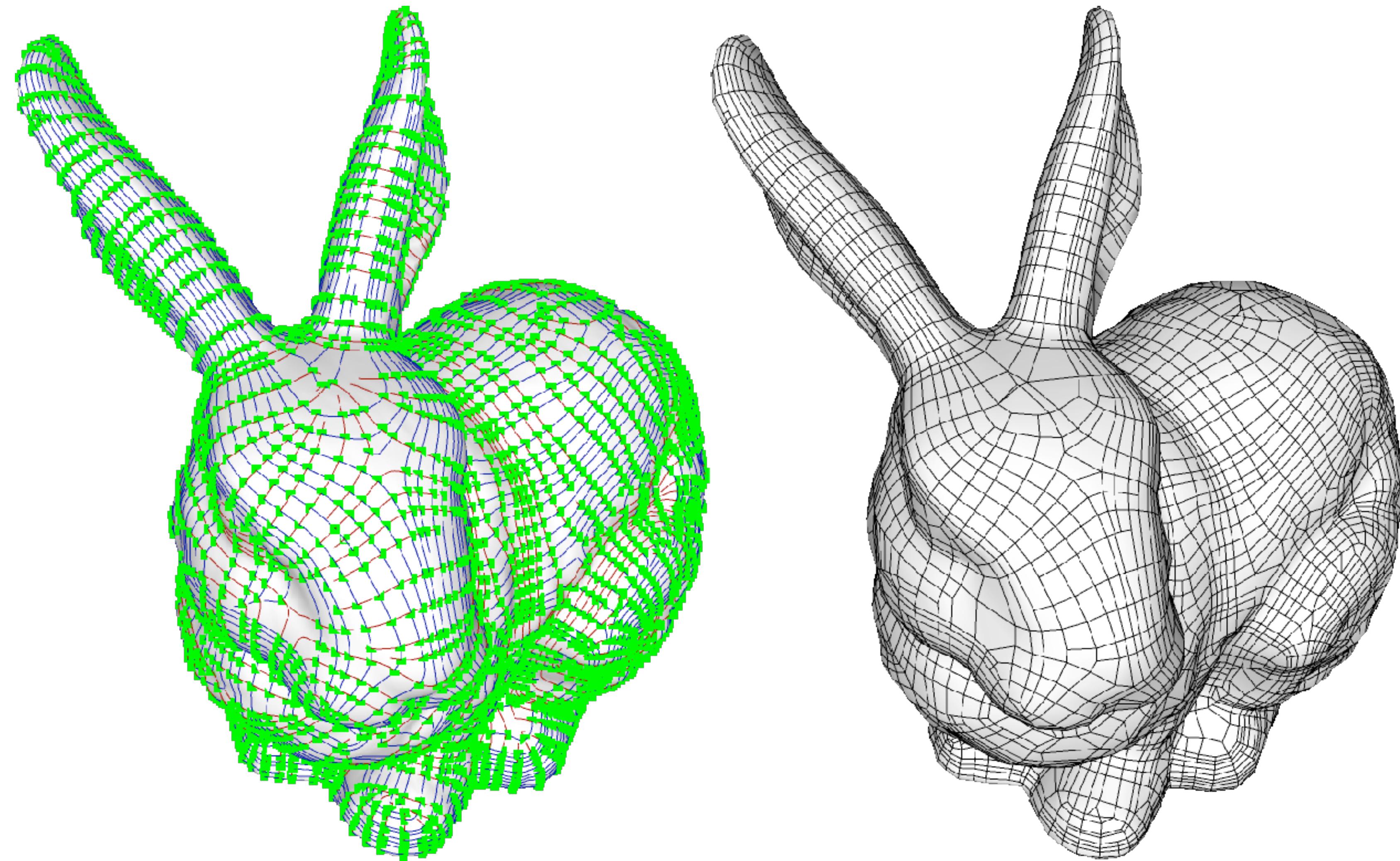
# Curvature Tensors



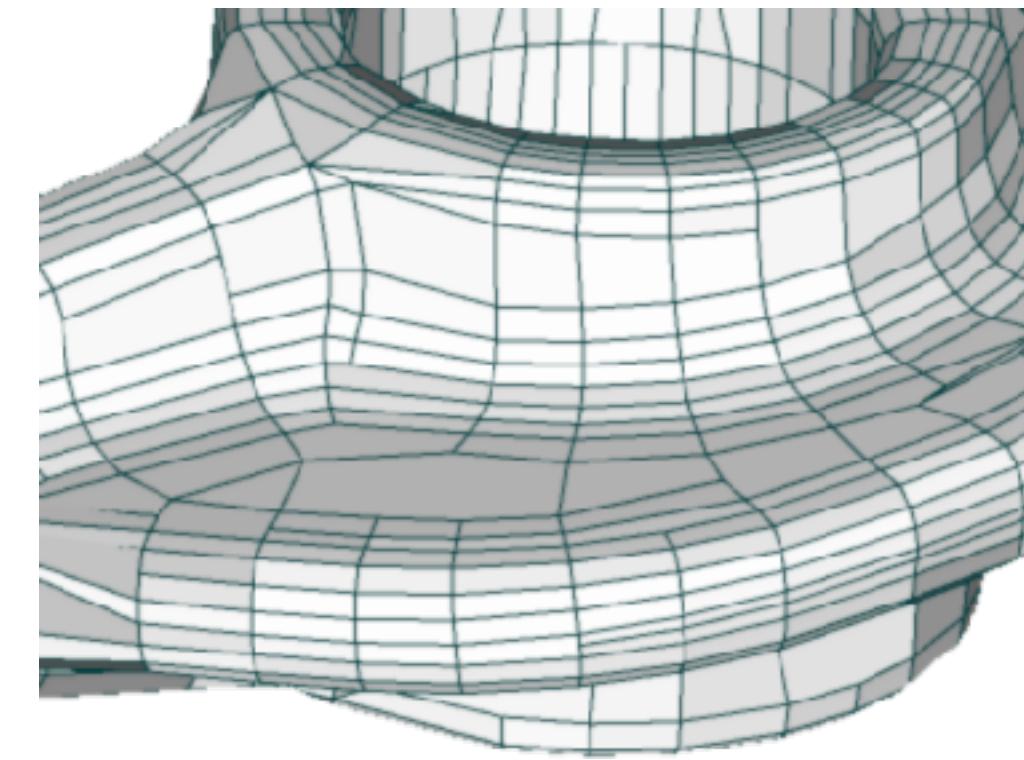
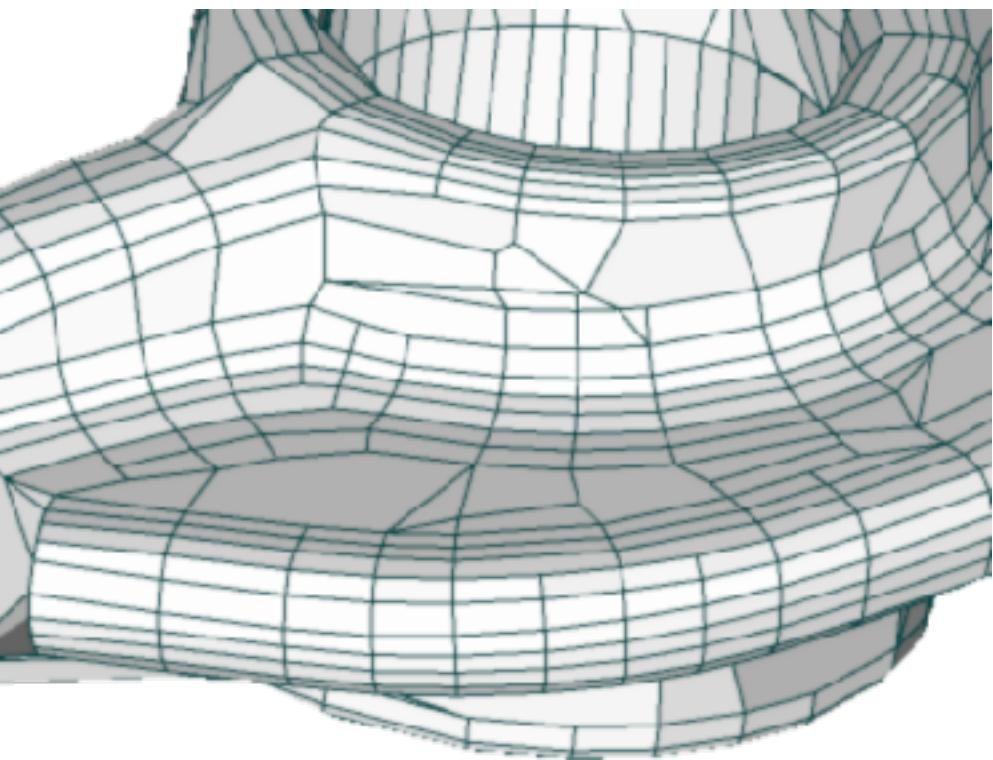
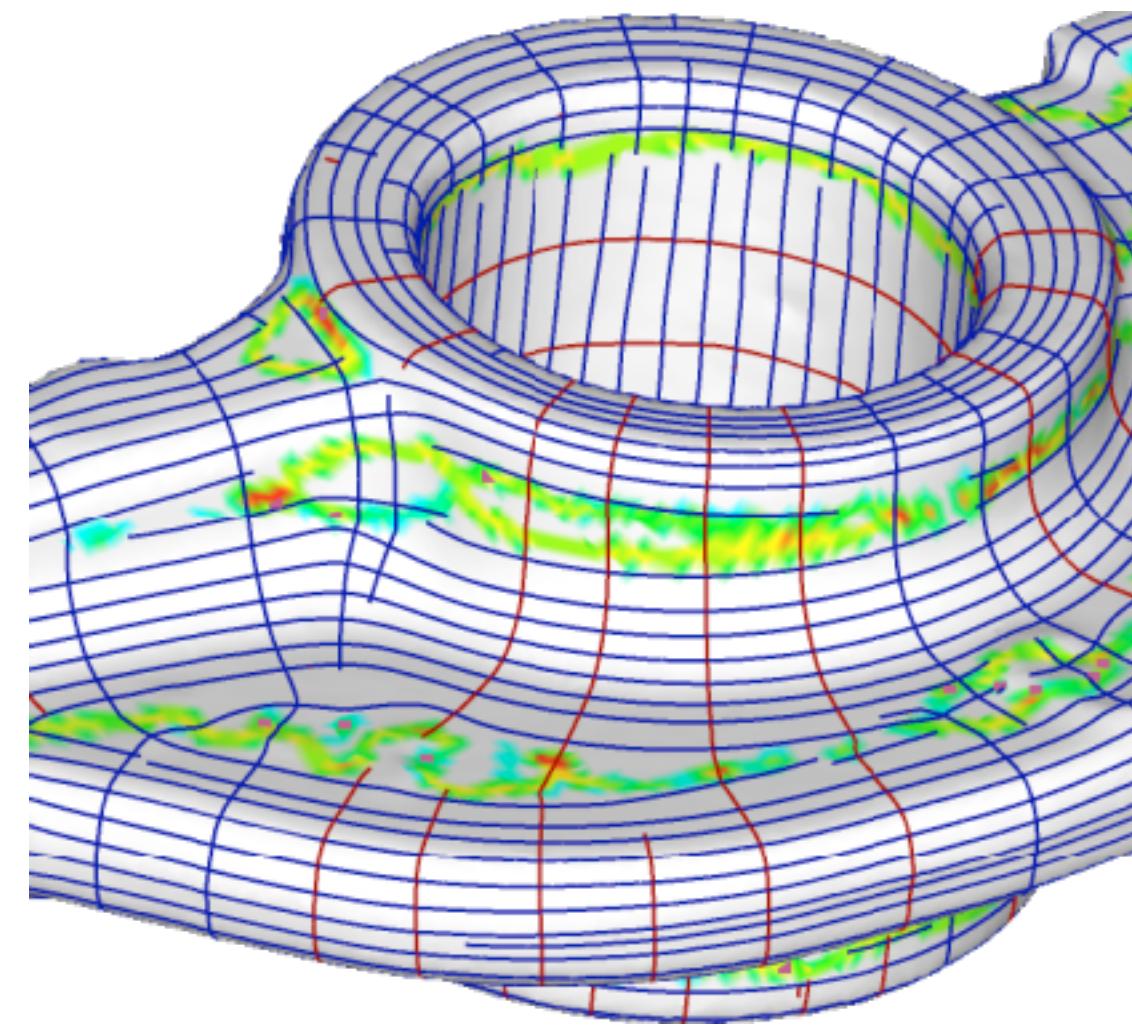
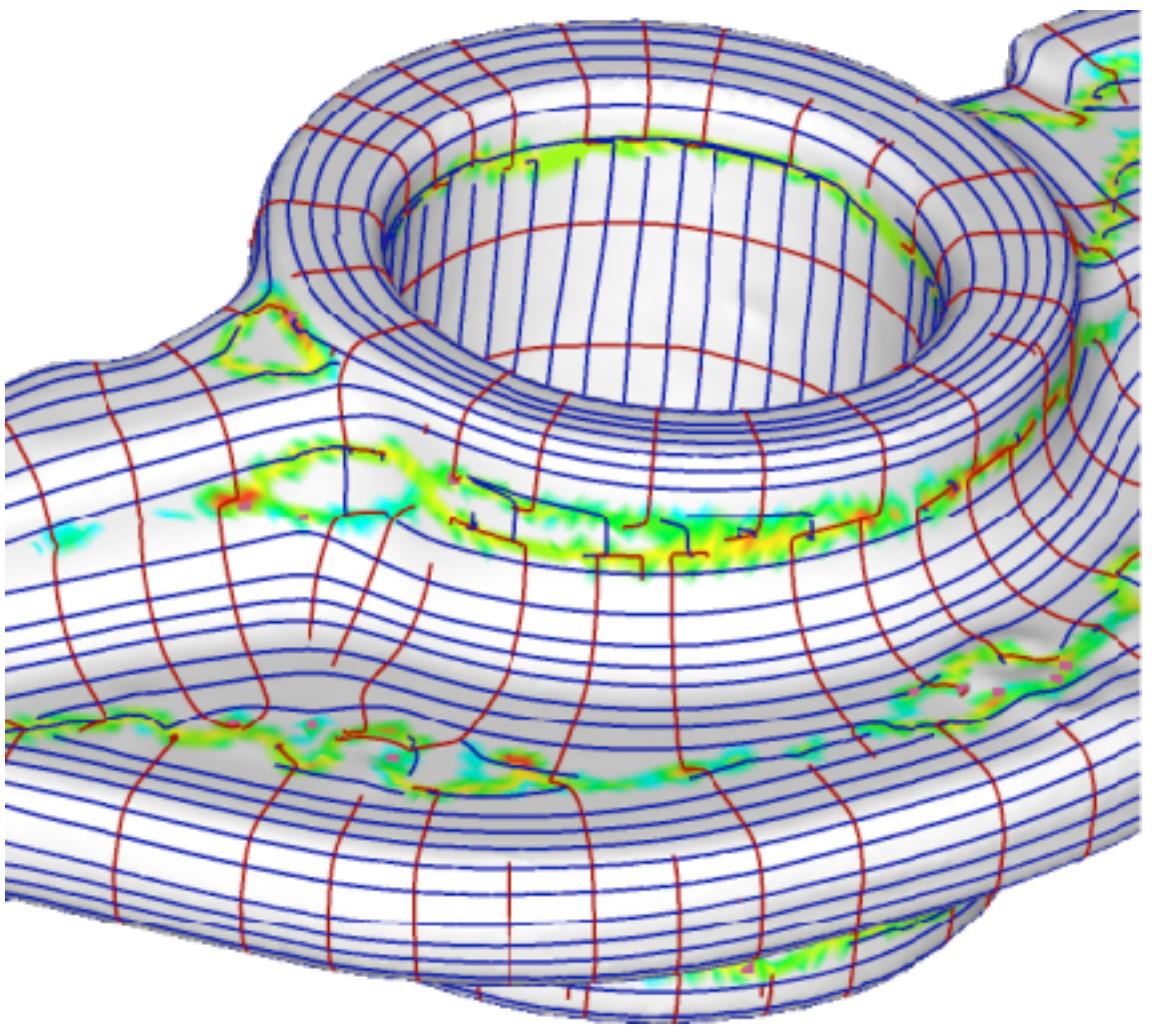
# Curvature Line Integration



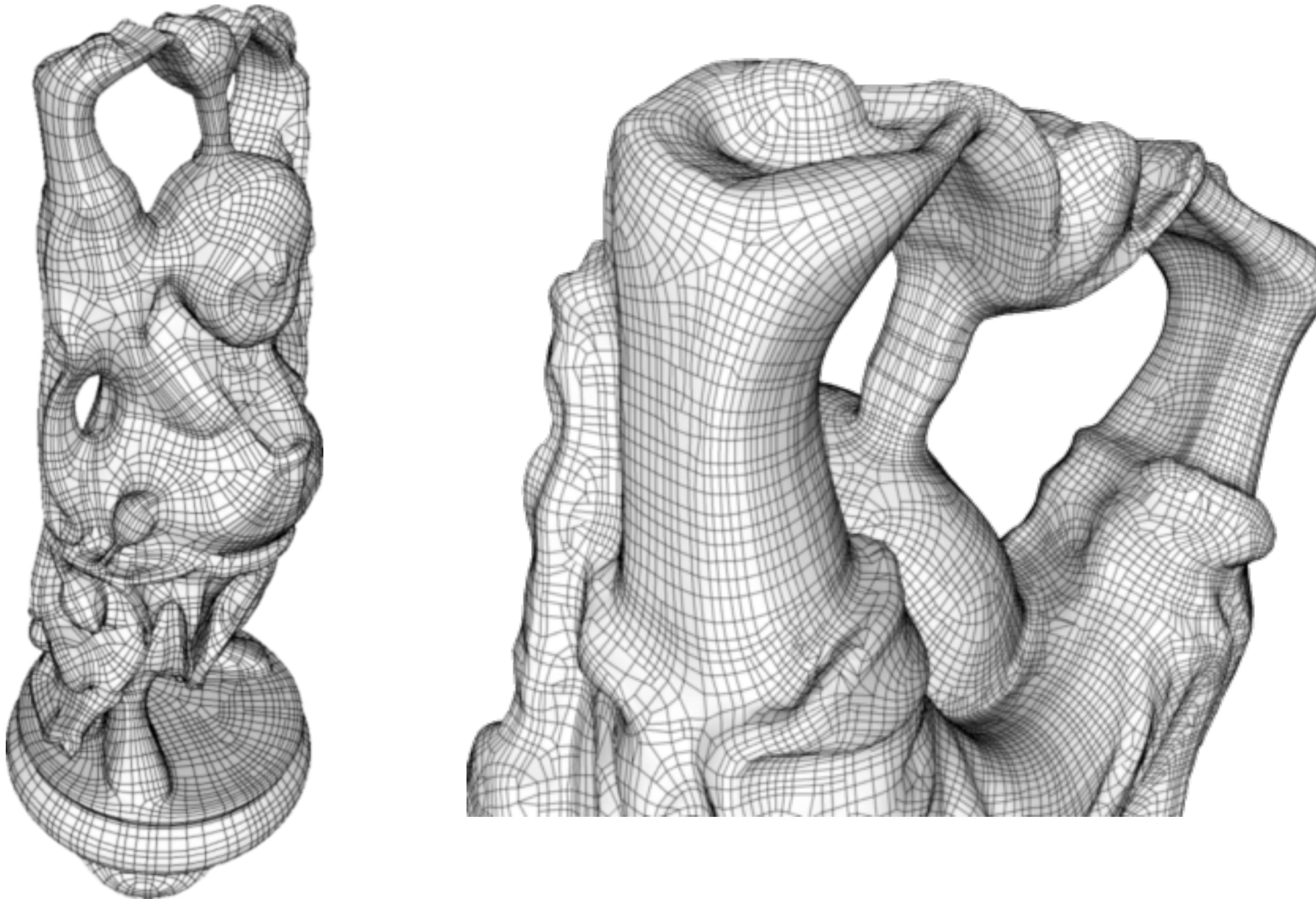
# Meshing



# Confidence Estimation



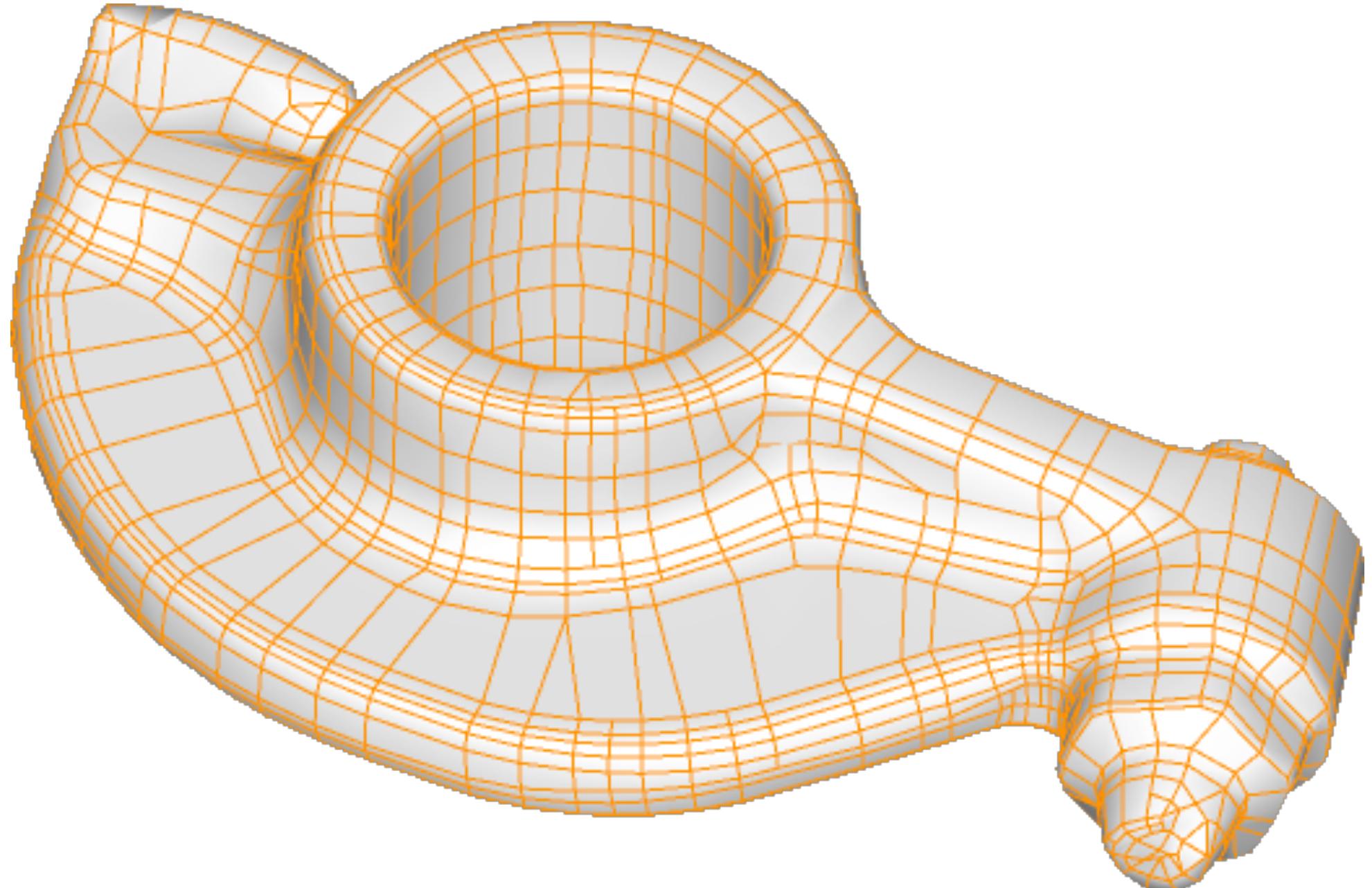
# Quad Dominant Meshing



# CAD Model Remeshing



- Direction propagation into isotropic regions
  - Confidence estimation
  - Line snapping



# Two Fundamental Approaches



- Surface oriented
  - operate directly on the surface
  - treat surface as a set of points / polygons in space
  - efficient for high resolution remeshing
- Parametrization based
  - map to 2D domain / 2D problem
  - computationally more expensive (?)
  - works even for coarse resolution remeshing

# Basic Operators



- Correspondence
  - Global vs. local parameterization
- Vertex density control
  - Uniform vs. adaptive
  - Isotropic vs. anisotropic
- Local alignment
  - Optimal shape approximation
- Global alignment
  - Feature sensitivity

# References



- Alliez et al., “*Interactive geometry remeshing*,” SIGGRAPH 2002.
- Alliez et al., “*Isotropic surface remeshing*,” SMI 2003.
- Alliez et al., “*Anisotropic polygonal remeshing*,” SIGGRAPH 2003.
- Vorsatz et al, “*Dynamic remeshing and applications*,” Solid Modeling 2003.
- Botsch & Kobbelt, “*A remeshing approach to multiresolution modeling*,” Symp. on Geometry Processing 2004.
- Marinov et al., “*Direct anisotropic quad-dominant remeshing*,” Pacific Graphics 2004.
- **Alliez et al., “Recent advances in remeshing of surfaces,” AIM@Shape state of the art report, 2006.**