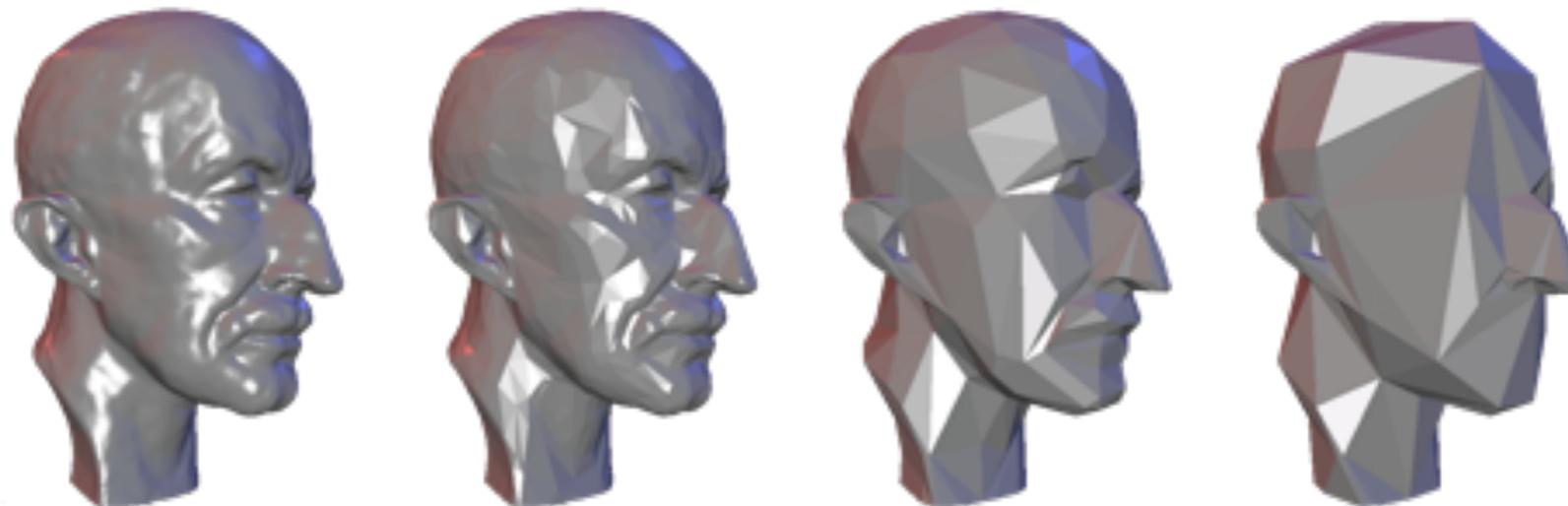


## 8.2 Decimation

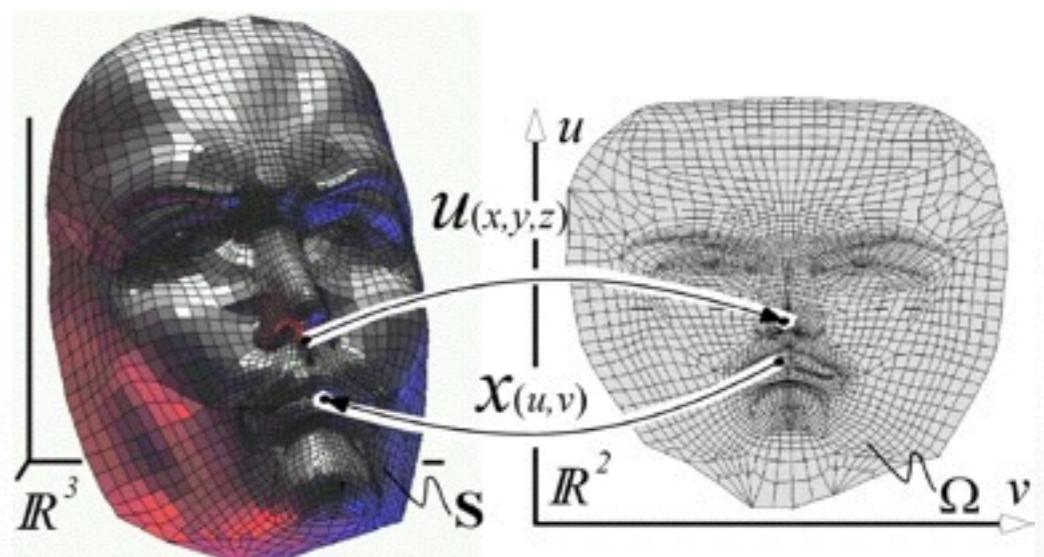


# Last Time

## Parameterization

- isometric       $\mathbf{I}(u, v) = \begin{pmatrix} 1 & 0 \\ 0 & 1 \end{pmatrix}$
- conformal       $\mathbf{I}(u, v) = s(u, v) \cdot \begin{pmatrix} 1 & 0 \\ 0 & 1 \end{pmatrix}$
- equiareal       $\det(\mathbf{I}(u, v)) = 1$

$$\mathbf{I} = \begin{pmatrix} \mathbf{x}_u^T \mathbf{x}_u & \mathbf{x}_u^T \mathbf{x}_v \\ \mathbf{x}_v^T \mathbf{x}_u & \mathbf{x}_v^T \mathbf{x}_v \end{pmatrix}$$

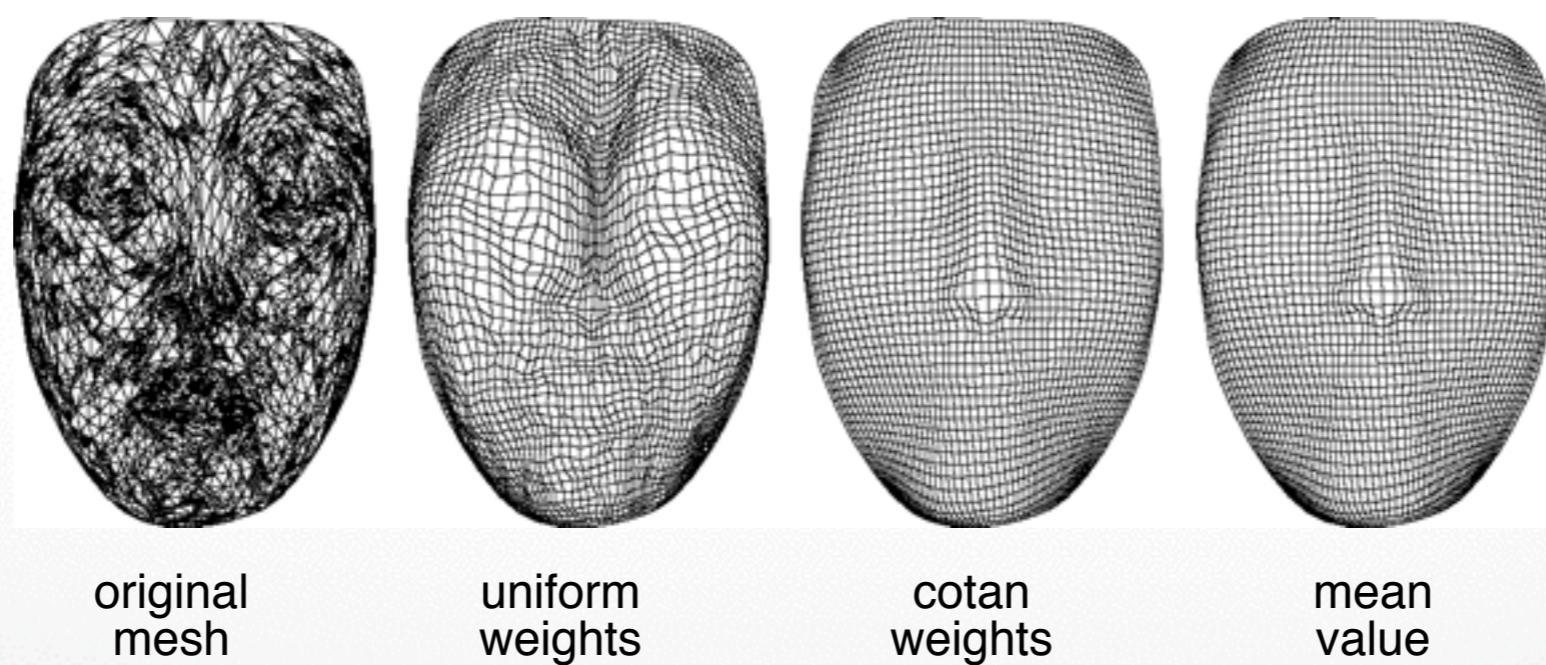


## Harmonic Maps

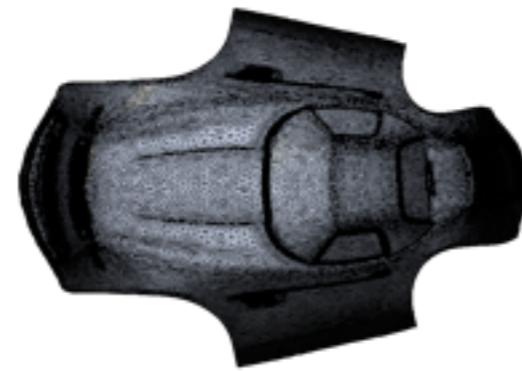
- minimize Dirichlet energy:  $\int_{\Omega} \|\nabla \mathbf{x}\|^2 = \int_{\Omega} \|\mathbf{x}_u\|^2 + \|\mathbf{x}_v\|^2 \, du \, dv$
- Euler-Lagrange PDE  $\Delta \mathbf{x}(u, v) = 0$

## Discrete Harmonic Maps

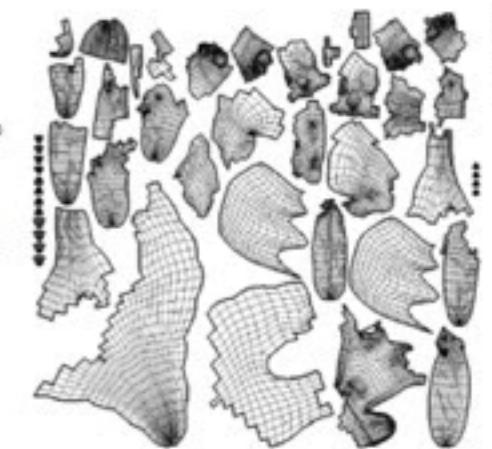
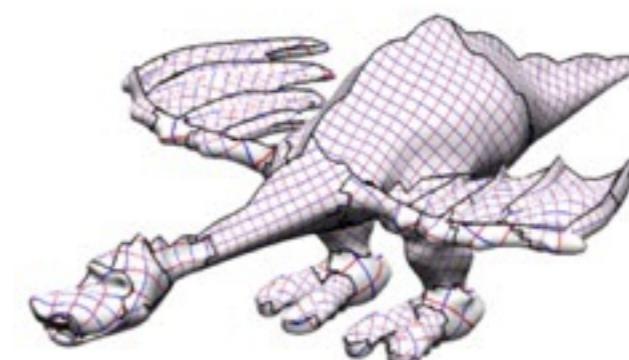
## Convex Combination Maps



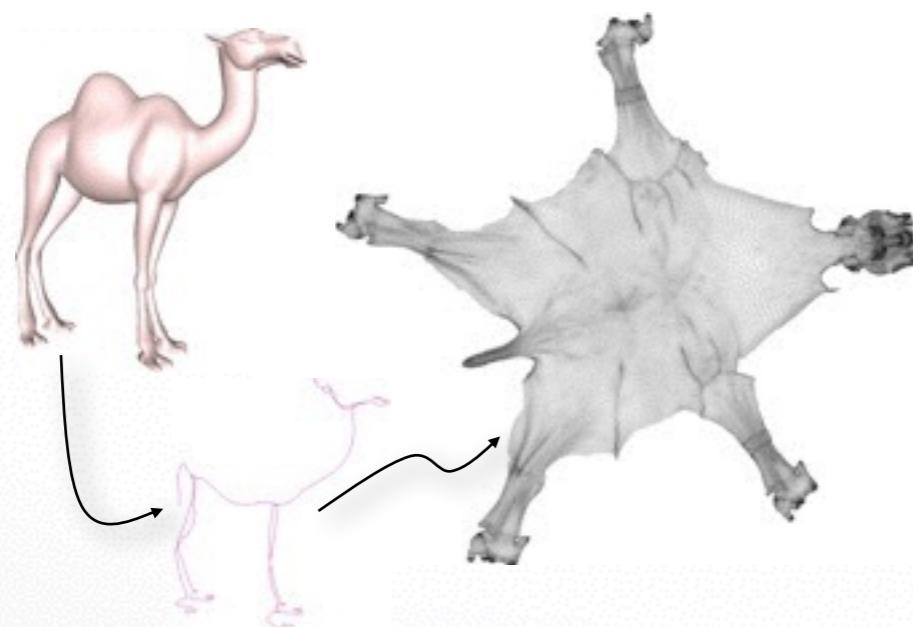
# Last Time



fixed vs. open boundaries



texture atlases



cutting the mesh → disk topology

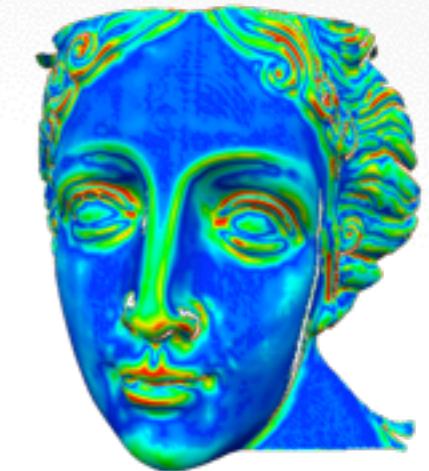
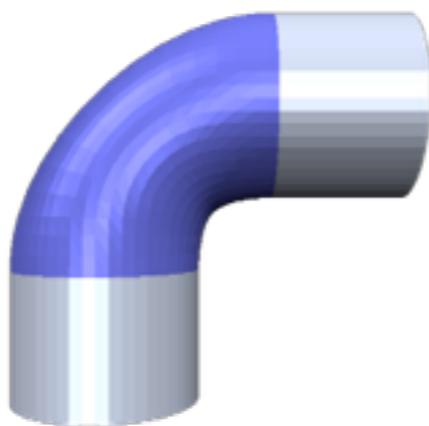


constrained parameterization

# Mesh Optimization

## Smoothing

- Low geometric noise

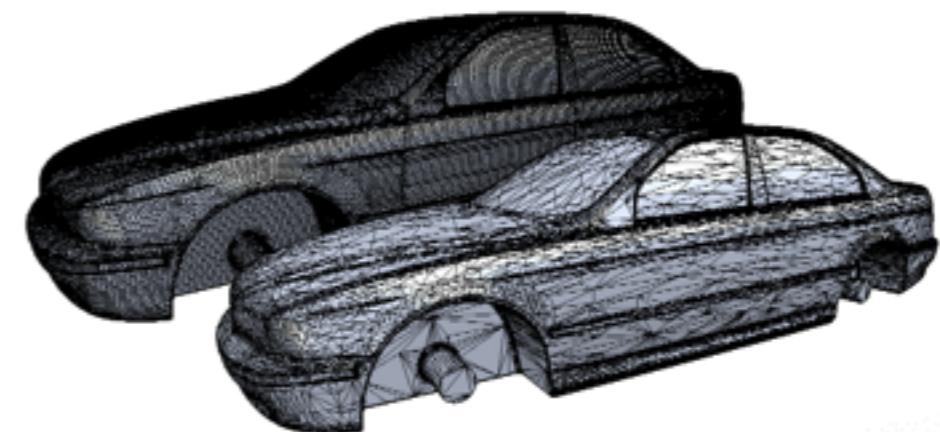


## Fairing

- Simplest shape

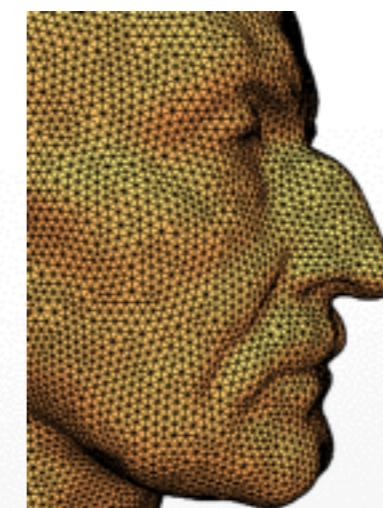
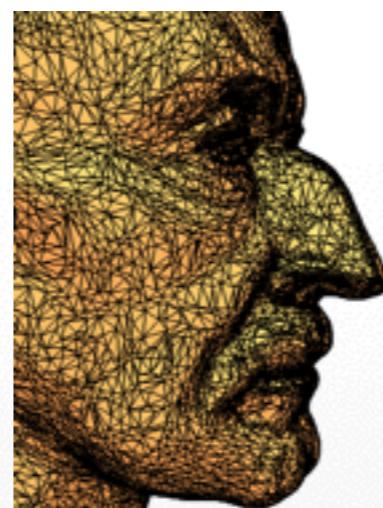
## Decimation

- Low complexity



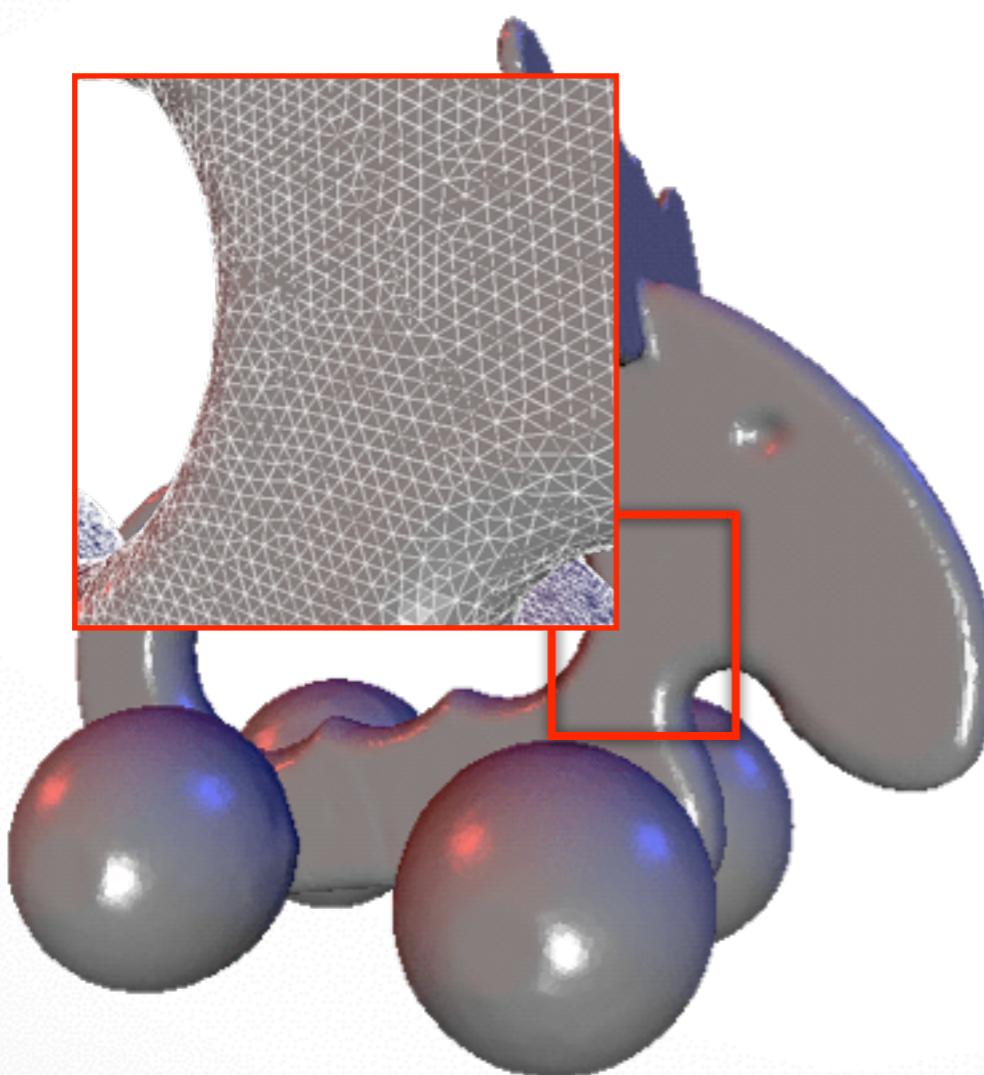
## Remeshing

- Triangle Shape

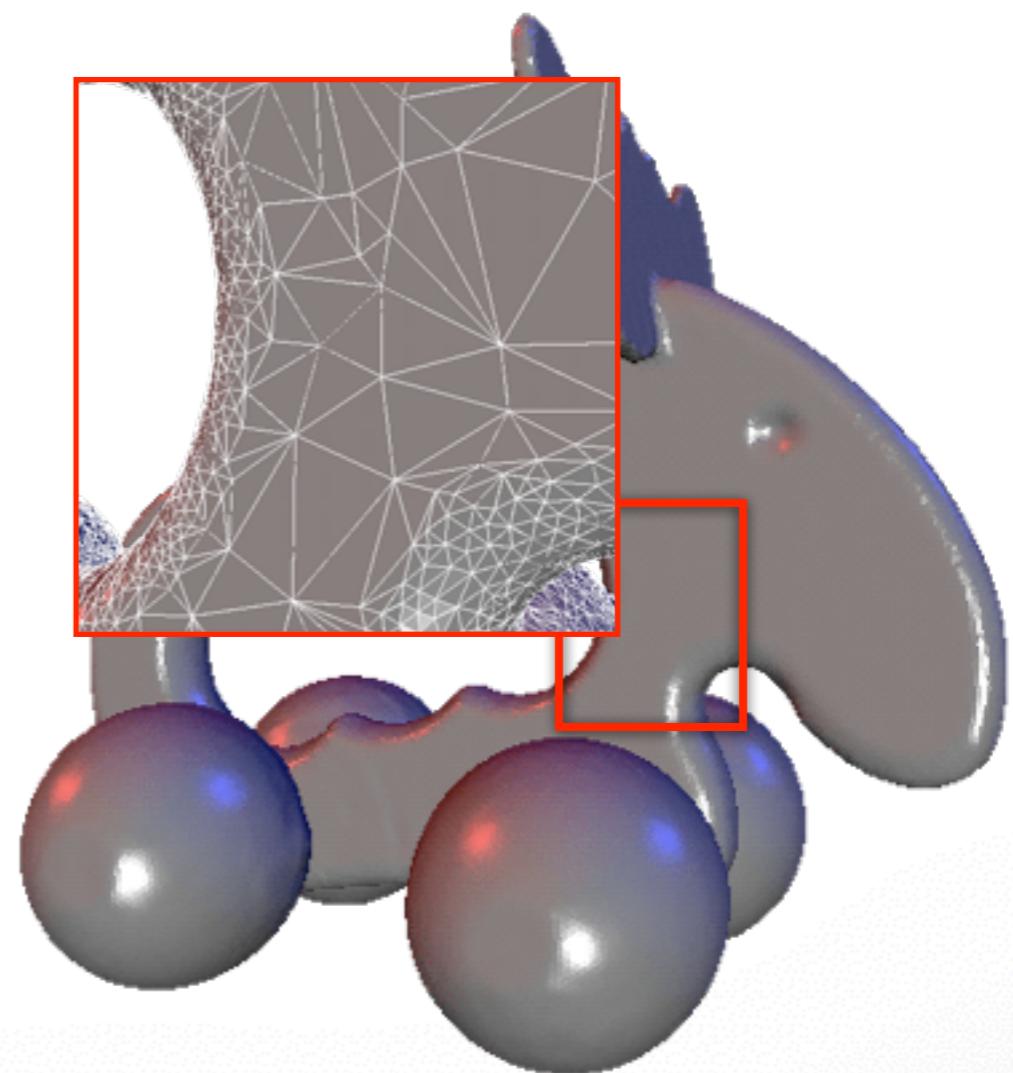


# Mesh Decimation

## Oversampled 3D scan data



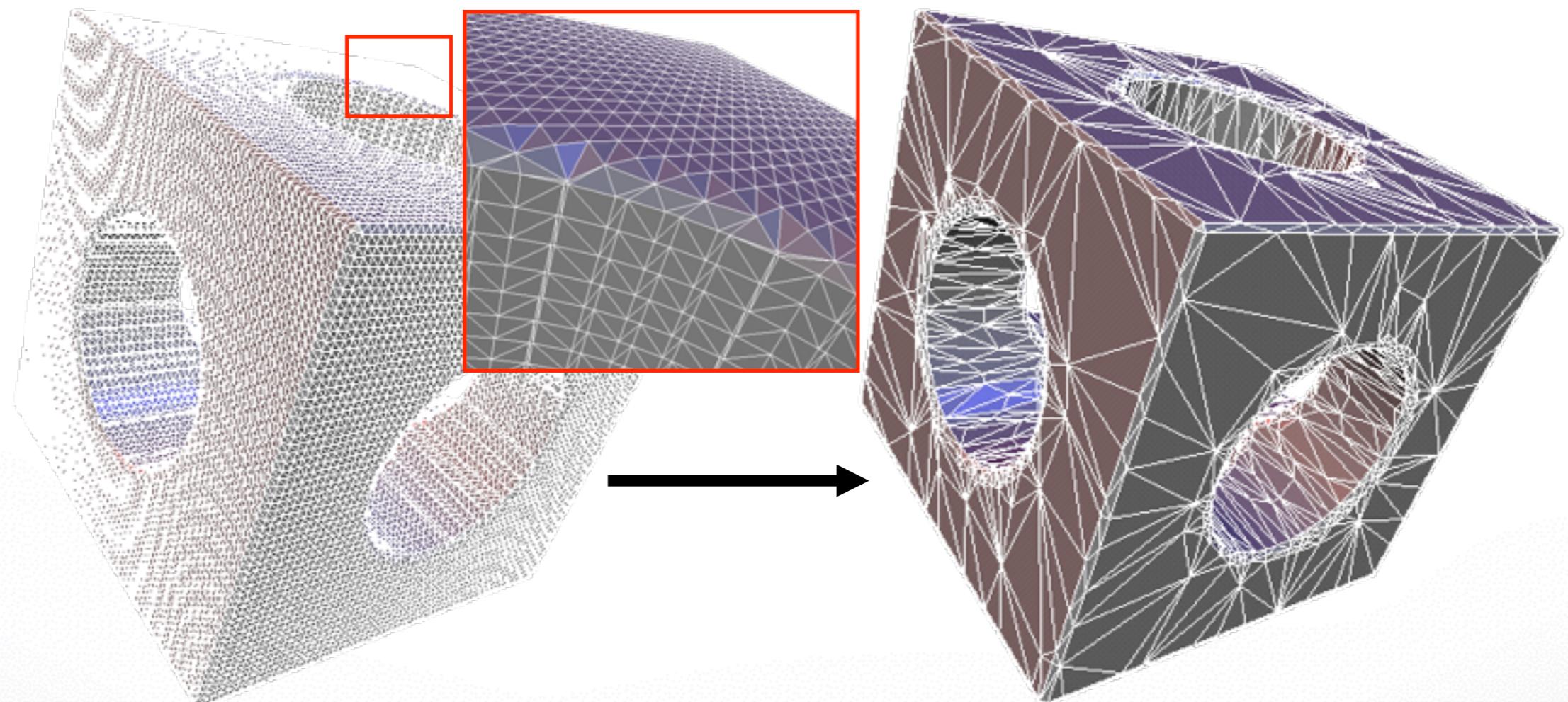
~150k triangles



~80k triangles

# Mesh Decimation

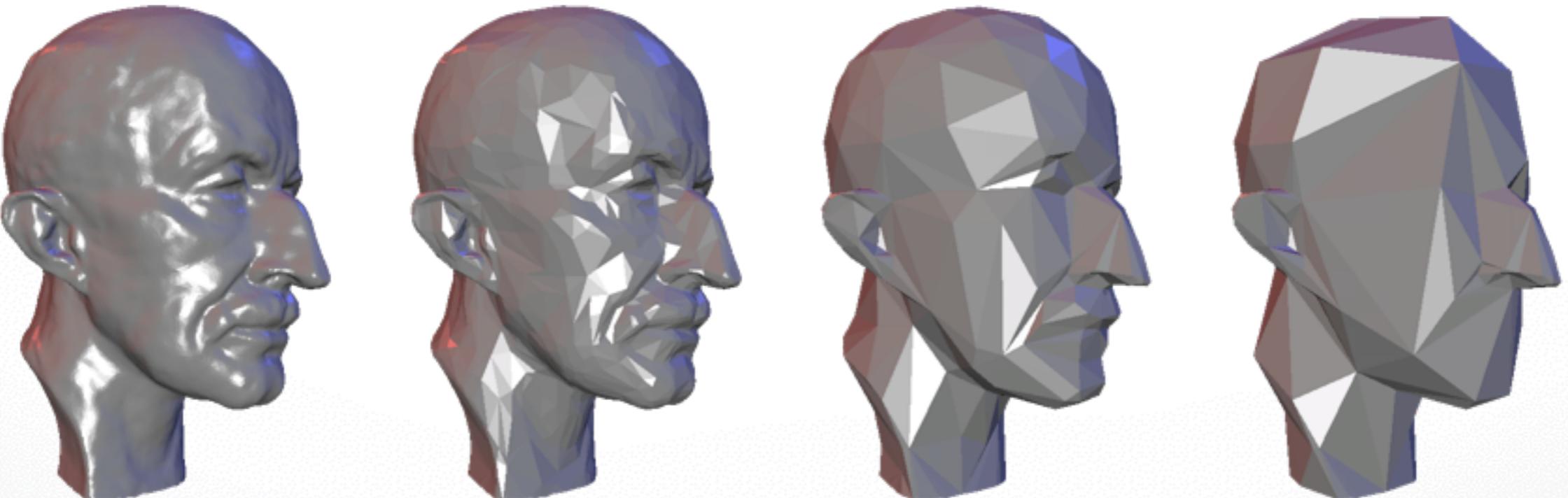
Over tessellation: e.g., Iso-surface extraction



# Mesh Decimation

## Multi-resolution hierarchies for

- efficient geometry processing
- level-of-detail (LOD) rendering



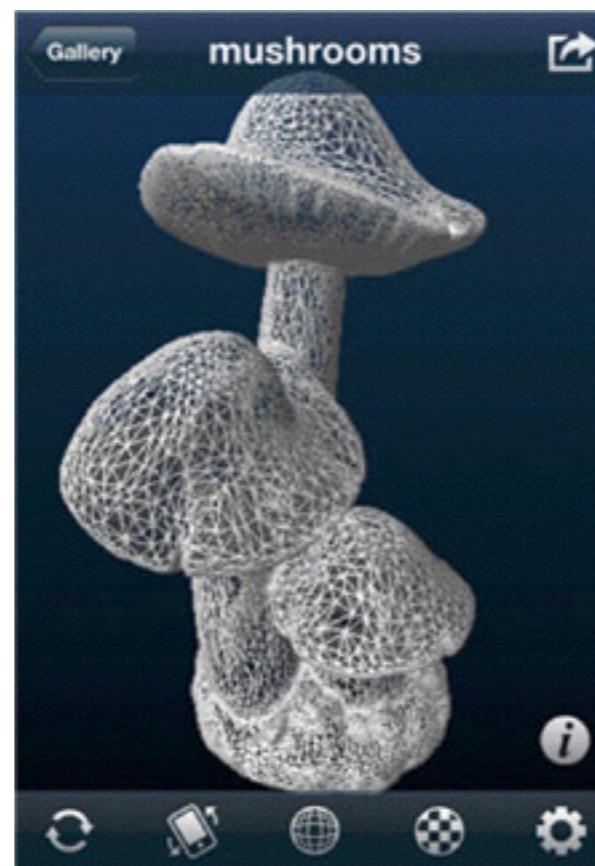
# Mesh Decimation

Adaptation to hardware capabilities

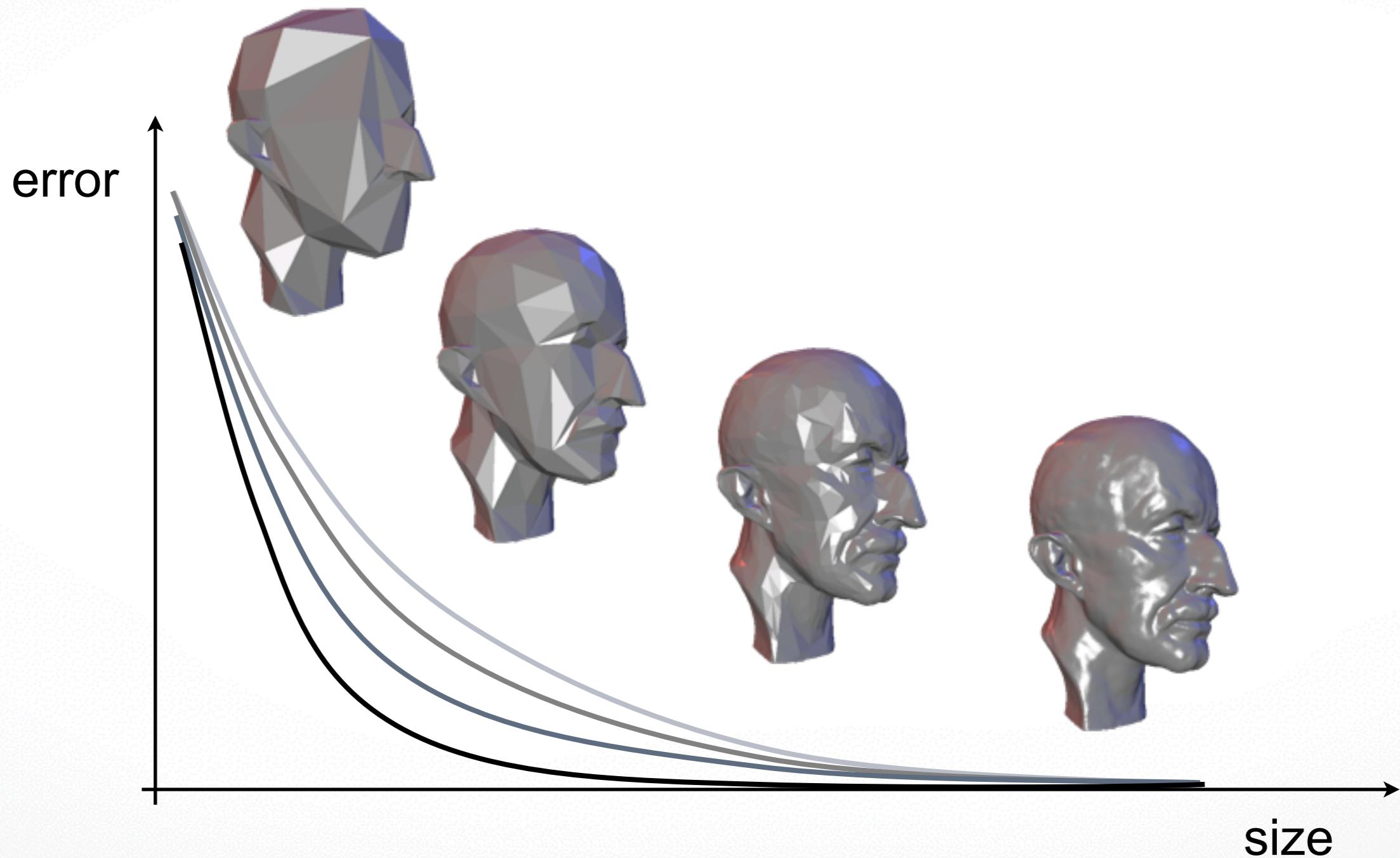


# Mesh Decimation

Adaptation to hardware capabilities



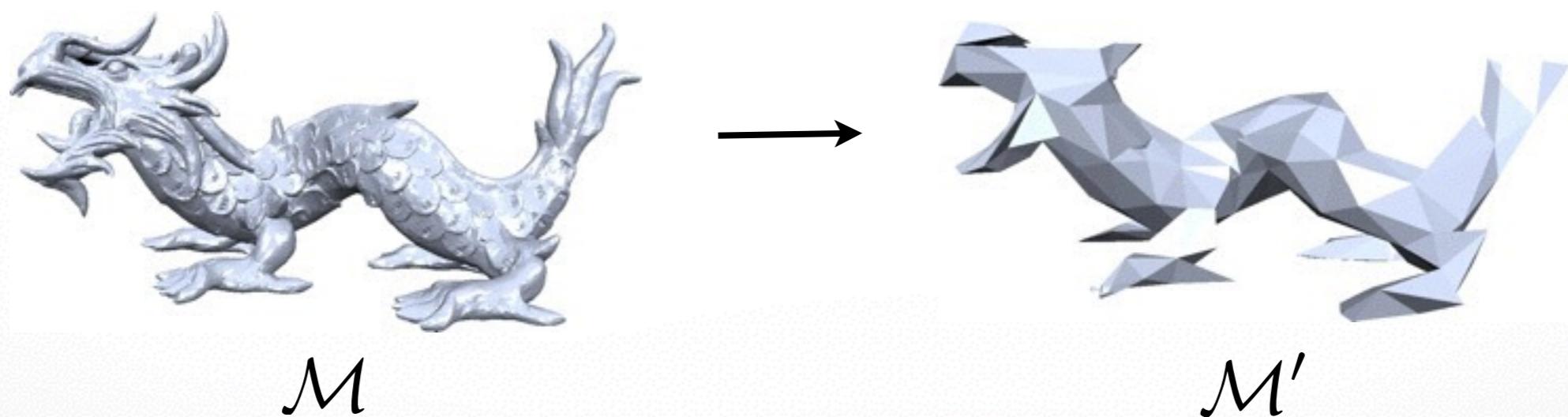
# Size-Quality Tradeoff



# Problem Statement

**Given  $\mathcal{M} = (\mathcal{V}, \mathcal{F})$ , find  $\mathcal{M}' = (\mathcal{V}', \mathcal{F}')$  such that**

- $|\mathcal{V}'| = n < |\mathcal{V}|$  and  $\|\mathcal{M} - \mathcal{M}'\|$  is minimal, or
- $\|\mathcal{M} - \mathcal{M}'\| < \epsilon$  and  $|\mathcal{V}'|$  is minimal



# Problem Statement

**Given  $\mathcal{M} = (\mathcal{V}, \mathcal{F})$ , find  $\mathcal{M}' = (\mathcal{V}', \mathcal{F}')$  such that**

- $|\mathcal{V}'| = n < |\mathcal{V}|$  and  $\|\mathcal{M} - \mathcal{M}'\|$  is minimal, or
- $\|\mathcal{M} - \mathcal{M}'\| < \epsilon$  and  $|\mathcal{V}'|$  is minimal

**NP hard**

- Look for sub-optimal solution

**Respect additional fairness criteria**

- Normal deviation, triangle shape, colors, ...

# Outline

## Mesh Decimation methods

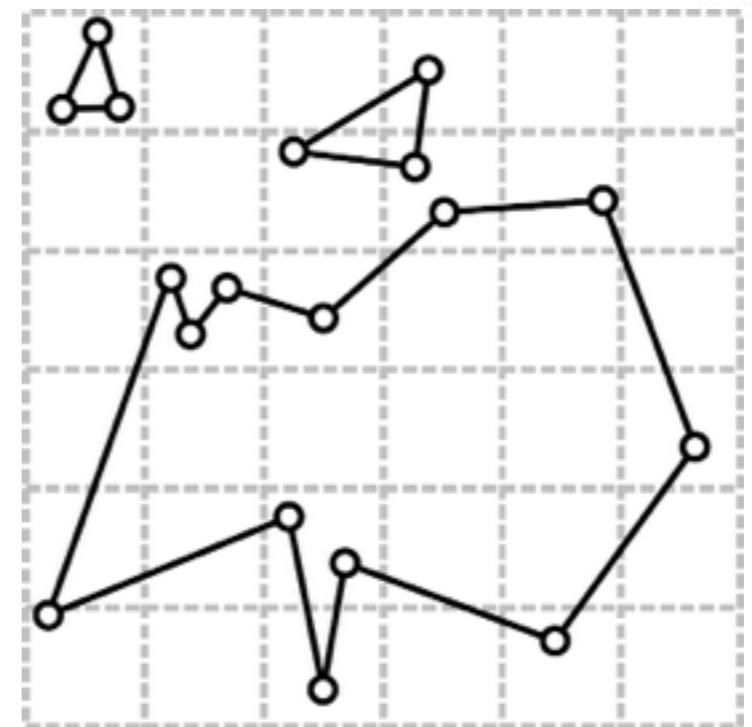
- **Vertex Clustering**
- Iterative Decimation

# Vertex Clustering

- Cluster Generation
- Computing a representative
- Mesh generation
- Topology changes

# Vertex Clustering

- **Cluster Generation**
  - Uniform 3D grid
  - Map vertices to cluster cells
- Computing a representative
- Mesh generation
- Topology changes



# Vertex Clustering

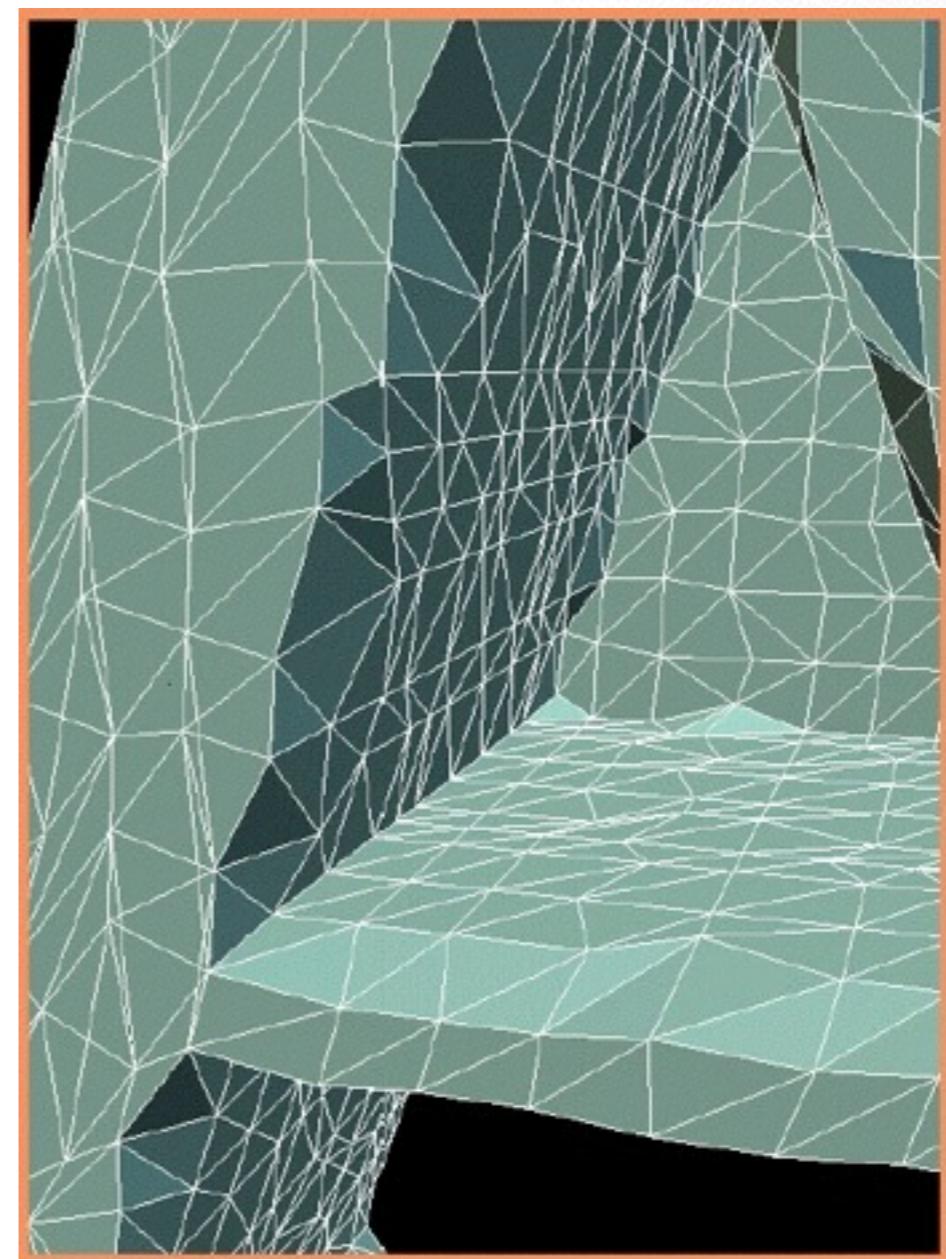
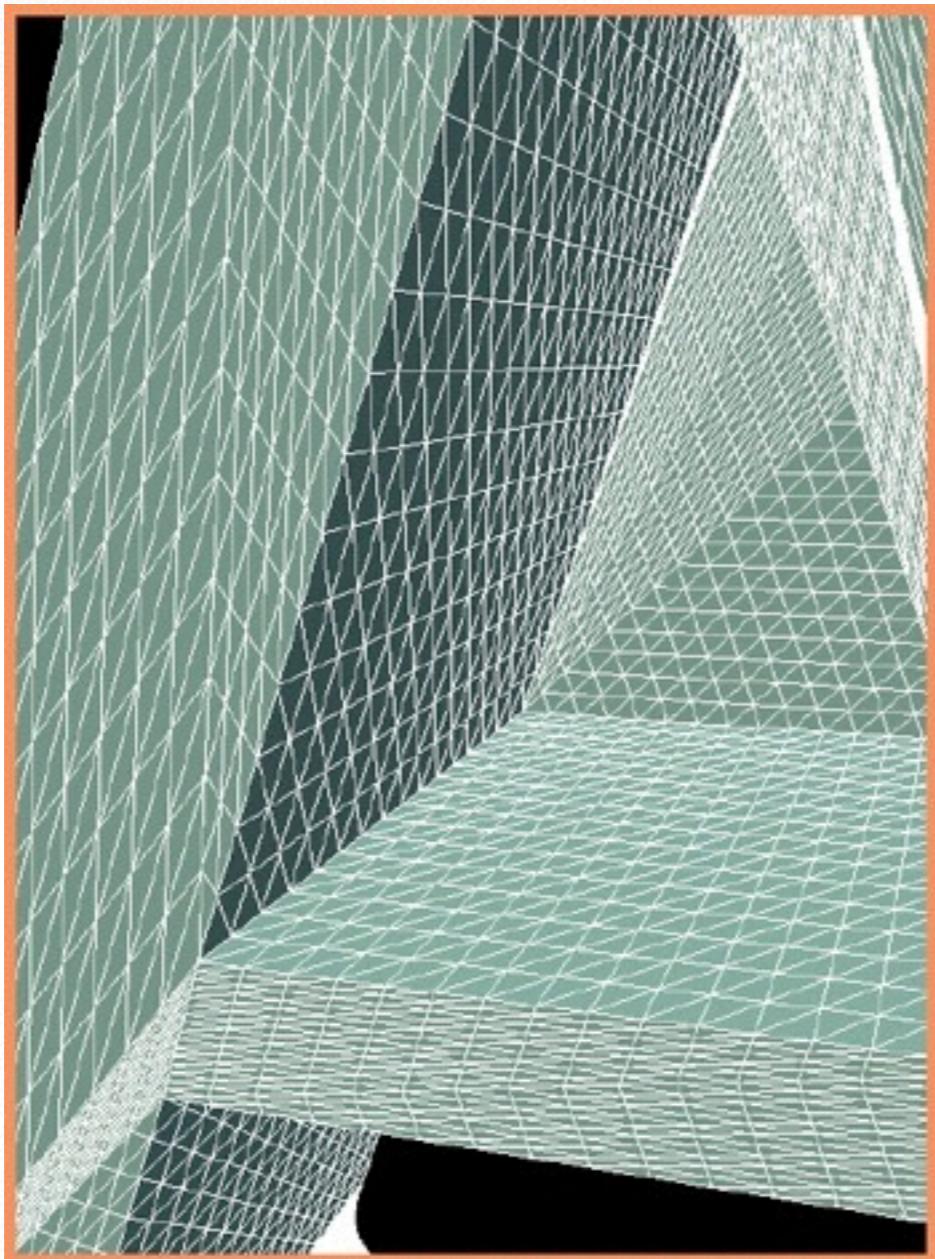
- **Cluster Generation**
  - Hierarchical approach
  - Top-down or bottom-up
- Computing a representative
- Mesh generation
- Topology changes



# Vertex Clustering

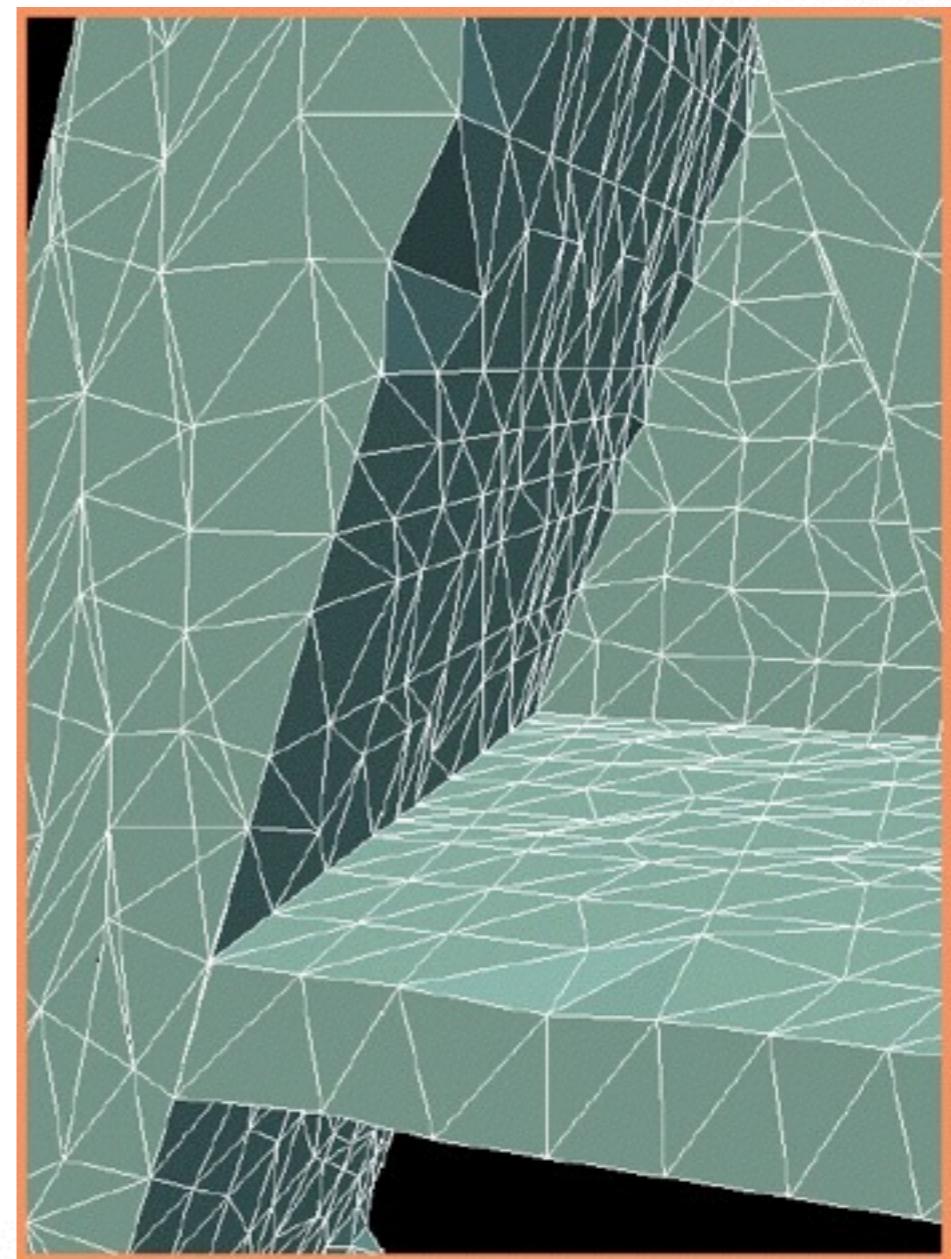
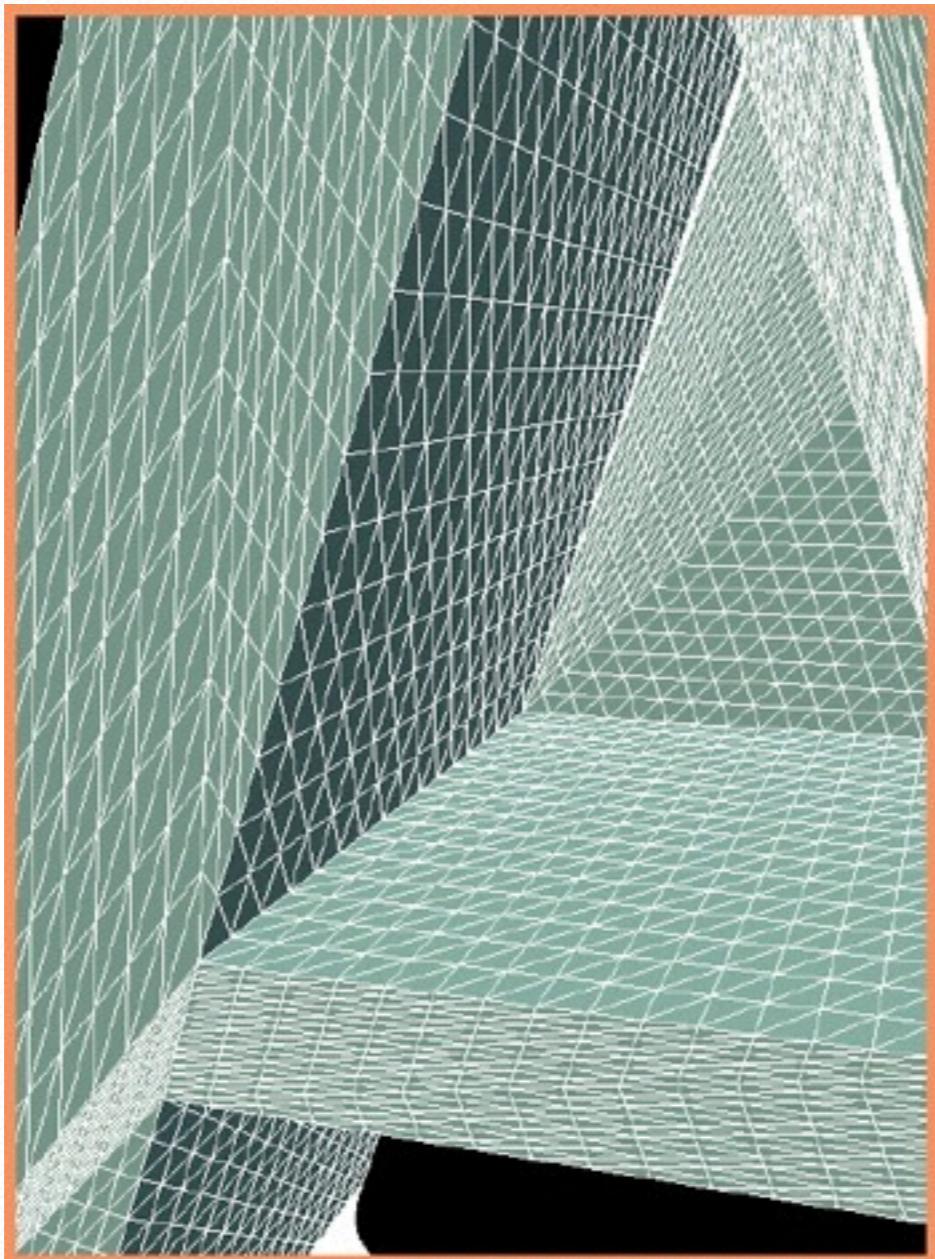
- Cluster Generation
- **Computing a representative**
  - Average/median vertex position
  - Error quadrics
- Mesh generation
- Topology changes

# Computing a Representative



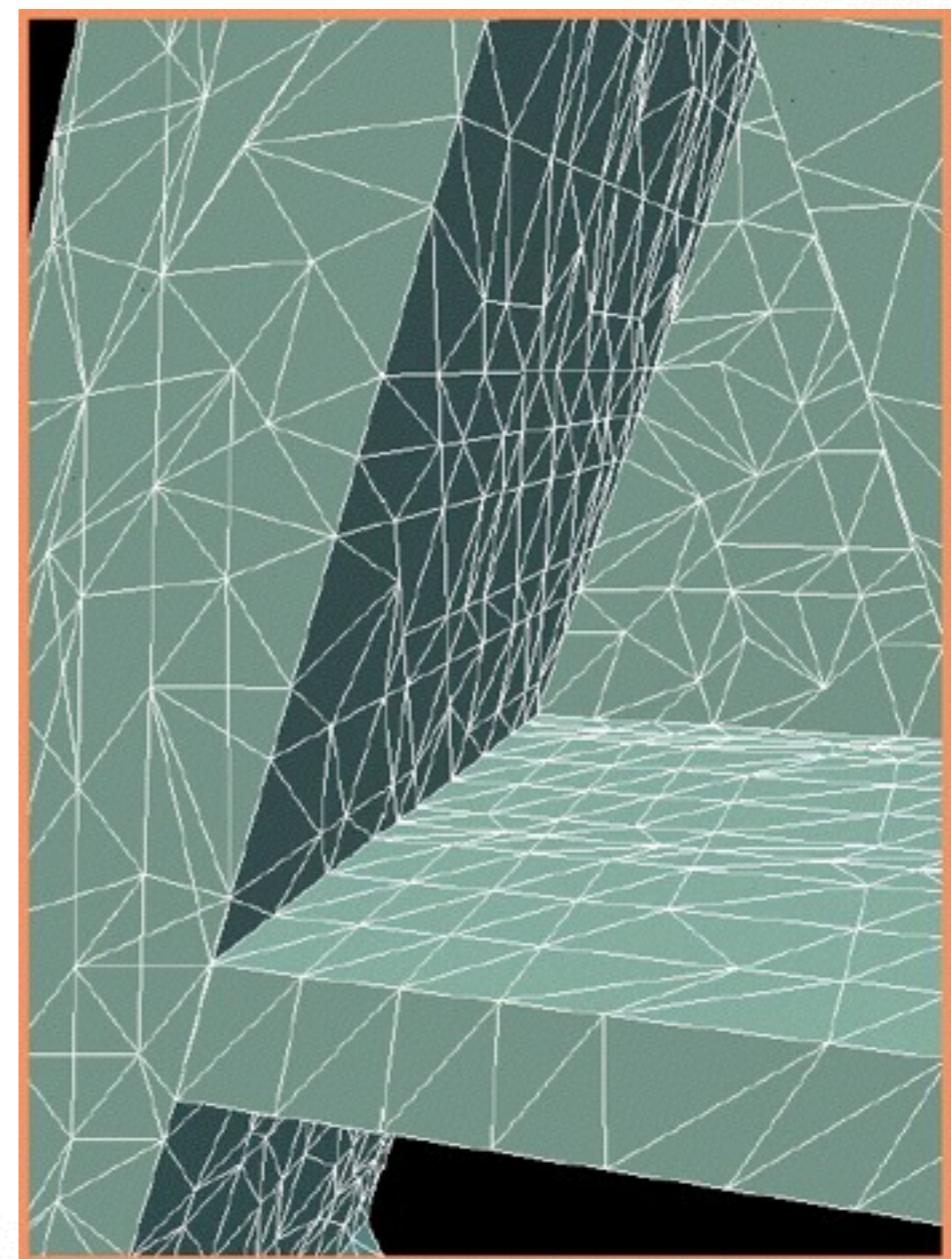
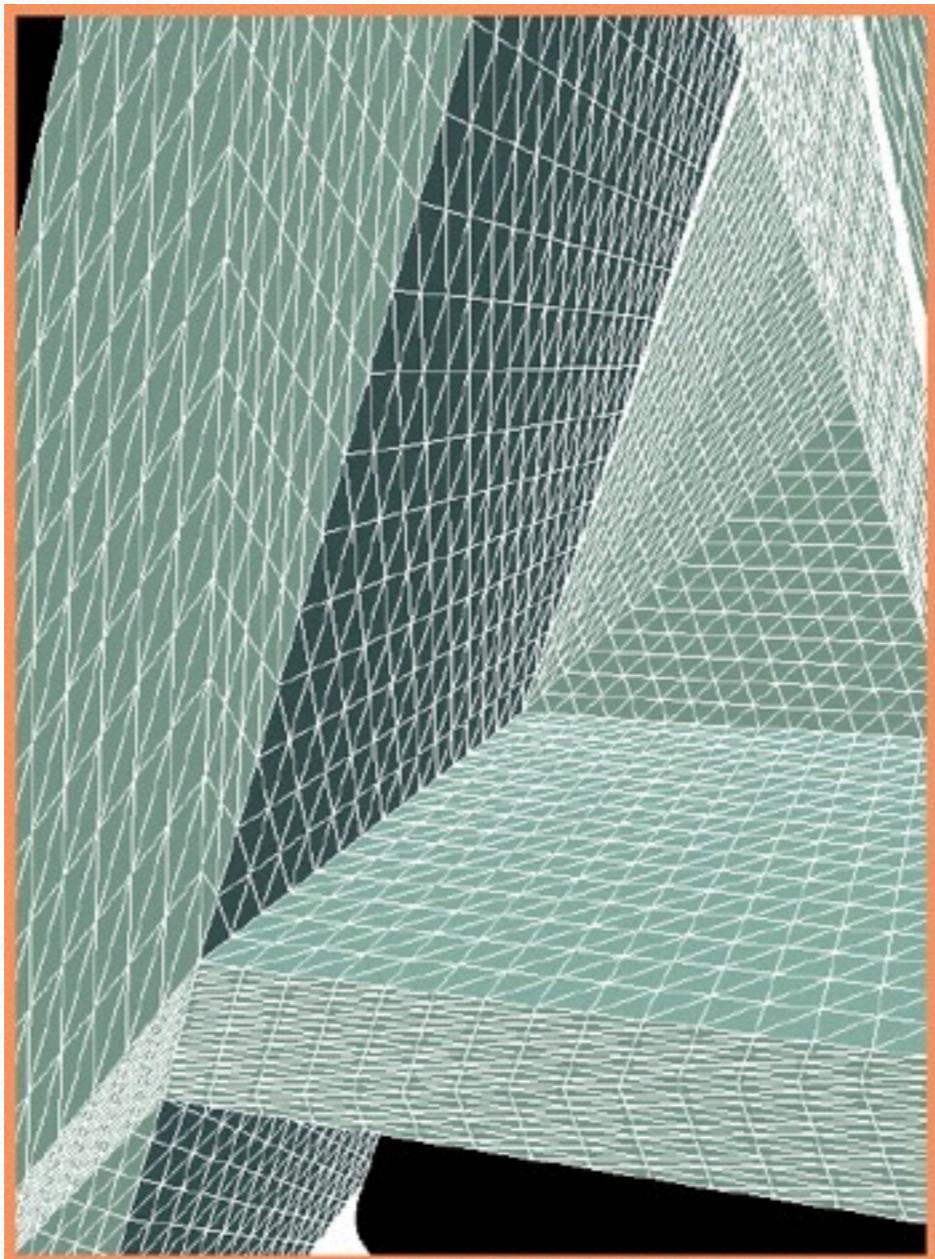
average vertex position → low pass filter

# Computing a Representative



median vertex position → sub-sampling

# Computing a Representative



error quadrics → feature preservation

# Error Quadrics

## Squared distance to plane

$$\mathbf{p} = (x, y, z, 1)^T, \quad \mathbf{q} = (a, b, c, d)^T$$

$$\text{dist}(\mathbf{q}, \mathbf{p})^2 = (\mathbf{q}^T \mathbf{p})^2 = \mathbf{p}^T (\mathbf{q} \mathbf{q}^T) \mathbf{p} =: \mathbf{p}^T \mathbf{Q}_\mathbf{q} \mathbf{p}$$

# Error Quadrics

## Squared distance to plane

$$\mathbf{p} = (x, y, z, 1)^T, \quad \mathbf{q} = (a, b, c, d)^T$$

$$\text{dist}(\mathbf{q}, \mathbf{p})^2 = (\mathbf{q}^T \mathbf{p})^2 = \mathbf{p}^T (\mathbf{q} \mathbf{q}^T) \mathbf{p} =: \mathbf{p}^T \mathbf{Q}_{\mathbf{q}} \mathbf{p}$$

$$\mathbf{Q}_{\mathbf{q}} = \begin{bmatrix} a^2 & ab & ac & ad \\ ab & b^2 & bc & bd \\ ac & bc & c^2 & cd \\ ad & bd & cd & d^2 \end{bmatrix}$$

# Error Quadrics

**Sum of distances to vertex planes**

$$\sum_i \text{dist}(\mathbf{q}_i, \mathbf{p})^2 =$$

# Error Quadrics

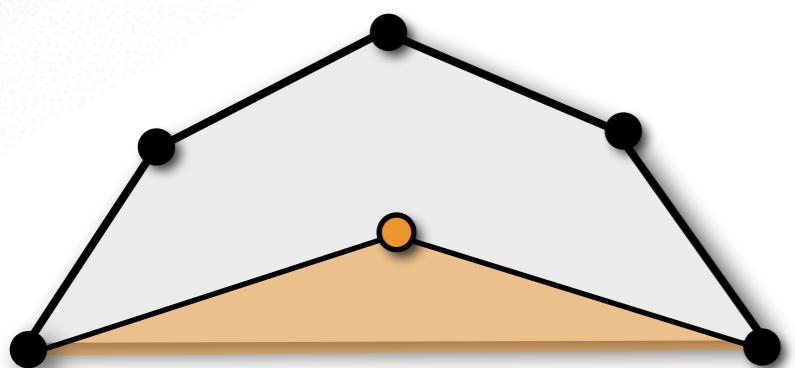
**Sum of distances to vertex planes**

$$\sum_i \text{dist}(\mathbf{q}_i, \mathbf{p})^2 = \sum_i \mathbf{p}^T \mathbf{Q}_{\mathbf{q}_i} \mathbf{p} = \mathbf{p}^T \left( \sum_i \mathbf{Q}_{\mathbf{q}_i} \right) \mathbf{p} =: \mathbf{p}^T \mathbf{Q}_{\mathbf{p}} \mathbf{p}$$

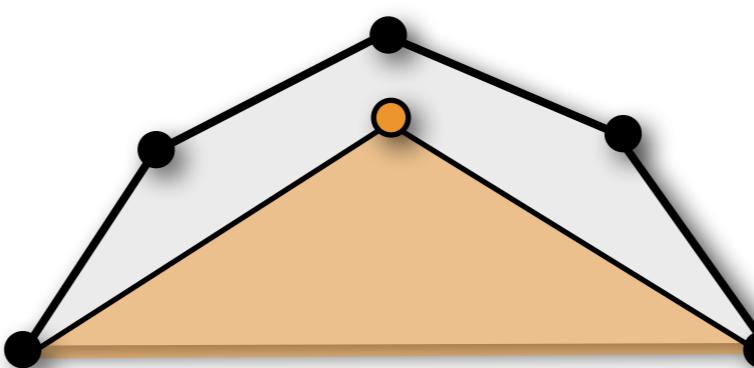
**Point that minimizes the error**

$$\begin{bmatrix} q_{11} & q_{12} & q_{13} & q_{14} \\ q_{21} & q_{22} & q_{23} & q_{24} \\ q_{31} & q_{32} & q_{33} & q_{34} \\ 0 & 0 & 0 & 1 \end{bmatrix} \mathbf{p}^* = \begin{bmatrix} 0 \\ 0 \\ 0 \\ 1 \end{bmatrix}$$

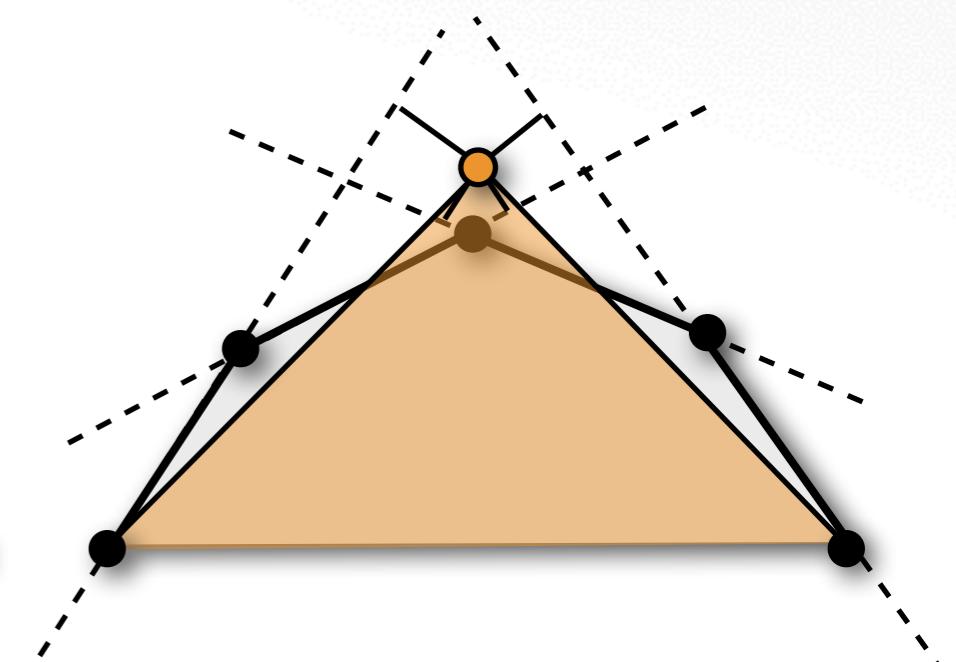
# Comparison



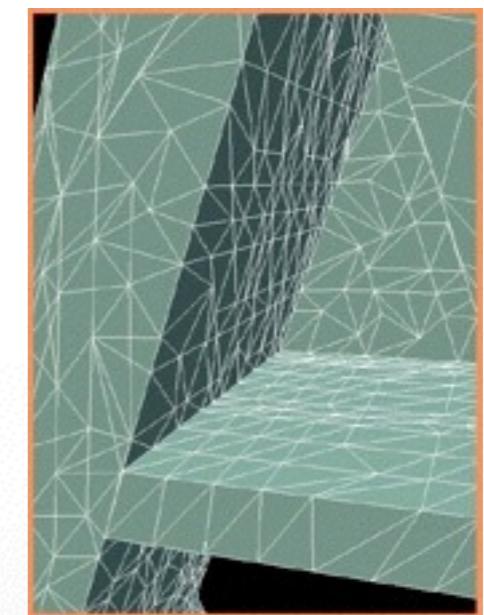
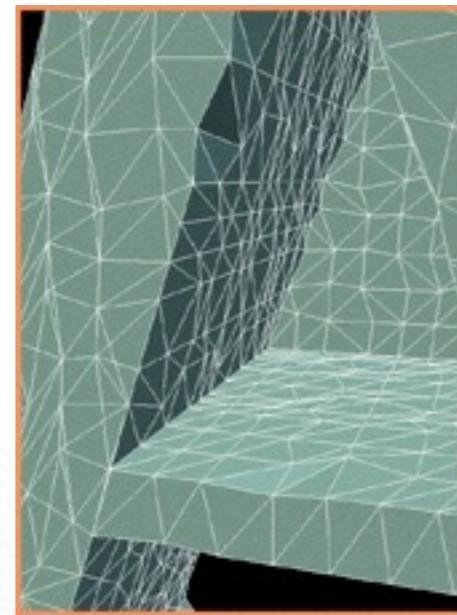
average



median



error quadric

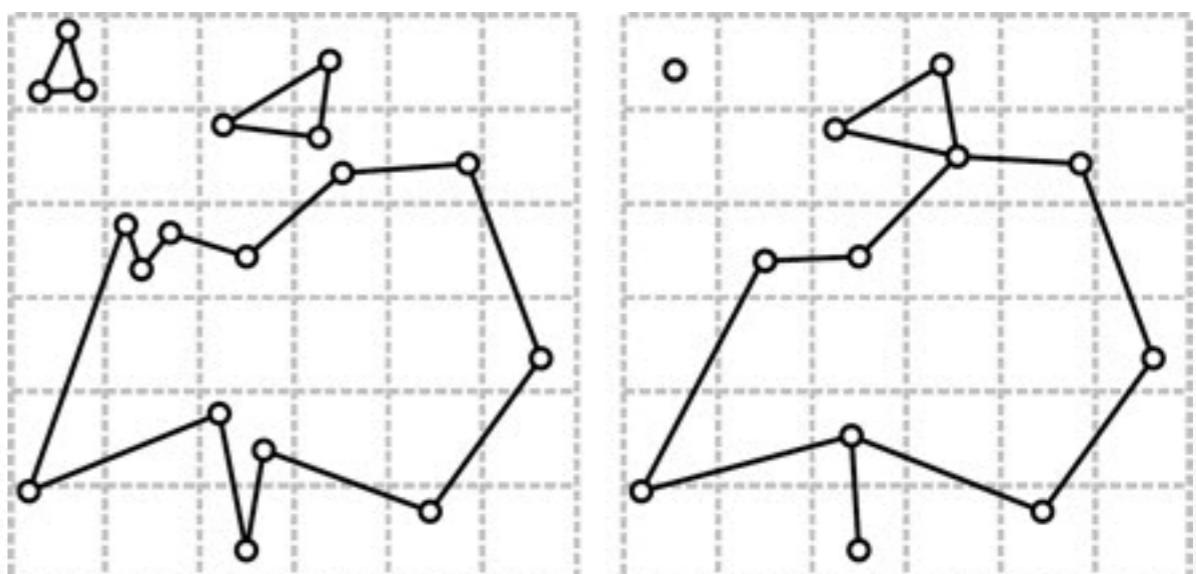


# Vertex Clustering

- Cluster Generation
- Computing a representative
- **Mesh generation**
  - Clusters  $\mathbf{p} \Leftrightarrow \{\mathbf{p}_0, \dots, \mathbf{p}_n\}$ ,  $\mathbf{q} \Leftrightarrow \{\mathbf{q}_0, \dots, \mathbf{q}_n\}$
  - Connect  $(\mathbf{p}, \mathbf{q})$  if there was an edge  $(\mathbf{p}_i, \mathbf{q}_j)$
- Topology changes

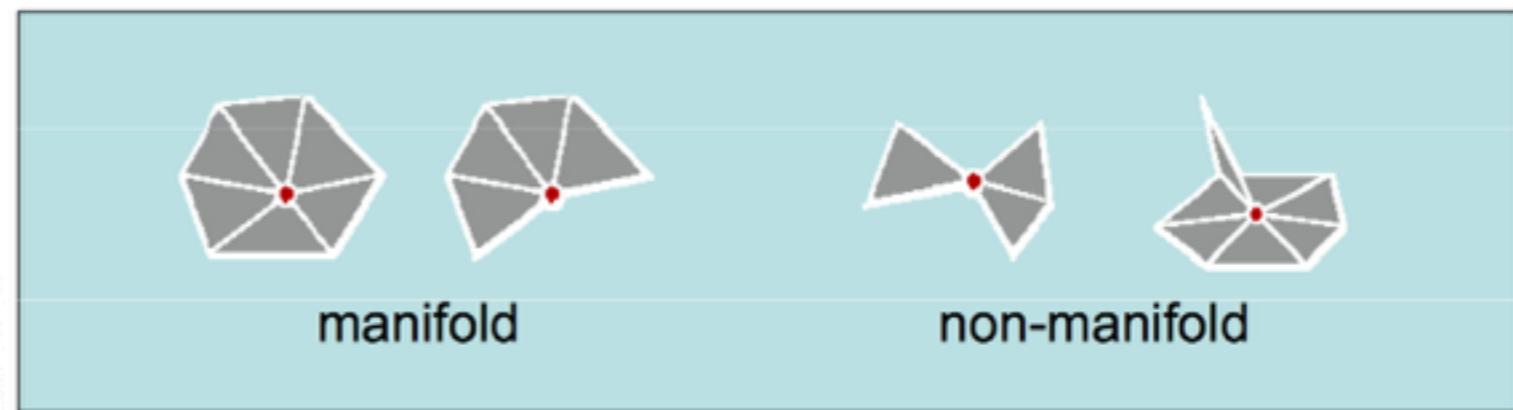
# Vertex Clustering

- Cluster Generation
- Computing a representative
- Mesh generation
- **Topology changes**
  - If different sheets pass through on cell
  - Can be non-manifold



# Vertex Clustering

- Cluster Generation
- Computing a representative
- Mesh generation
- **Topology changes**
  - If different sheets pass through on cell
  - Can be non-manifold



# Outline

## Mesh Decimation methods

- Vertex Clustering
- Iterative Decimation

# Example



# Incremental Decimation

- **General Setup**
  - Decimation operators
  - Error metrics
  - Fairness criteria
  - Topology changes

# General Setup

**Repeat:**

**pick mesh region**

**apply decimation operator**

**Until no further reduction possible**

# Greedy Optimization

```
For each region  
    evaluate quality after decimation  
    enqueue(quality, region)  
  
Repeat:  
    pick best mesh region  
    apply decimation operator  
    update queue  
Until no further reduction possible
```

# Global Error Control

```
For each region
    evaluate quality after decimation
    enqueue(quality, region)

Repeat:
    pick best mesh region
    if error < ε
        apply decimation operator
        update queue
Until no further reduction possible
```

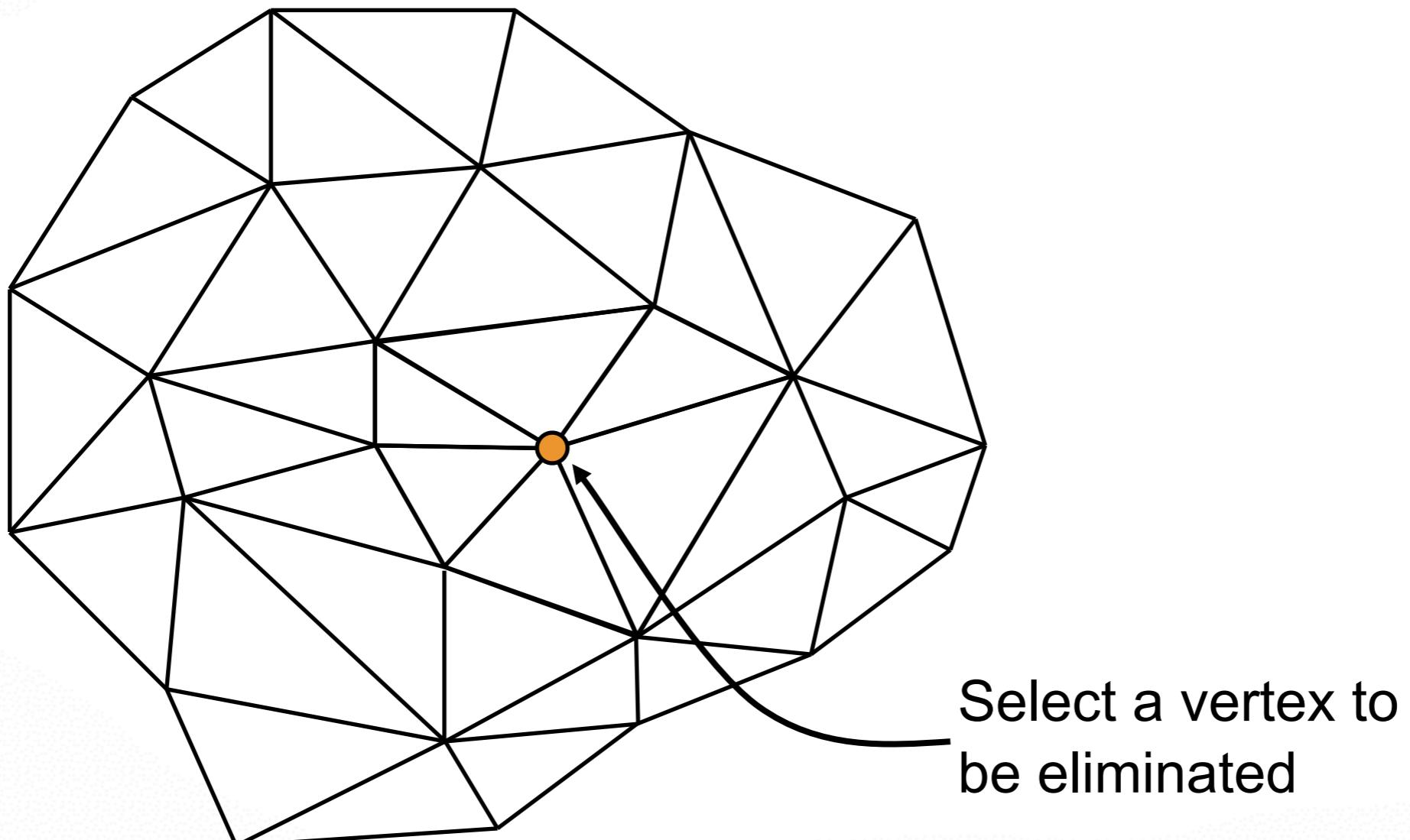
# Incremental Decimation

- General Setup
- **Decimation operators**
- Error metrics
- Fairness criteria
- Topology changes

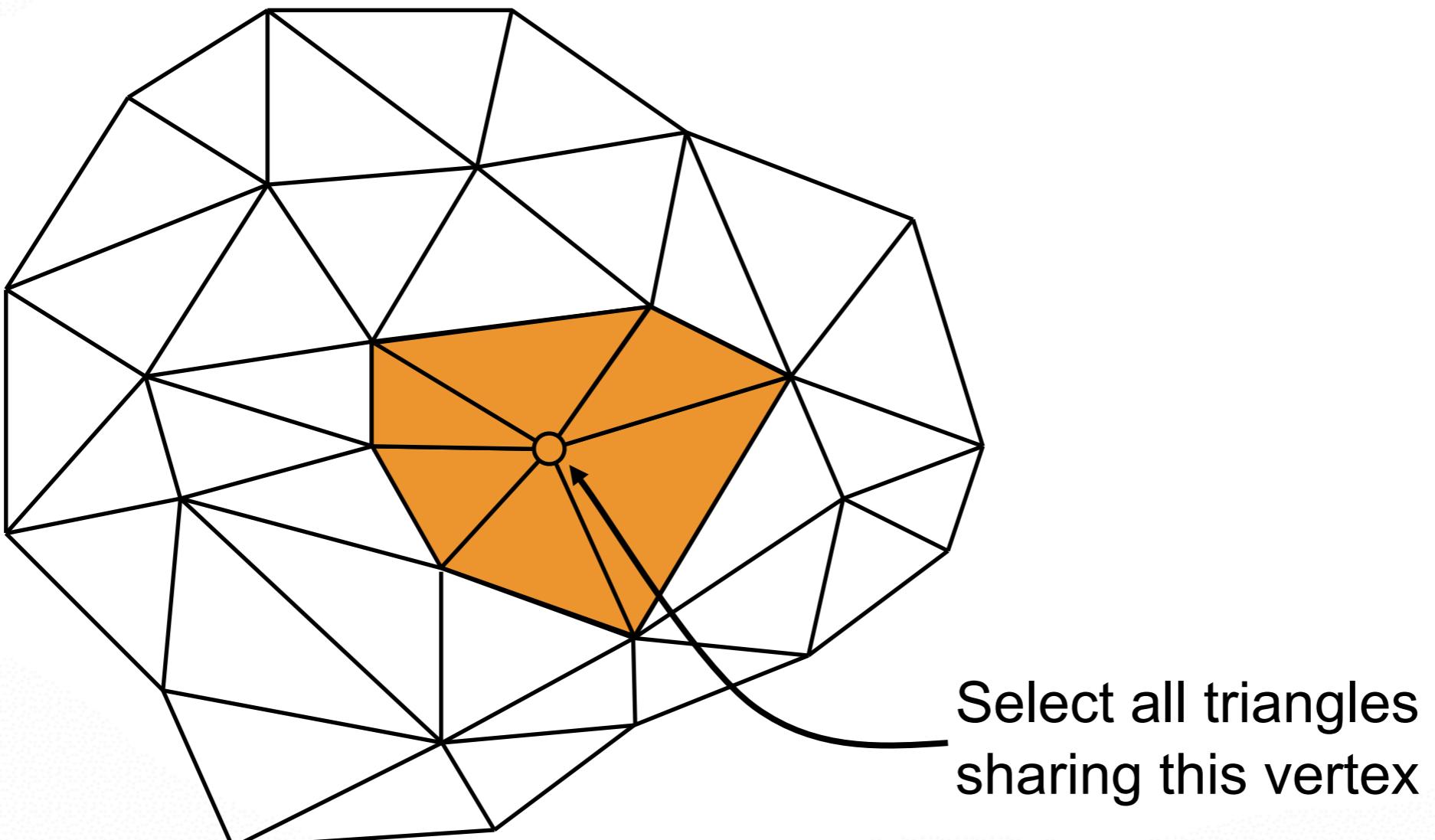
# Decimation Operators

- What is a “region”?
- What are the DOFs for re-triangulation?
- Classification
  - topology-changing vs. topology-preserving
  - subsampling vs. filtering
  - inverse operation → progressive meshes

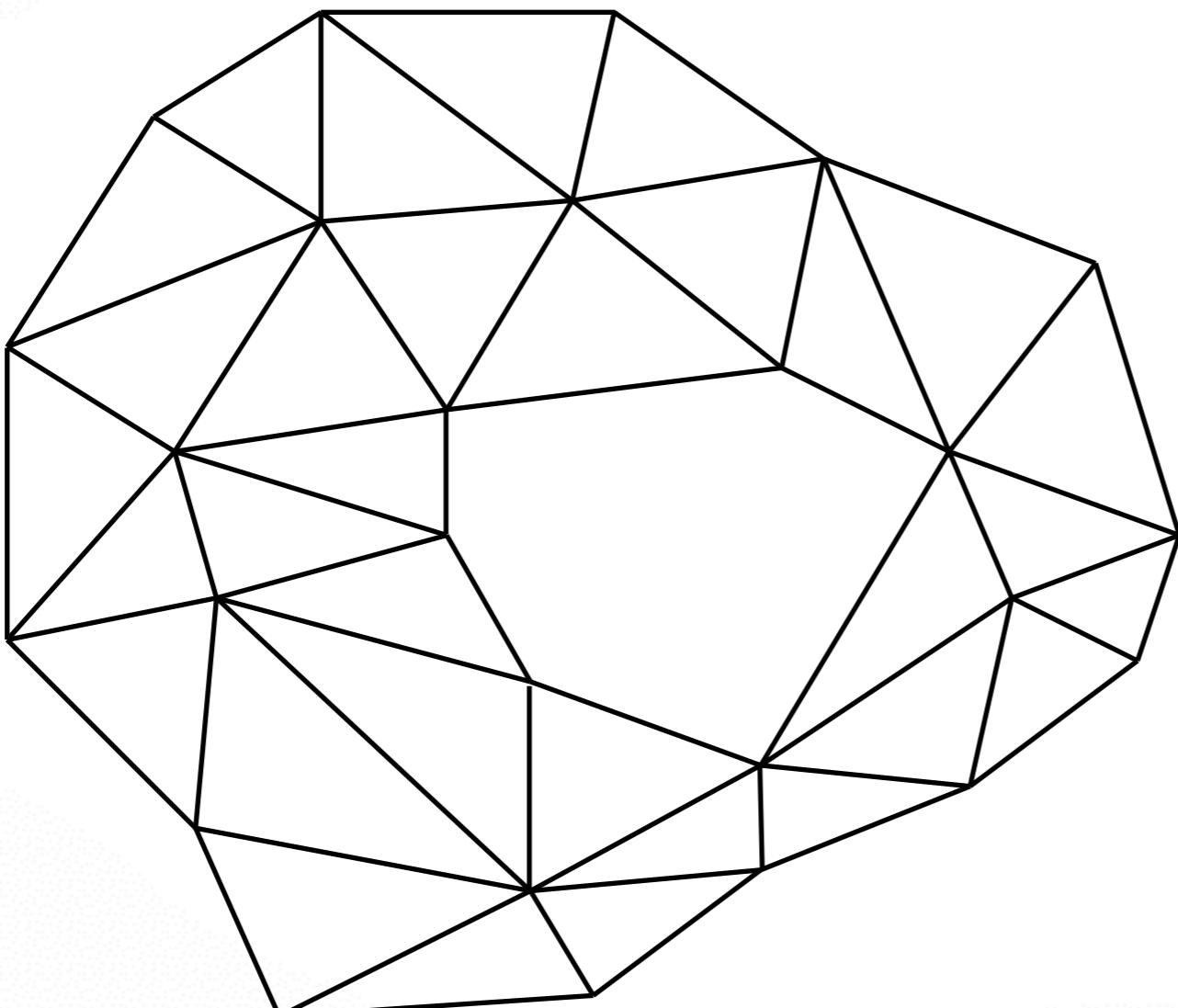
# Vertex Removal



# Vertex Removal

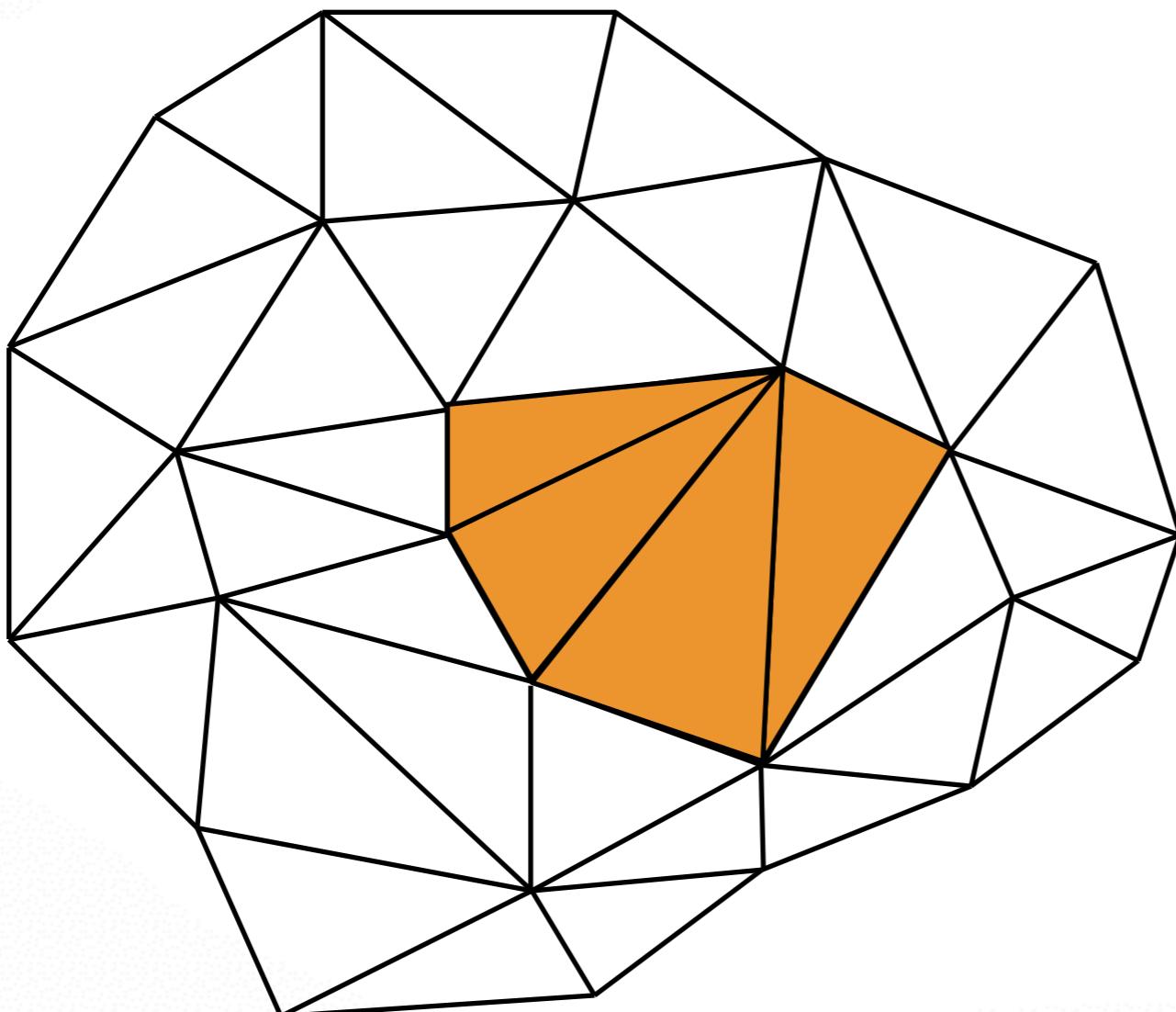


# Vertex Removal



Remove the  
selected triangles,  
creating a hole

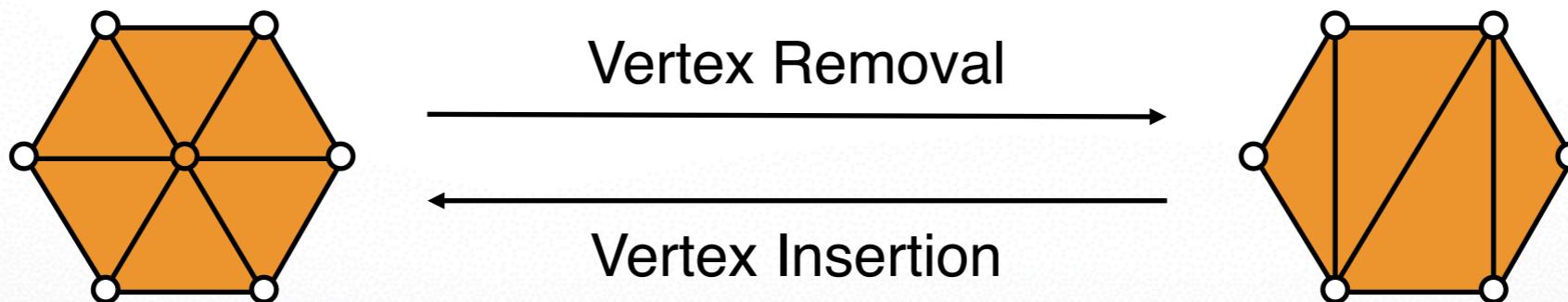
# Vertex Removal



Fill the hole  
with triangles

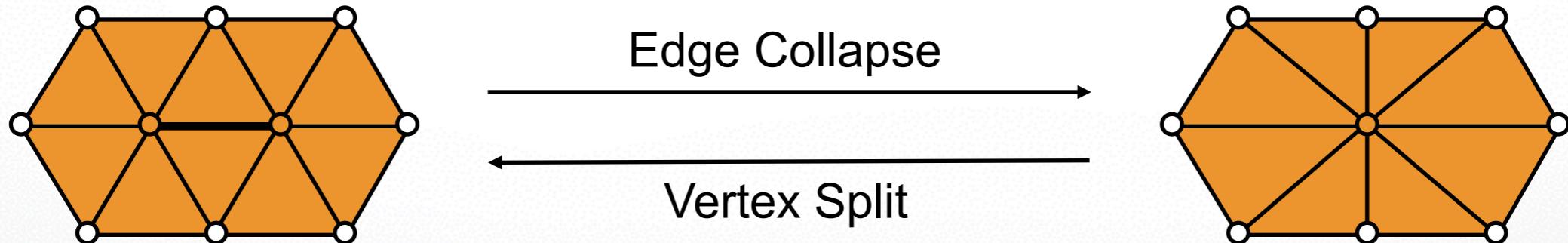
# Decimation Operators

- Remove vertex
- Re-triangulate hole
  - Combinatorial DOFs
  - Sub-sampling



# Decimation Operators

- Merge two adjacent triangles
- Define new vertex position
  - Continuous DOF
  - Filtering

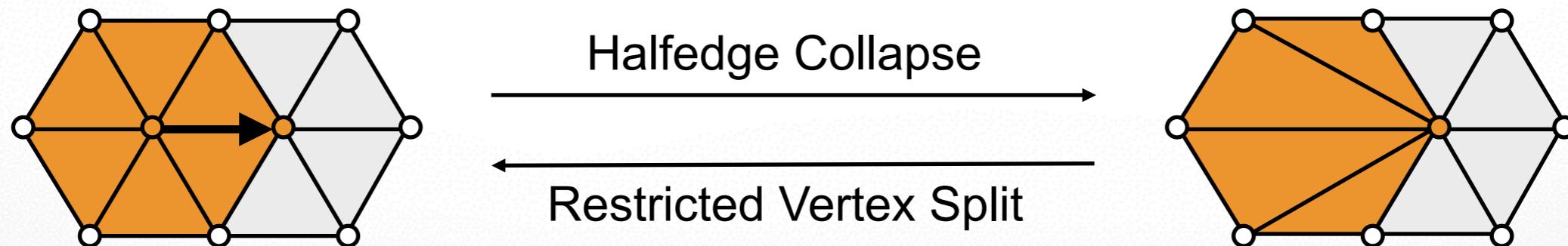


# Decimation Operators

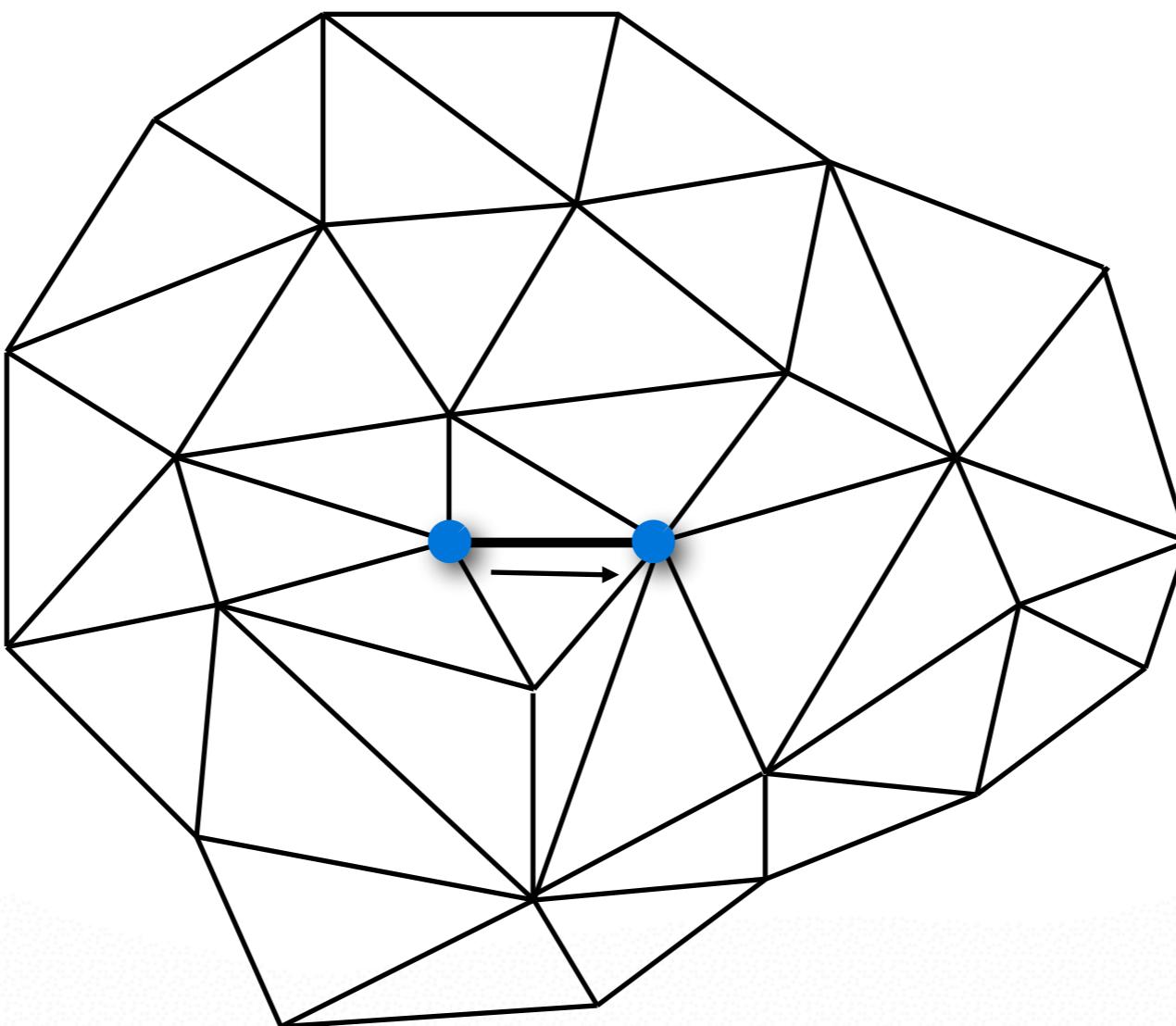
- Collapse edge into one end point
  - Special vertex removal
  - Special edge collapse
- No DOFs
  - One operator per half-edge
  - Sub-sampling



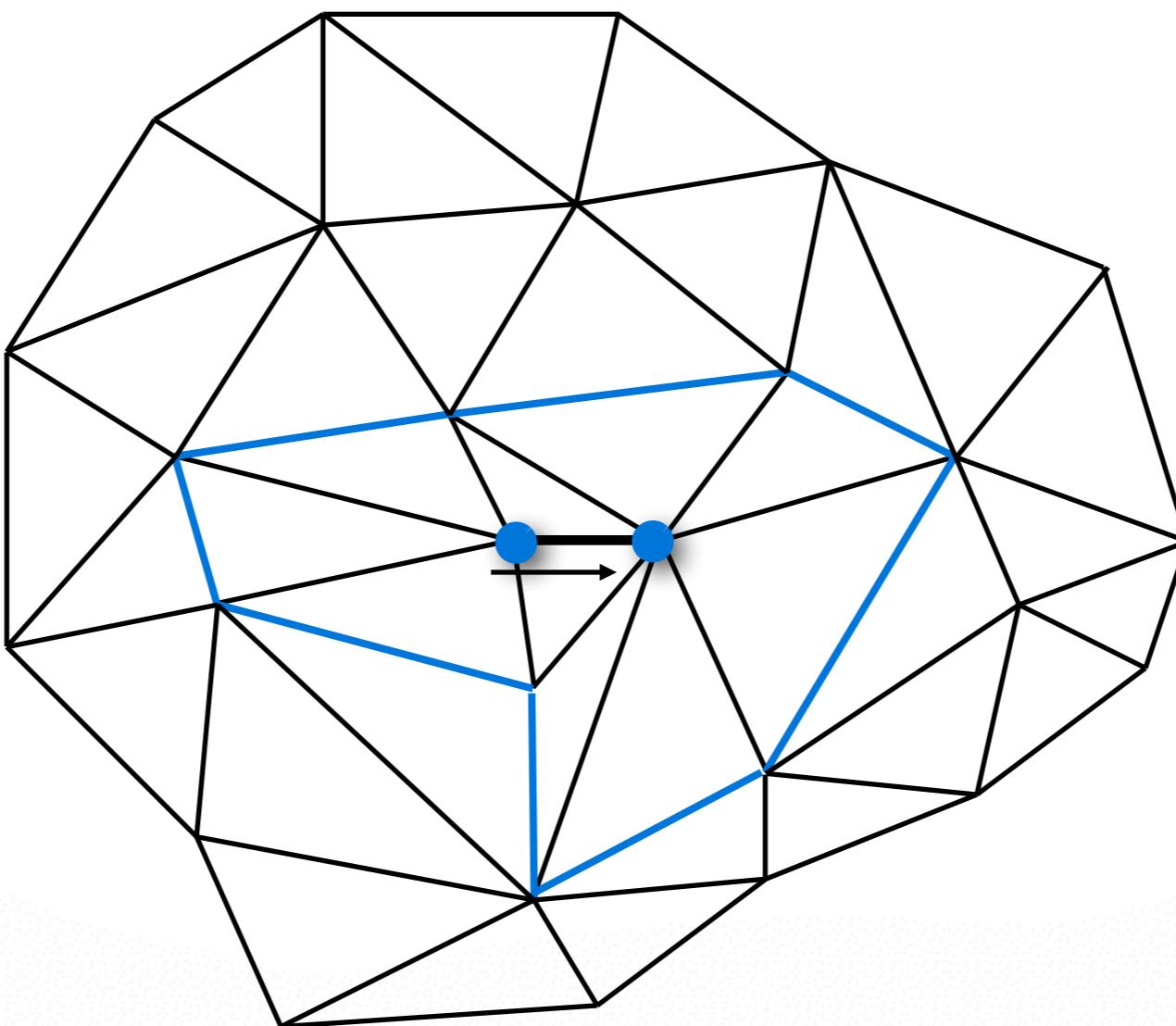
H. Hoppe: Progressive Meshes



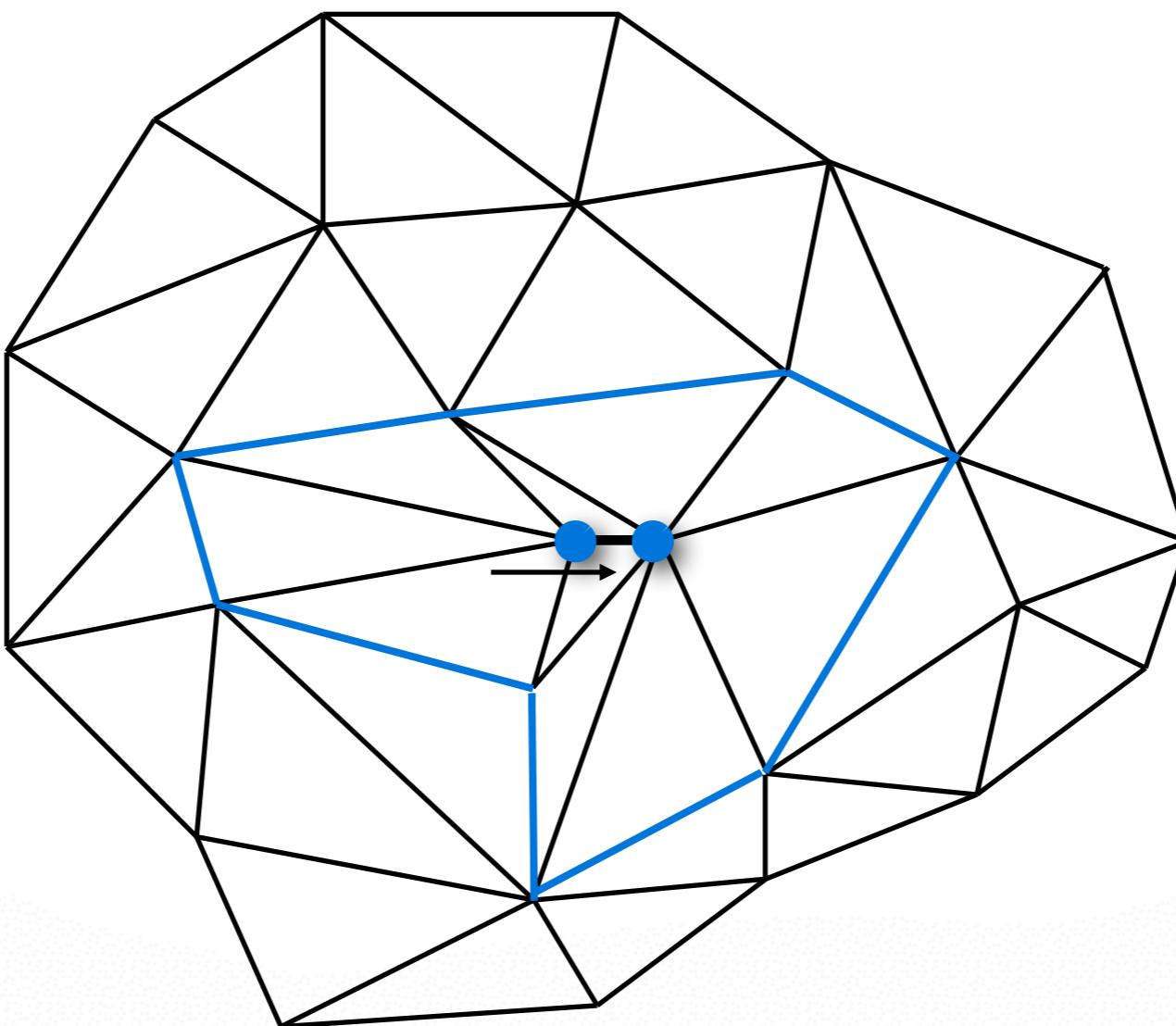
# Edge Collapse



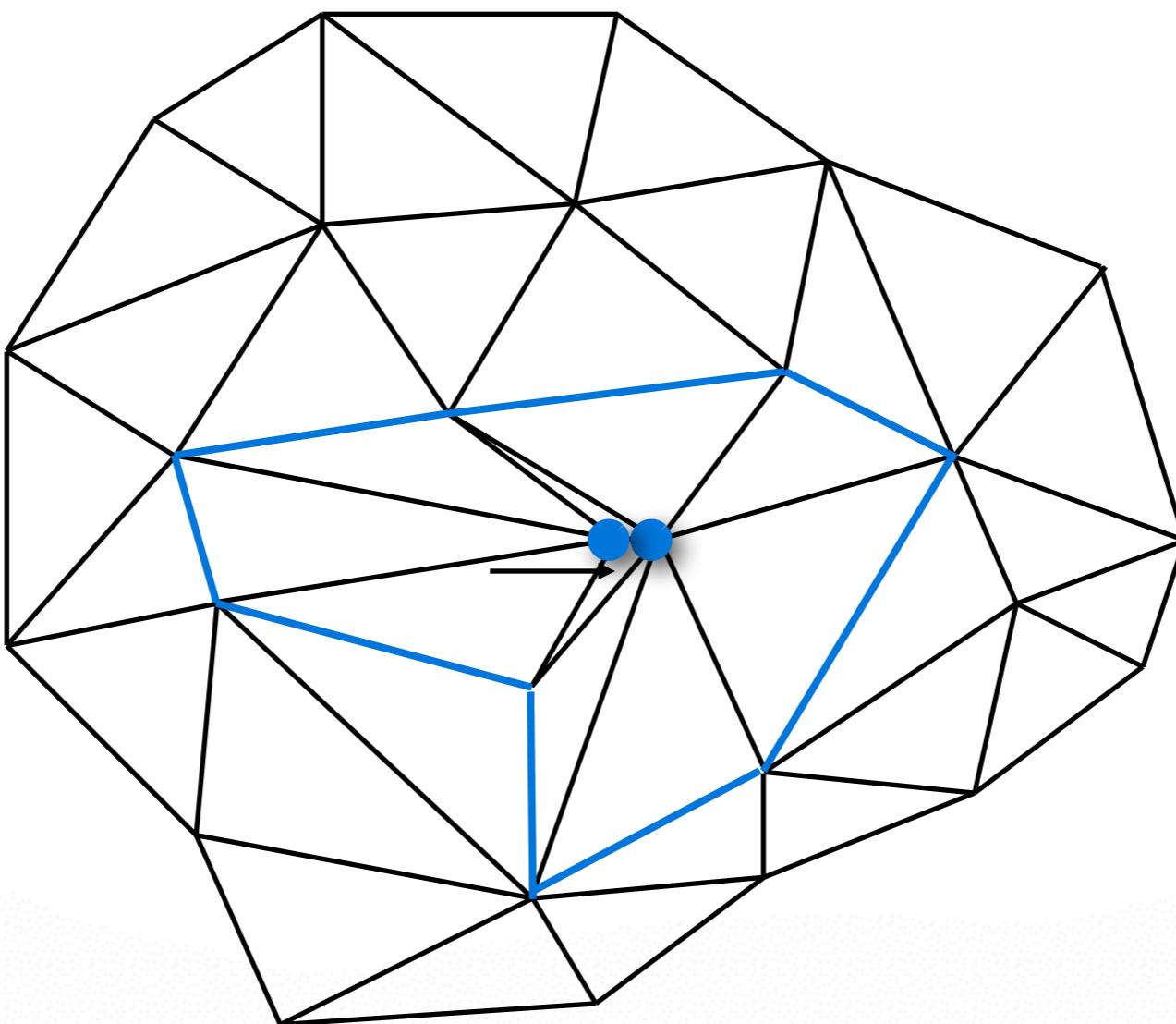
# Edge Collapse



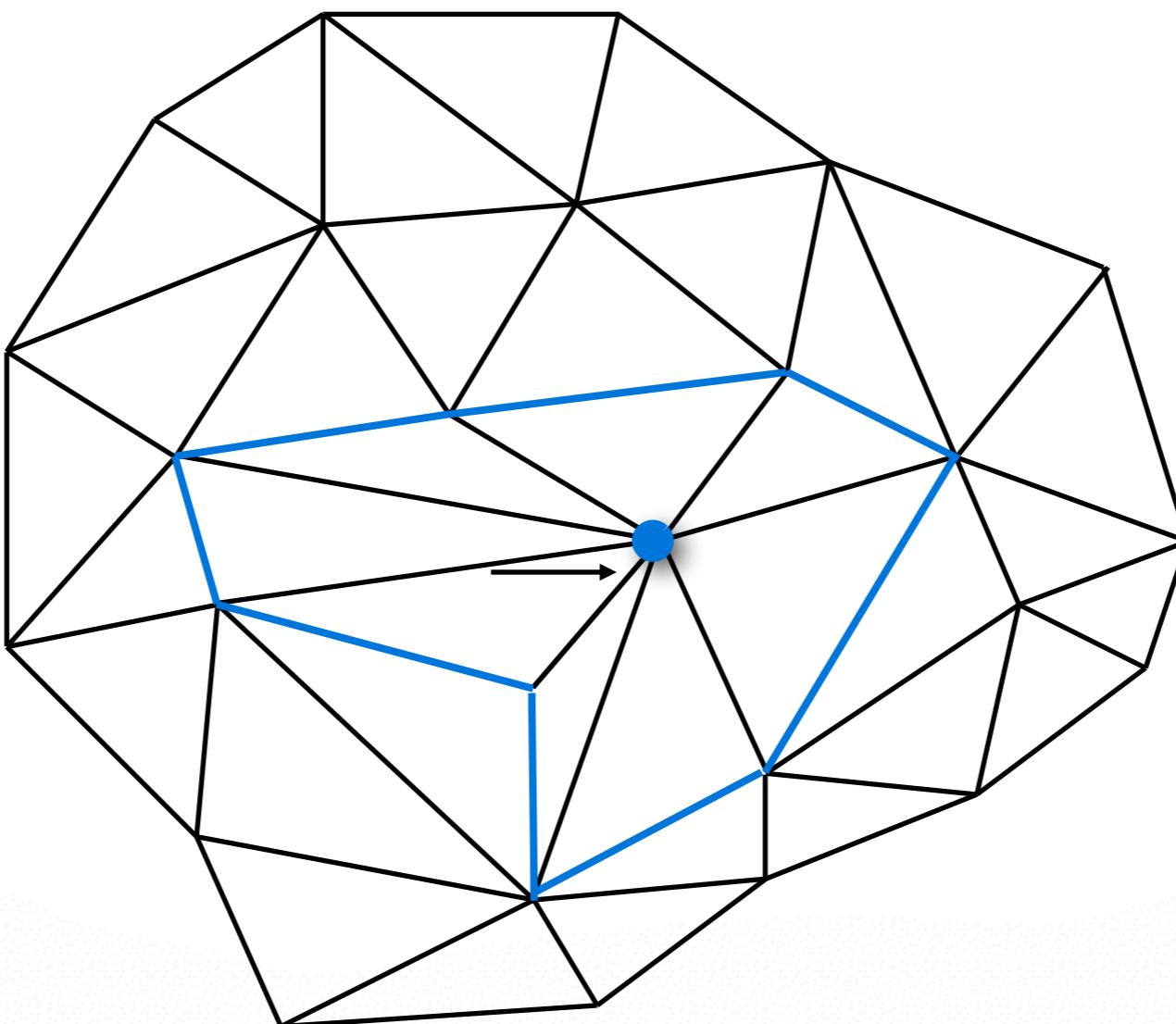
# Edge Collapse



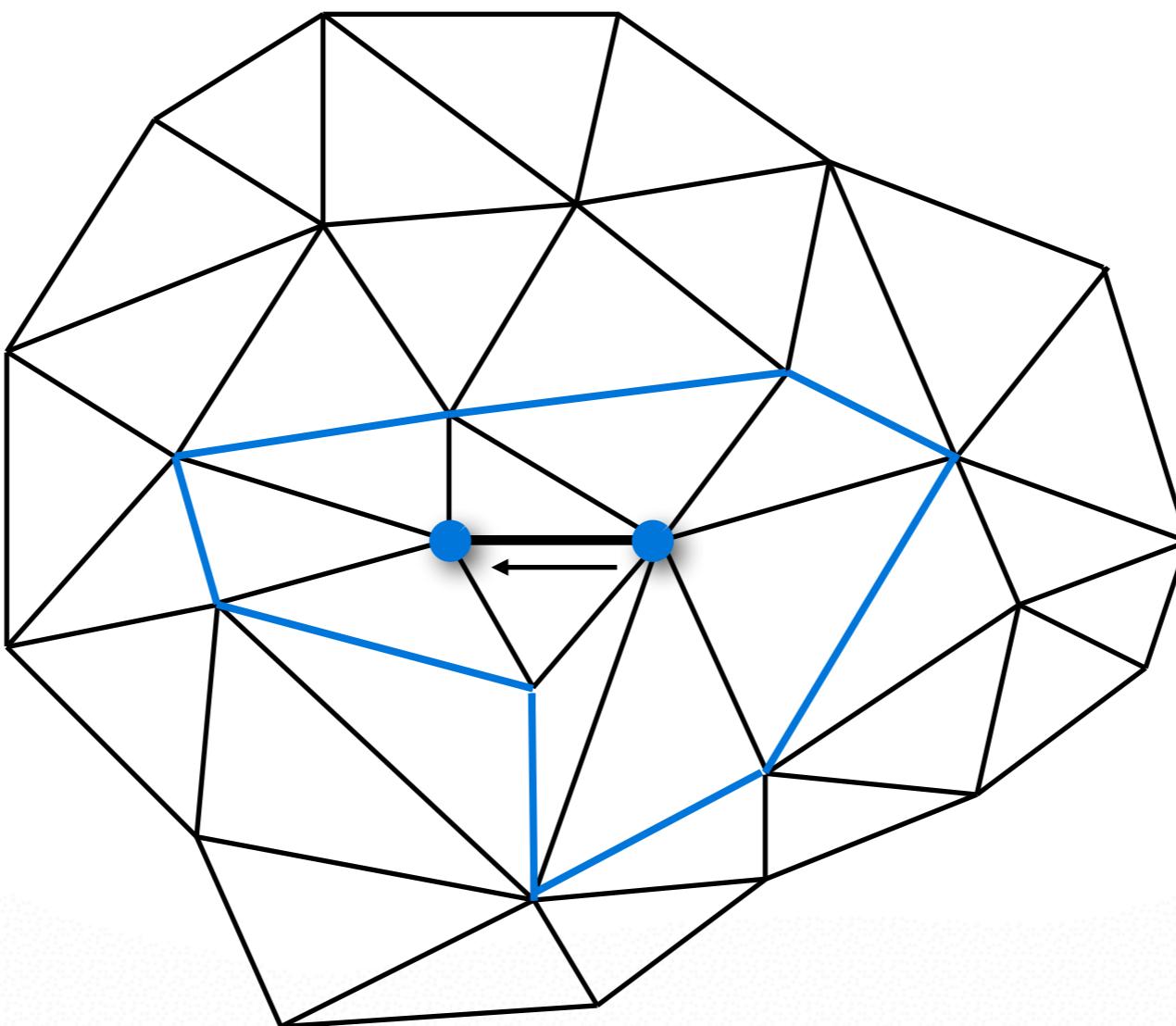
# Edge Collapse



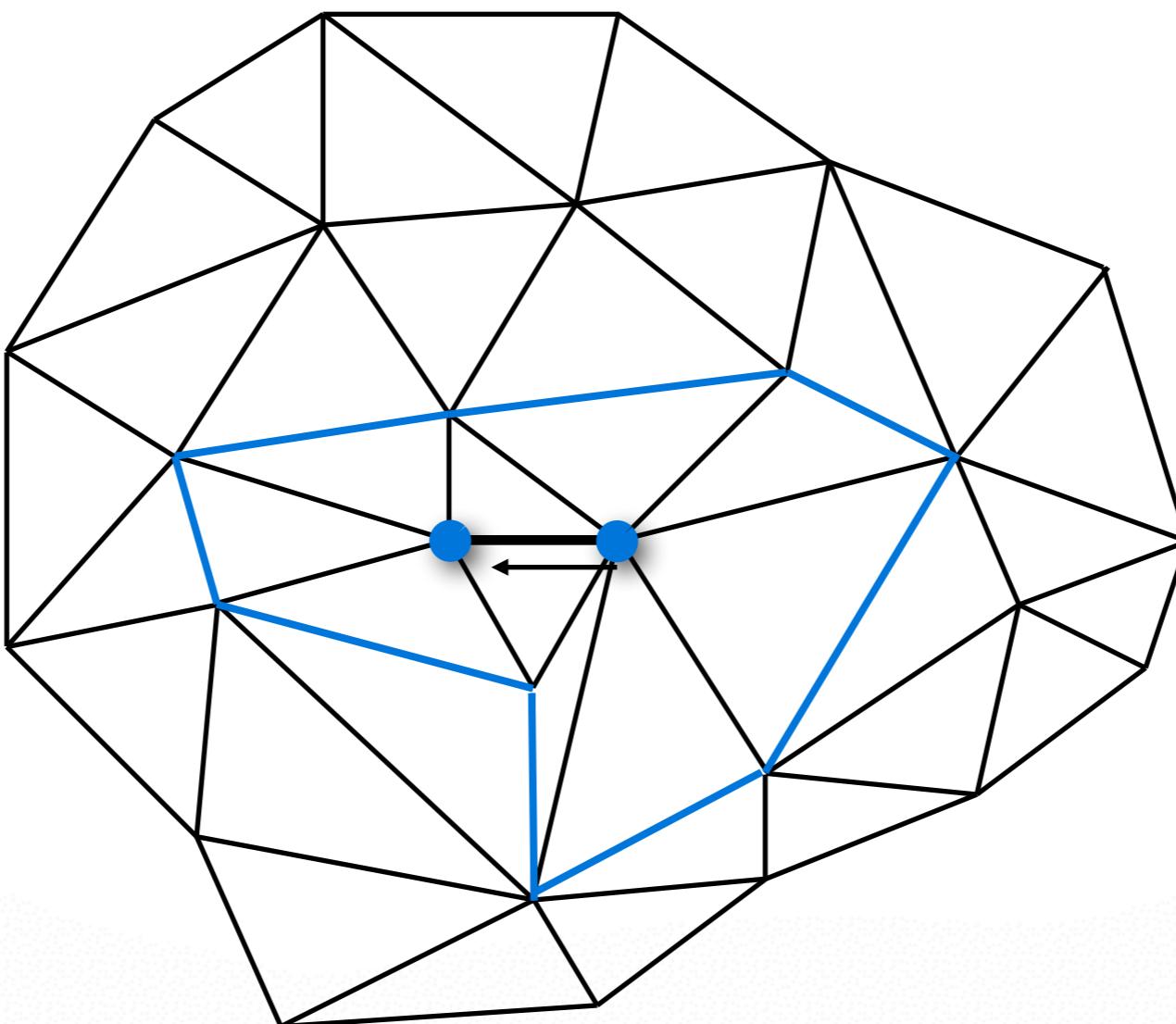
# Edge Collapse



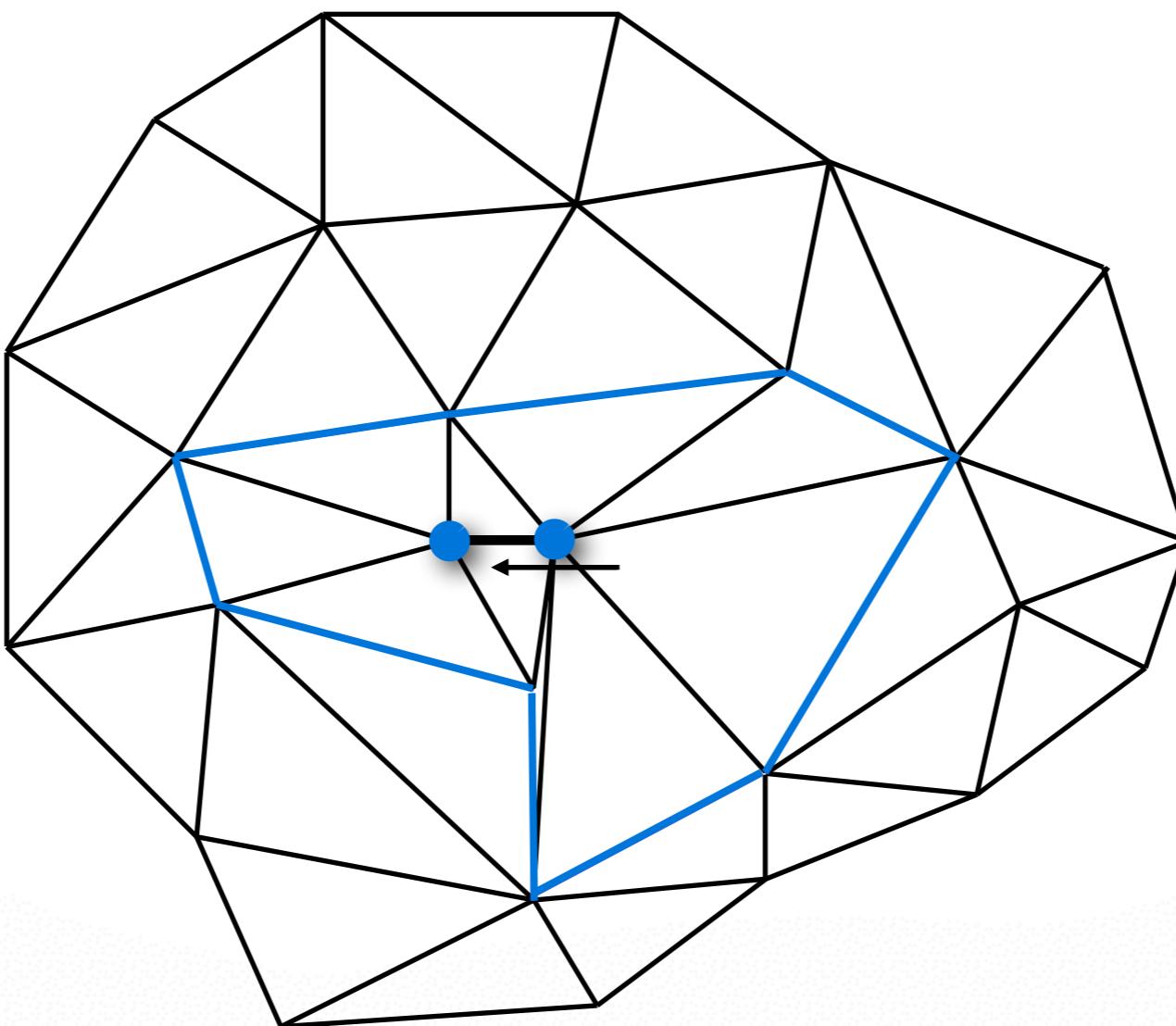
# Edge Collapse



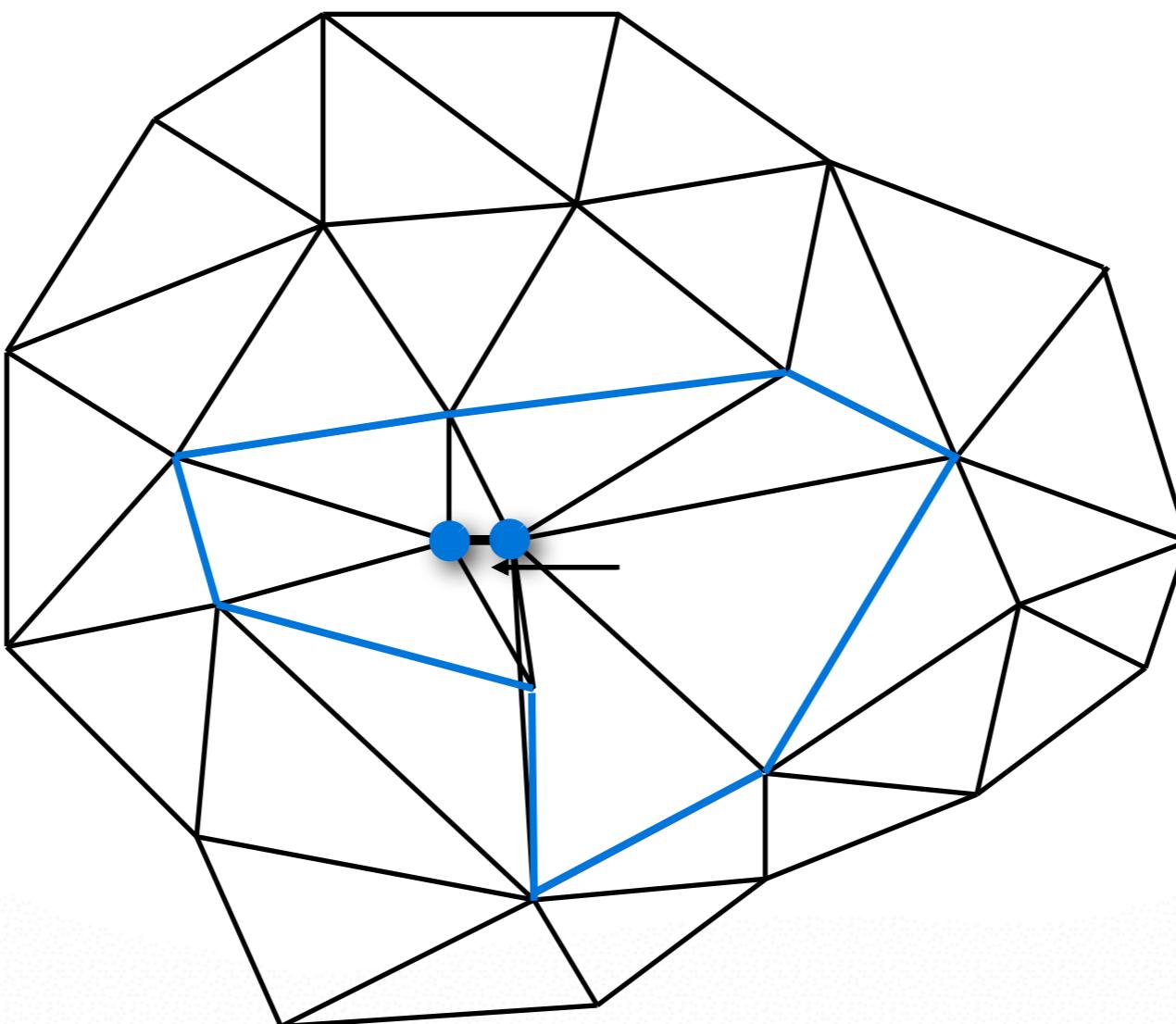
# Edge Collapse



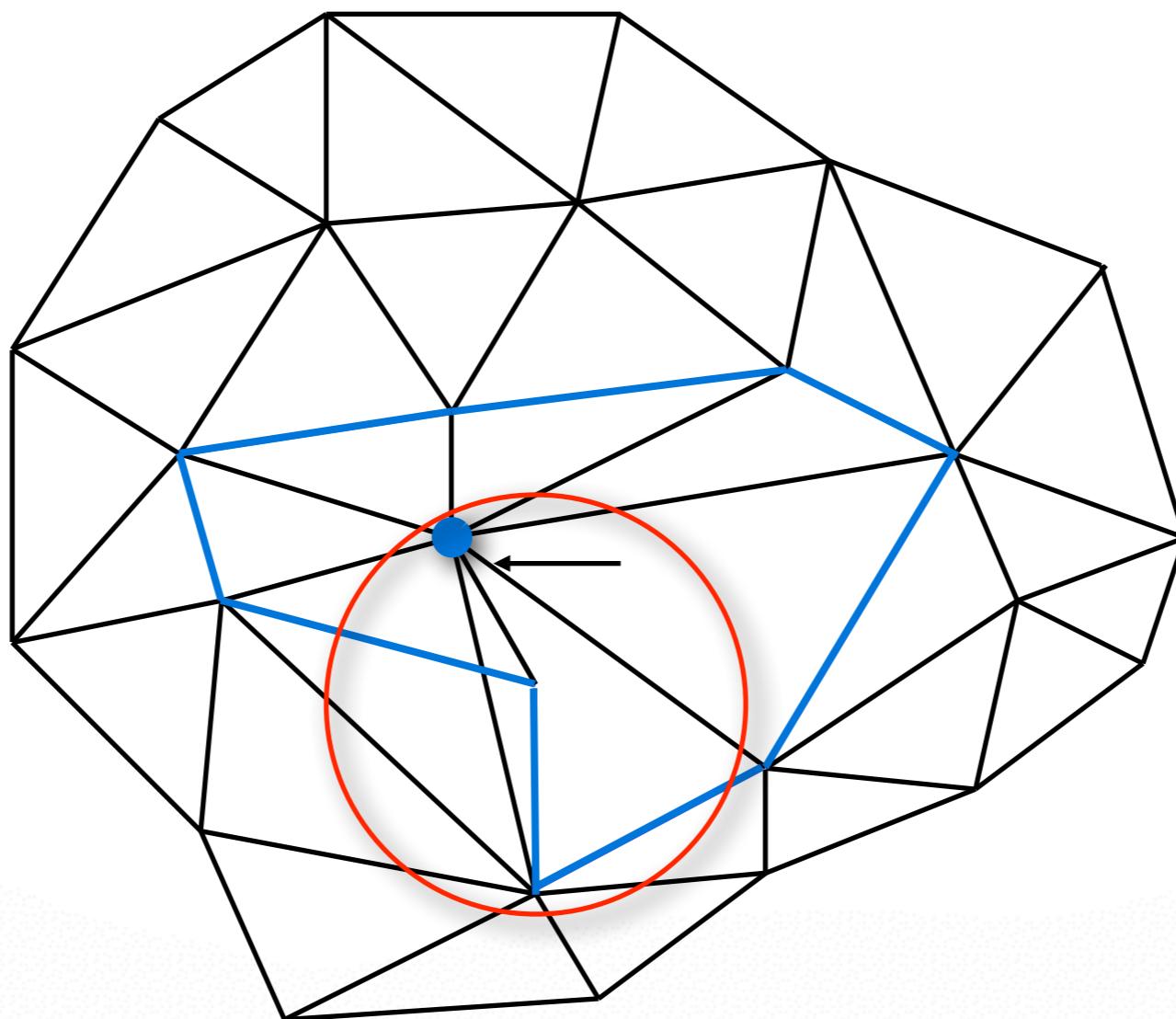
# Edge Collapse



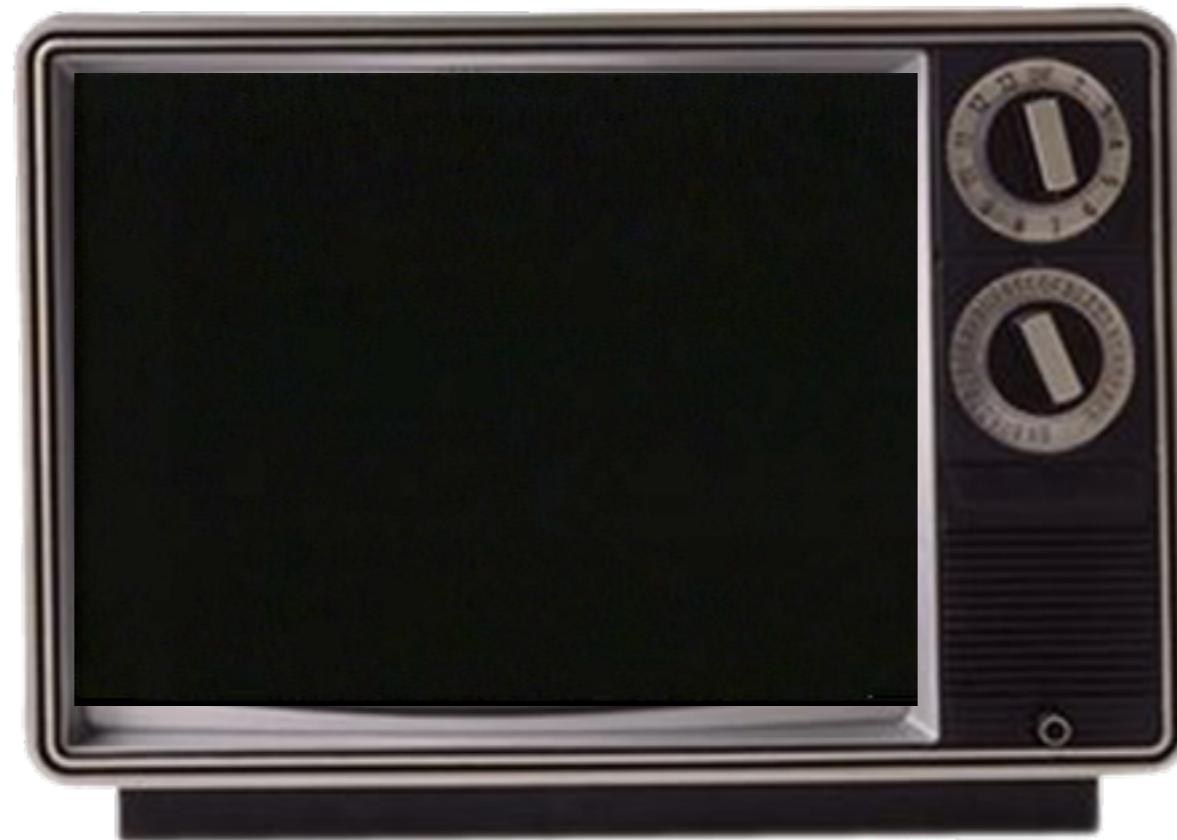
# Edge Collapse



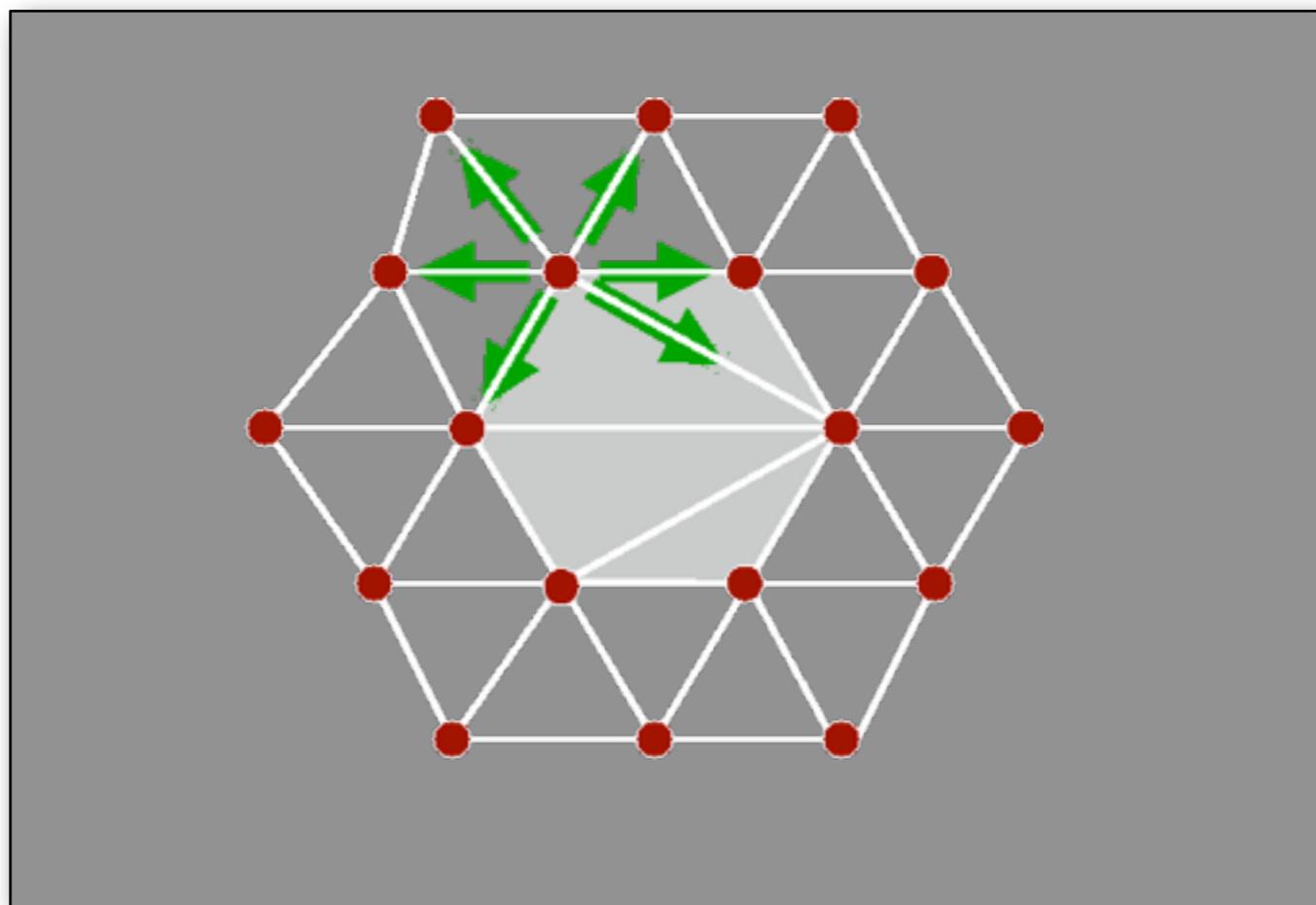
# Edge Collapse (Flip!)



# Application: Progressive Meshes



# Priority Queue Updating



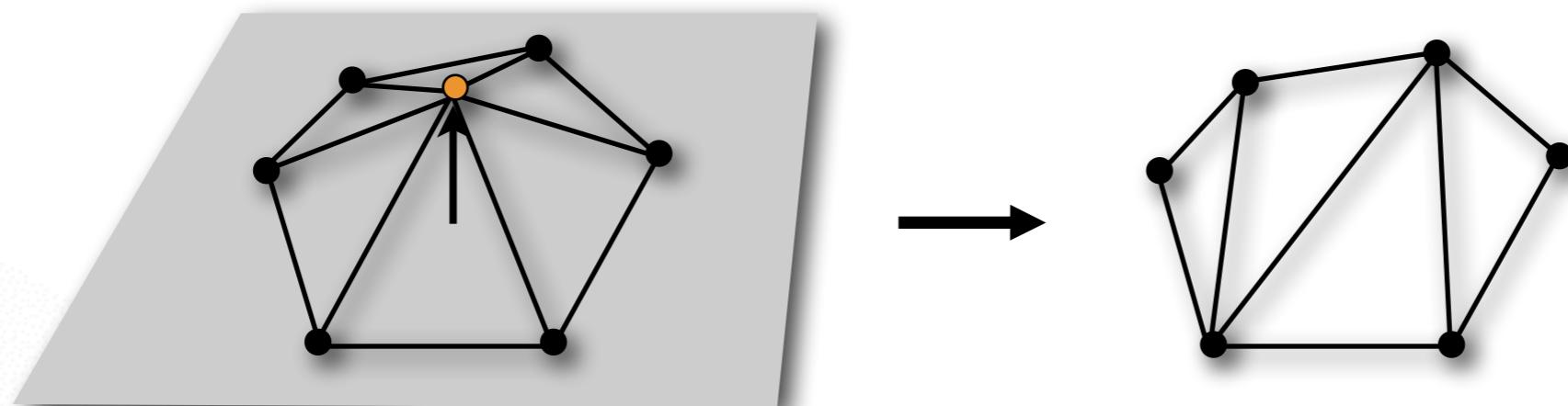
# Incremental Decimation

- General Setup
- Decimation operators
- **Error metrics**
- Fairness criteria
- Topology changes

# Local Error Metrics

## Local distance to mesh [Schröder et al. '92]

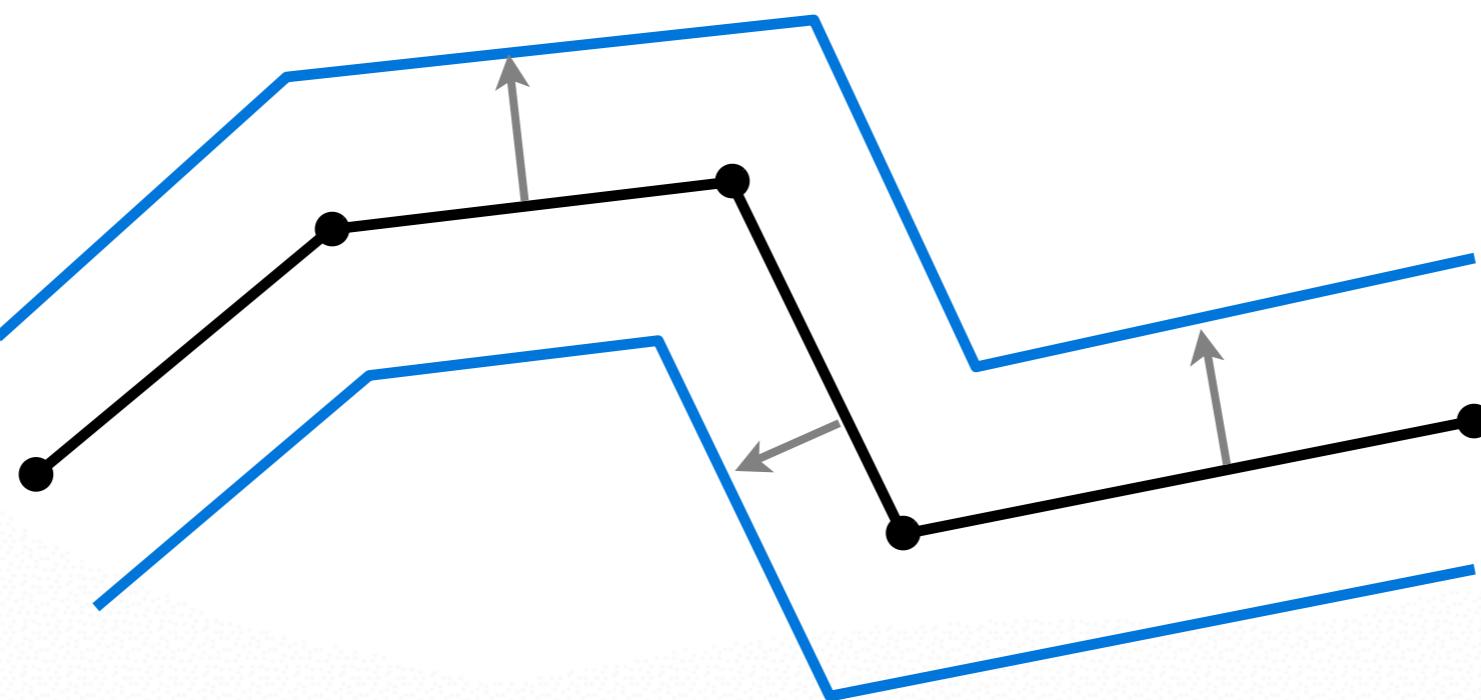
- Compute average plane
- No comparison to original geometry



# Global Error Metrics

## Simplification envelopes [Cohen al. '96]

- Compute (non-intersecting) offset surfaces
- Simplification guarantees to stay within bounds

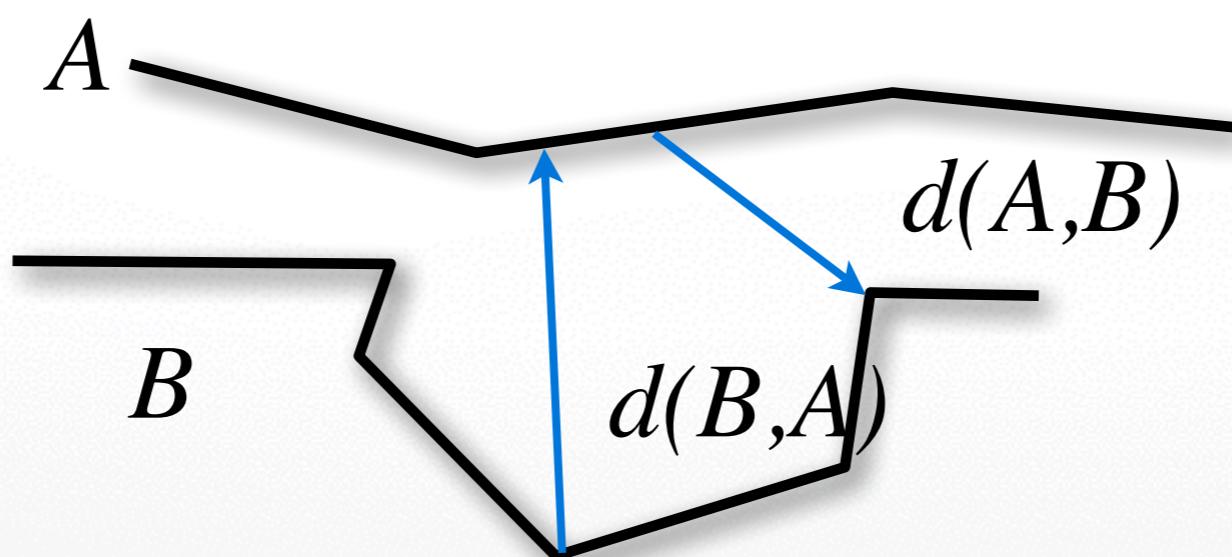


# Global Error Metrics

**(Two-sided) Hausdorff distance: Maximum distance between two shapes**

$$d(A, B) := \max_{\mathbf{a} \in A} \min_{\mathbf{b} \in B} \|\mathbf{a} - \mathbf{b}\|$$

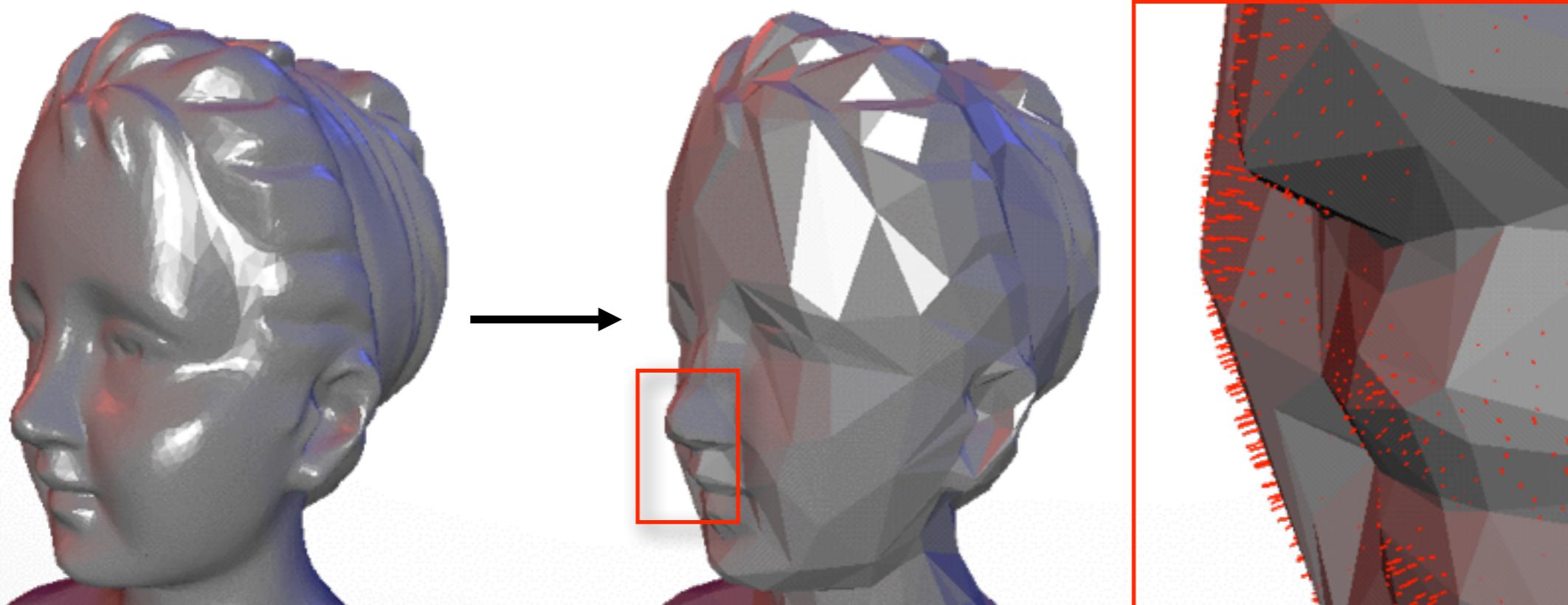
- In general  $d(A, B) \neq d(B, A)$
- Computationally involved



# Global Error Metrics

**Scan data: One-sided Hausdorff distance sufficient**

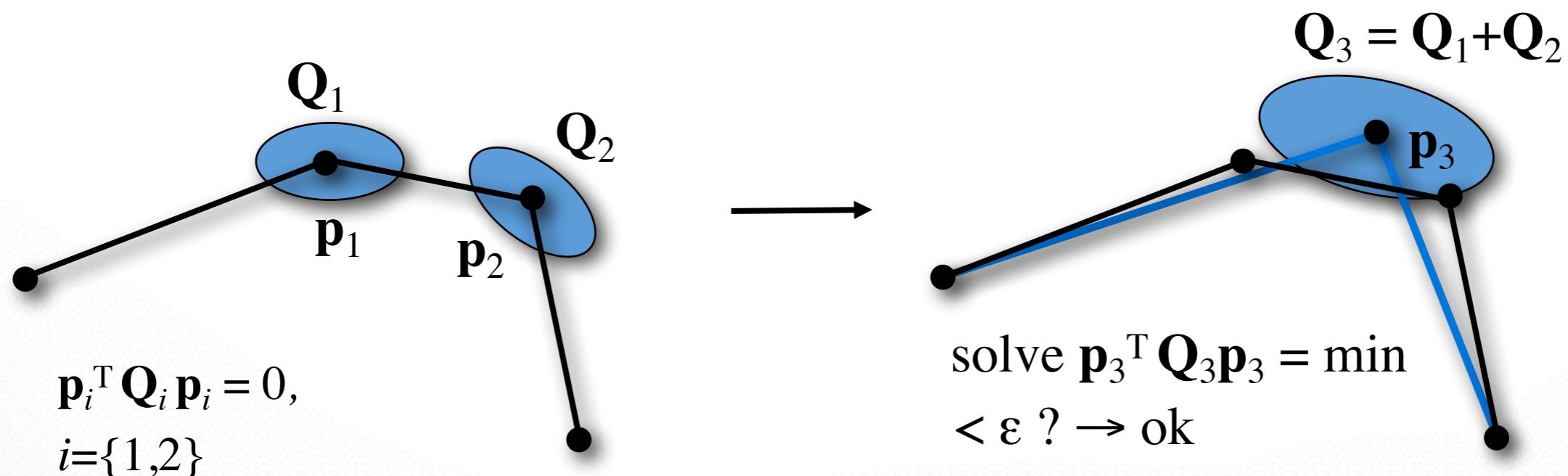
- From original vertices to current surface



# Global Error Metrics

## Error quadrics [Garland, Heckbert 97]

- Squared distance to planes at vertex
- No bound on true error



# Global Error Metrics

## Initialization:

- Assign each vertex the quadric built from all its incident triangles' planes

## Decimation:

- After collapsing edge  $(\mathbf{p}_1, \mathbf{p}_2) \rightarrow \mathbf{p}_3$ , simply add the corresponding quadrics:  $\mathbf{Q}_3 = \mathbf{Q}_1 + \mathbf{Q}_2$

## Memory consumption

- Quasi-global error metric with 10 floats per vertex

# Complexity

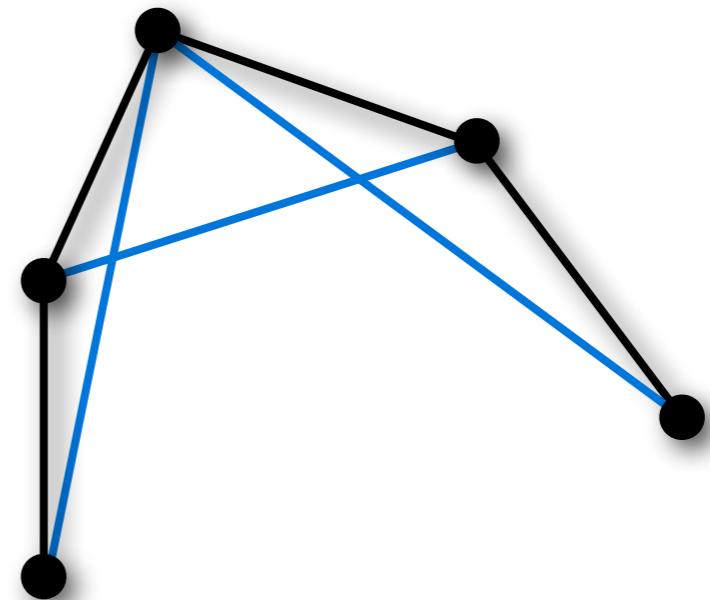
- $N$  = number of vertices
- Priority Queue for half edges
  - $6N \log(6N)$
- Error control
  - Local  $O(1) \Rightarrow$  global  $O(N)$
  - Local  $O(N) \Rightarrow$  global  $O(N^2)$

# Incremental Decimation

- General Setup
- Decimation operators
- Error metrics
- **Fairness criteria**
- Topology changes

# Fairness Criteria

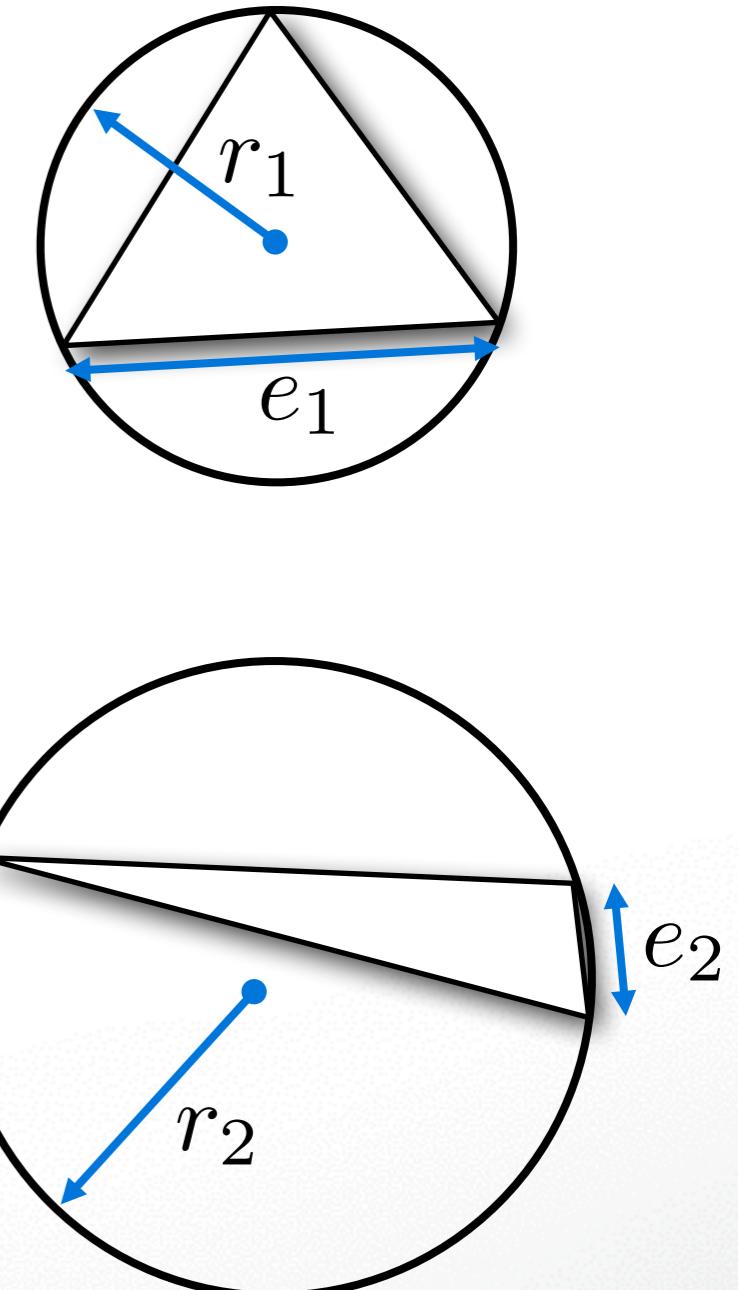
- Rate quality after decimation
  - Approximation error



# Fairness Criteria

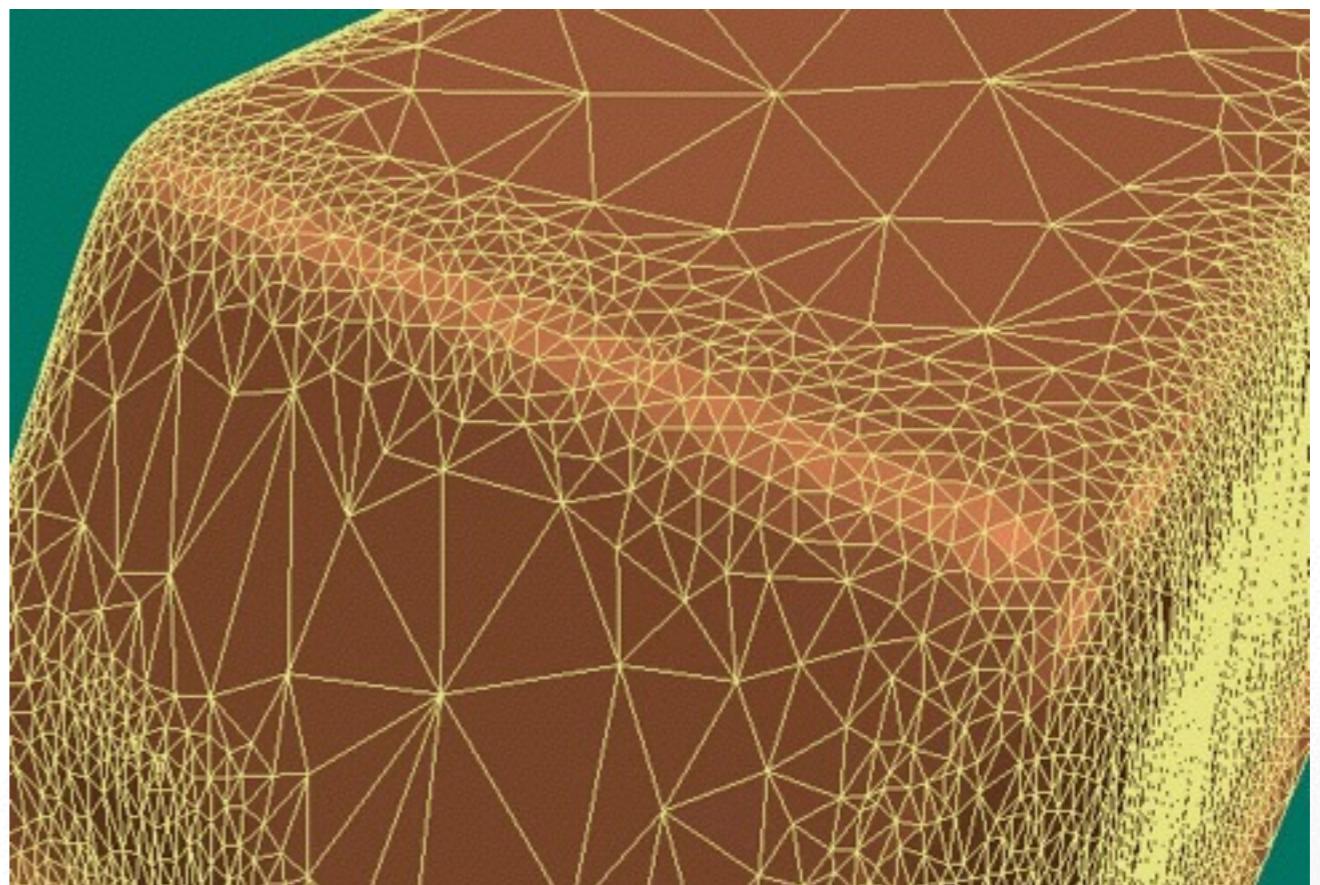
- Rate quality after decimation
  - Approximation error
  - Triangle shape

$$\frac{r_1}{e_1} < \frac{r_2}{e_2}$$



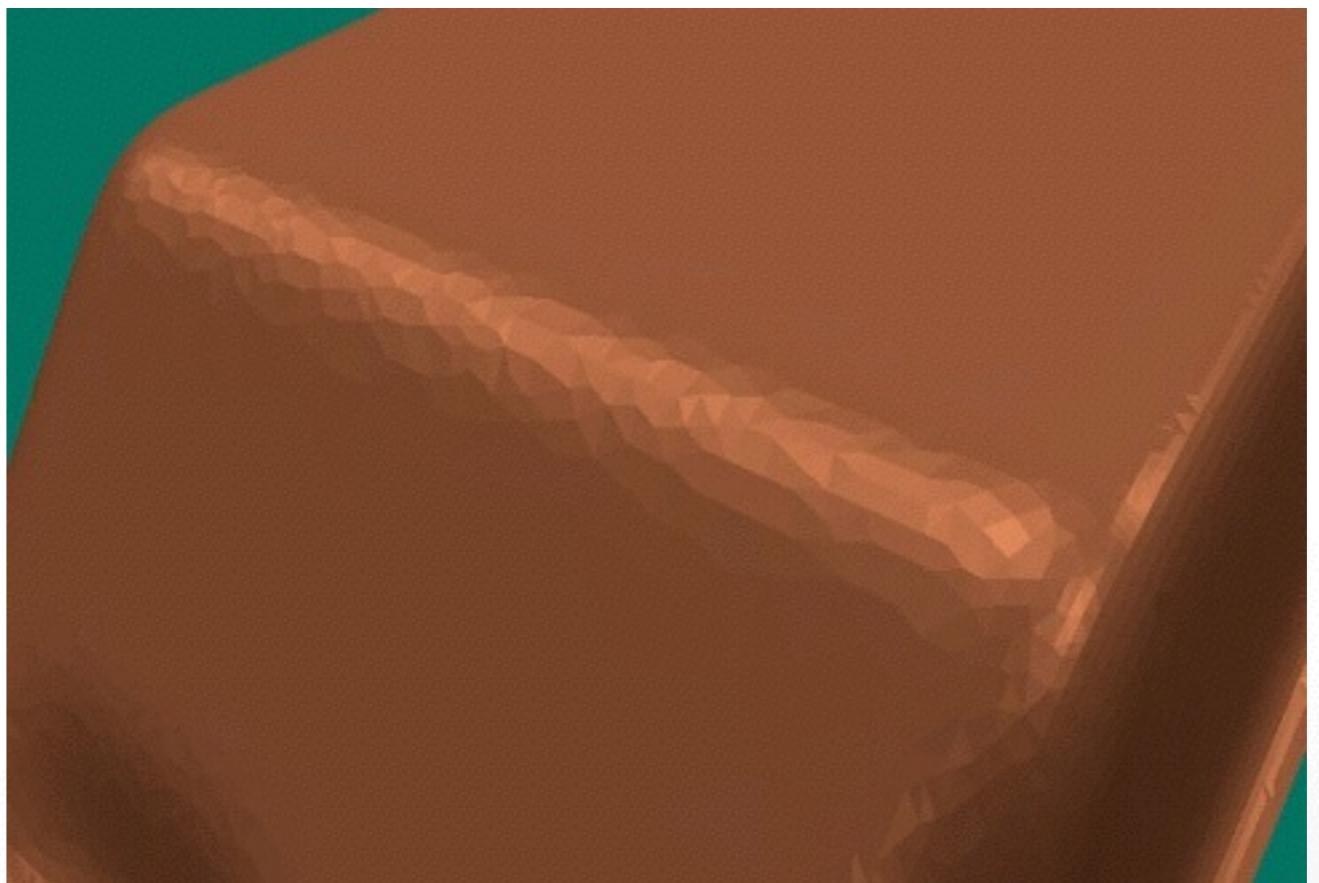
# Fairness Criteria

- Rate quality after decimation
  - Approximation error
  - Triangle shape



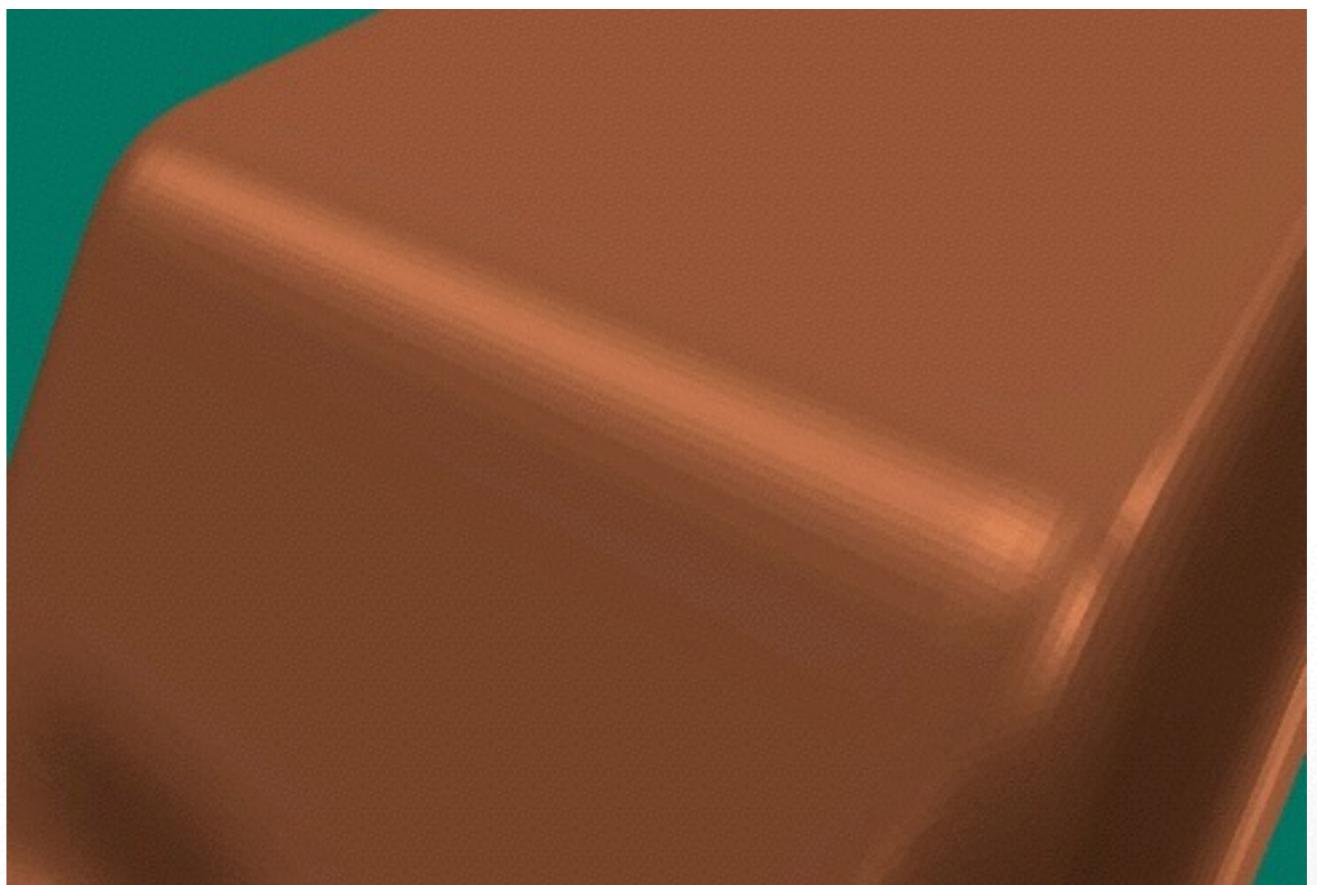
# Fairness Criteria

- Rate quality after decimation
  - Approximation error
  - Triangle shape



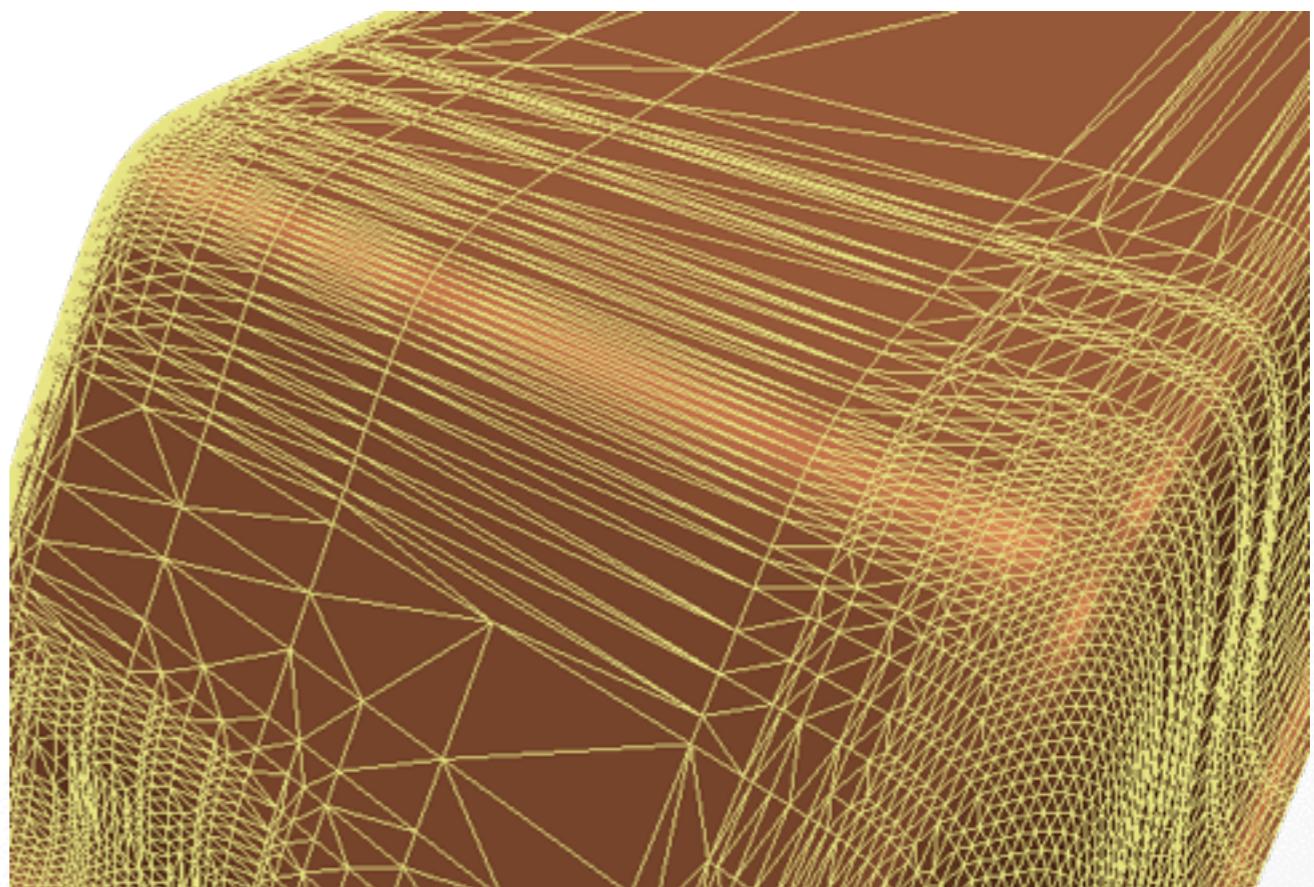
# Fairness Criteria

- Rate quality after decimation
  - Approximation error
  - Triangle shape
  - Dihedral angles



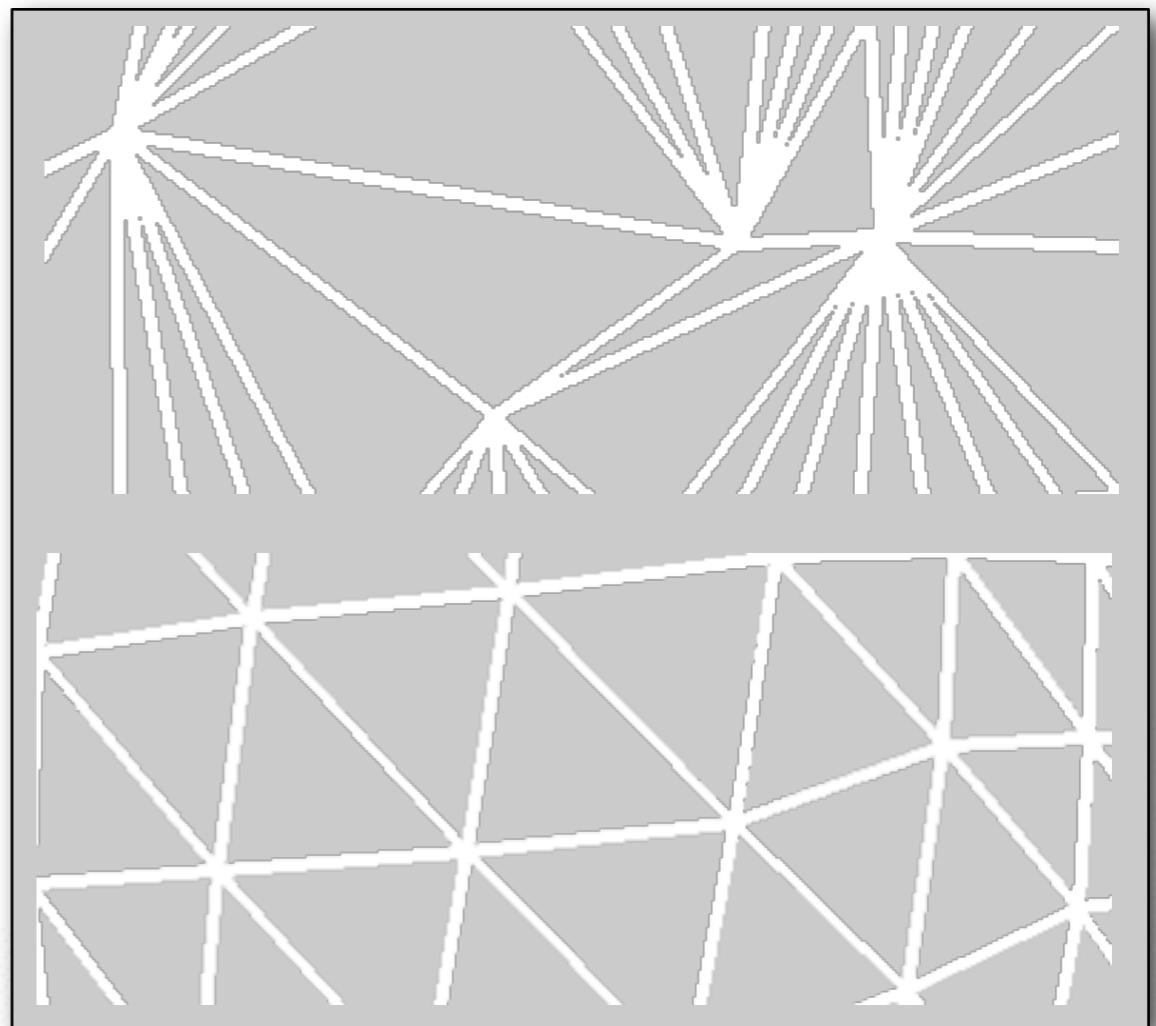
# Fairness Criteria

- Rate quality after decimation
  - Approximation error
  - Triangle shape
  - Dihedral angles



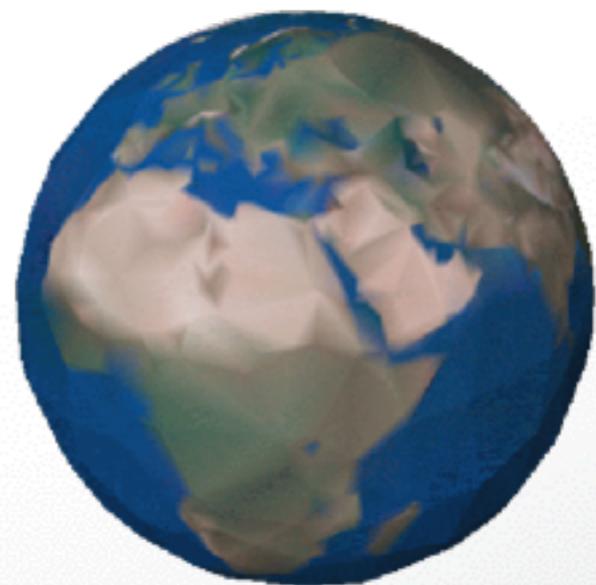
# Fairness Criteria

- Rate quality after decimation
  - Approximation error
  - Triangle shape
  - Dihedral angles
  - Valence balance



# Fairness Criteria

- Rate quality after decimation
  - Approximation error
  - Triangle shape
  - Dihedral angles
  - Valence balance
  - Color differences
  - ...

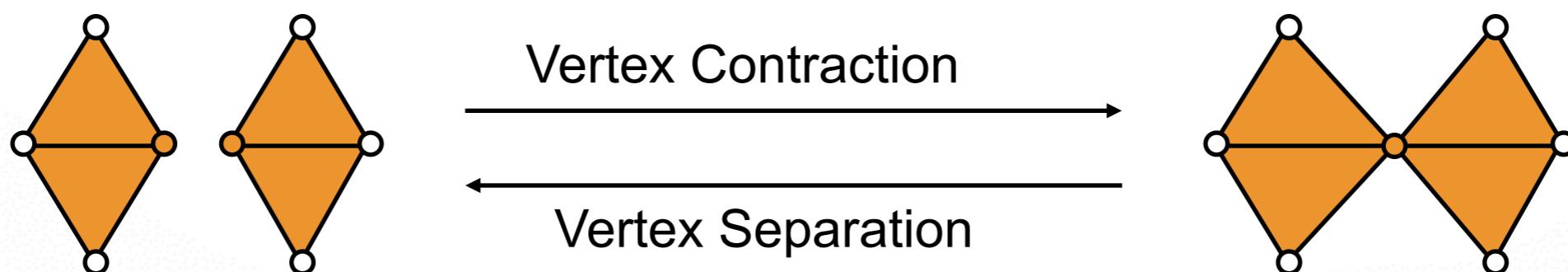


# Incremental Decimation

- General Setup
- Decimation operators
- Error metrics
- Fairness criteria
- **Topology changes**

# Fairness Criteria

- Merge vertices across non-edges
  - Changes mesh topology
  - Need spatial *neighborhood* information
  - Generates *non-manifold* meshes



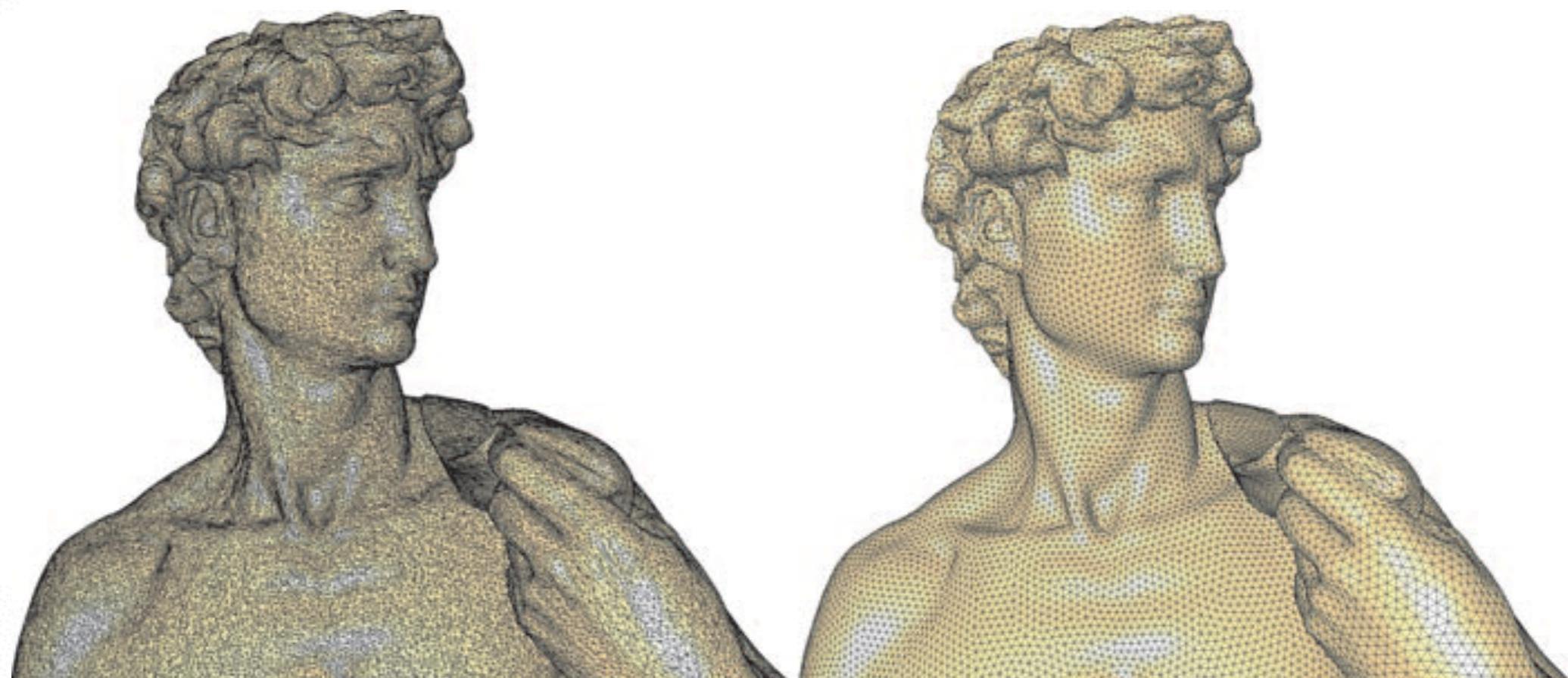
# Comparison

- **Vertex clustering**
  - fast but difficult to control simplified mesh
  - topology changes, non-manifold meshes
  - global error bound, but often not close to optimum
- **Iterative decimation with quadric error metrics**
  - good trade-off between mesh-quality and speed
  - explicit control over mesh topology
  - restricting normal deviation improves mesh quality

# Literature

- Quadric-based simplification
  - <http://graphics.cs.uiuc.edu/~garland/software/qslim.html>
  - <http://www.openmesh.org>
- Garland, Heckbert: Surface simplification using quadric error metrics, SIGGRAPH 1997.
- Kobbelt et al., A general framework for mesh decimation, Graphics Interface 1998.

# Next Time



Remeshing

<http://cs599.hao-li.com>

# Thanks!

