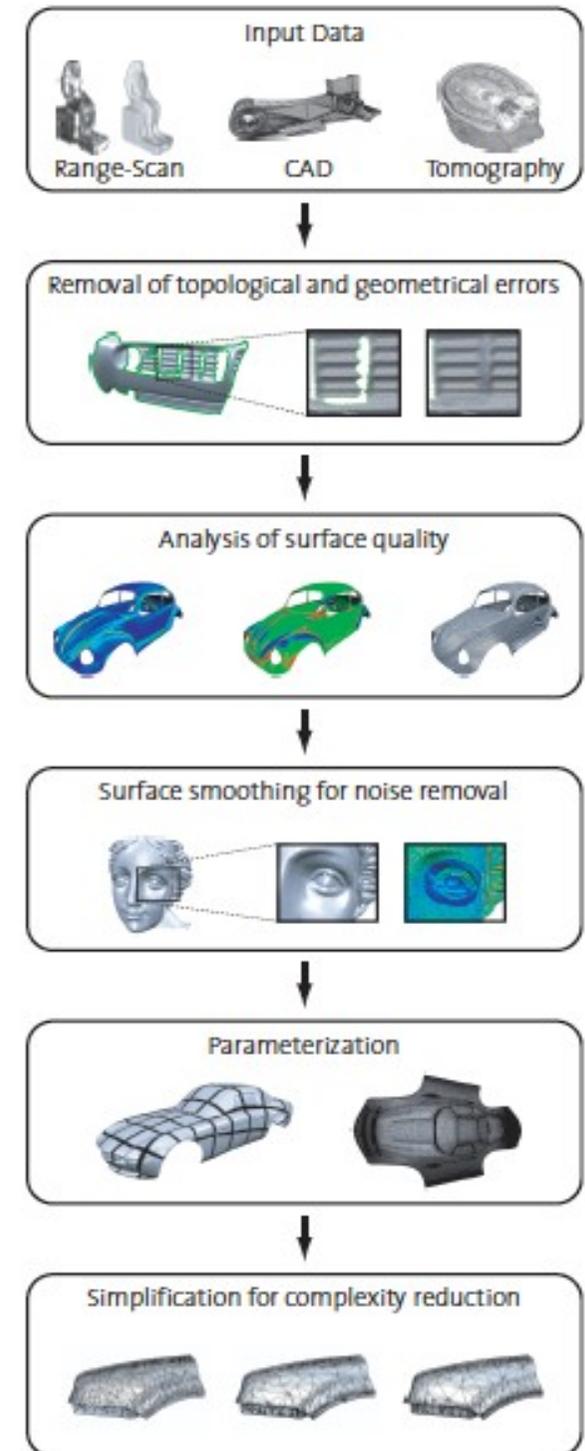


# Geometric Modeling

## Sources of 3D data

- Modeling programs
  - Autodesk
  - CATIA
  - Bryce
  - Pro/E
- 3D Scanning
  - LiDAR/Range Scanning
- Photogrammetry
  - Structure from motion
- Procedural methods
  - Program creates model algorithmically
- Typing it in....



# Digital Michelangelo

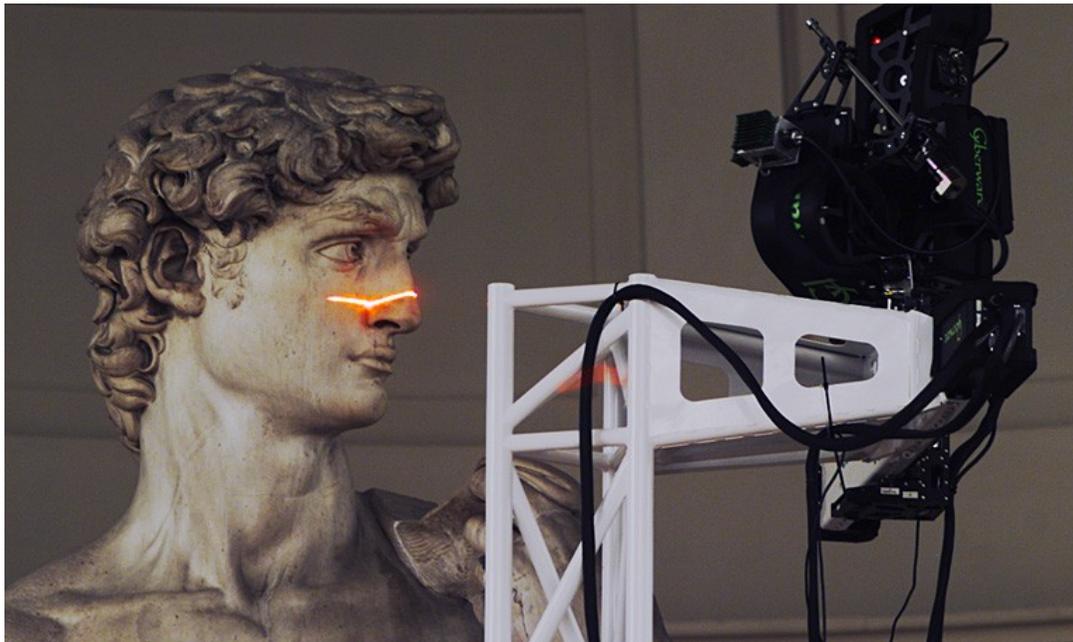
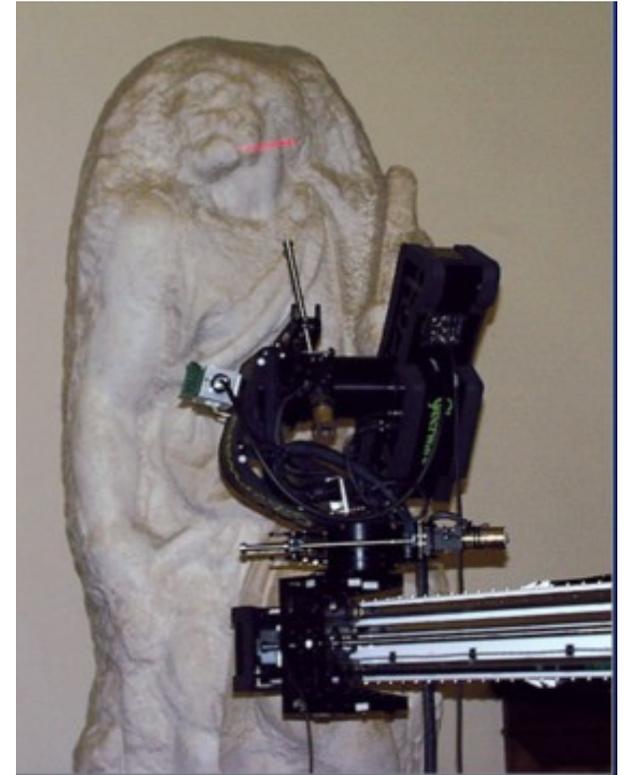
In 1998 Marc Levoy of Stanford  
scanned several of Michelangelo sculptures

David at 1mm resolution

St. Matthew at 290  $\mu\text{m}$  resolution

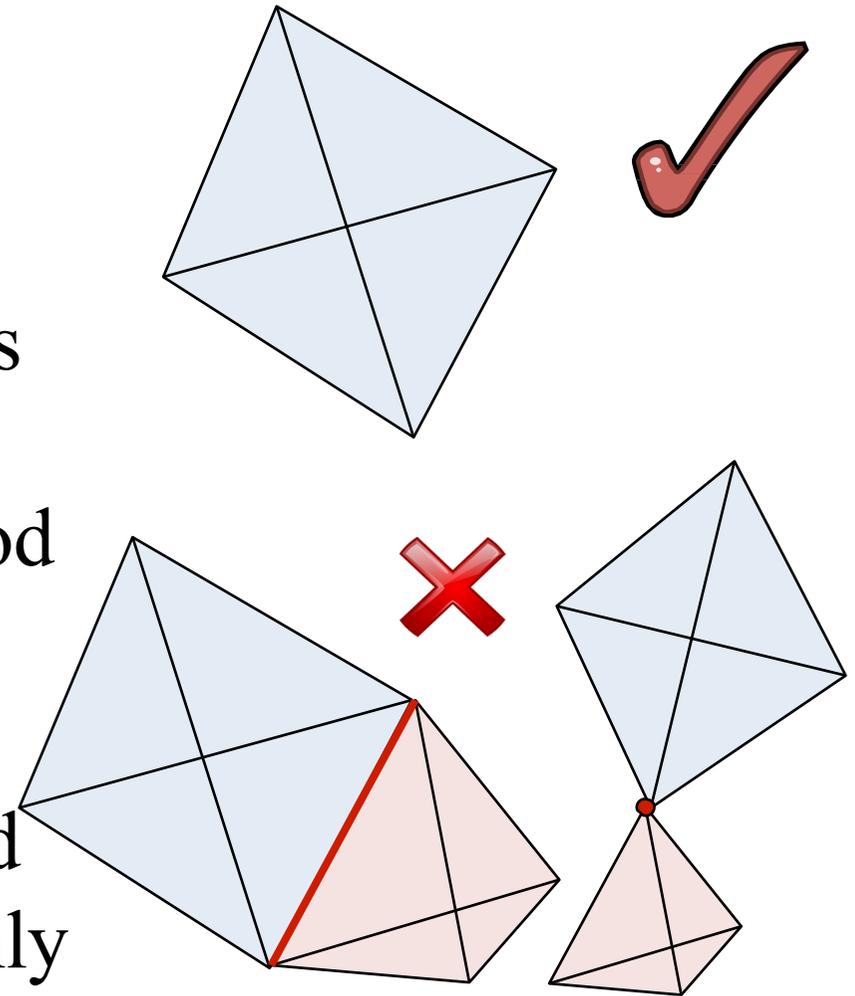
about 200M triangles

What does “scanning resolution” mean?



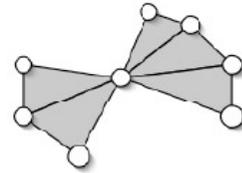
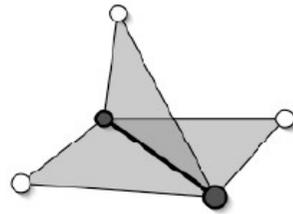
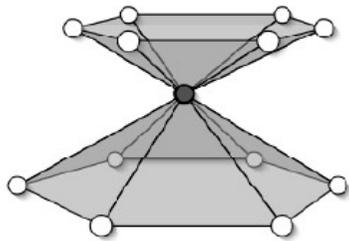
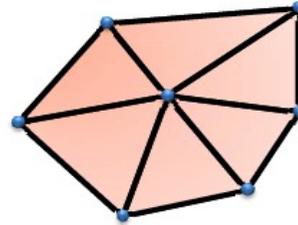
# Good Meshes

- Manifold:** 1. Every edge connects exactly two faces  
2. Vertex neighborhood is “disk-like”
- Orientable:** Consistent normals
- Watertight:** Orientable + Manifold
- Boundary:** Some edges bound only one face
- Ordering:** Vertices in CCW order when viewed from normal



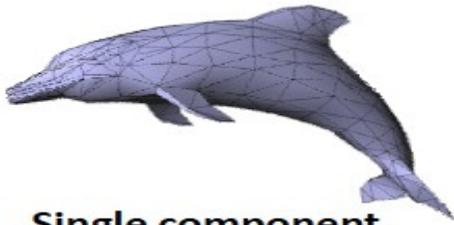
# 2-Manifold Meshes

Disk-shaped neighborhoods

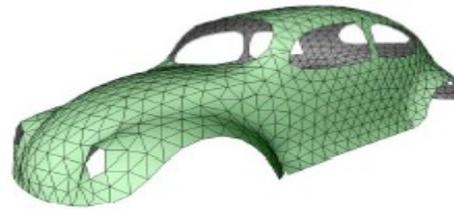


non-manifolds

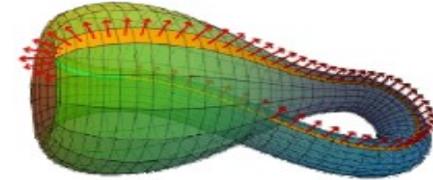
# Mesh Characteristics



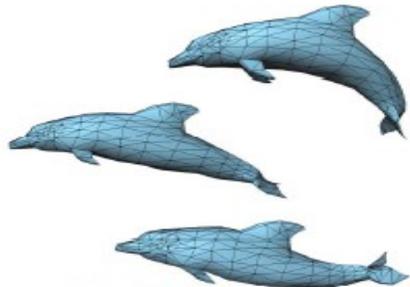
**Single component,  
closed, triangular,  
orientable manifold**



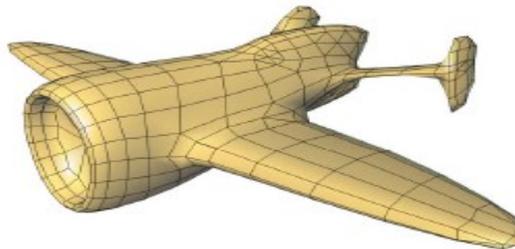
**With boundaries**



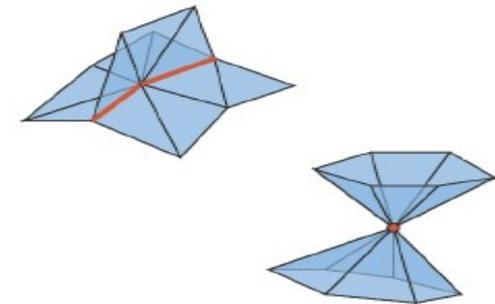
**Not orientable**



**Multiple components**



**Not only triangles**

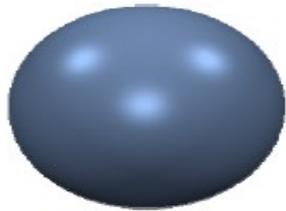


**Non manifold**

# Genus

## Genus:

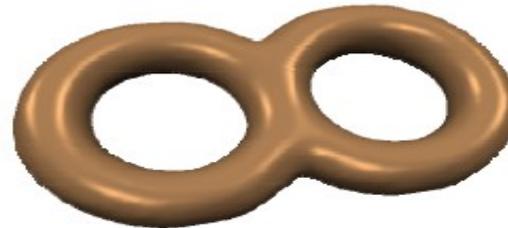
Half the maximal number of closed paths that do not disconnect the mesh (= the number of holes)



Genus 0



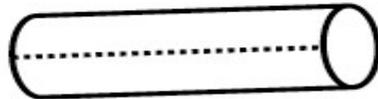
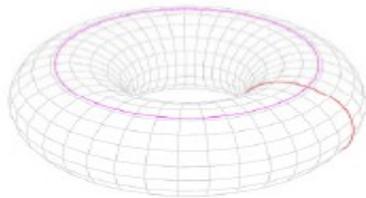
Genus 1



Genus 2



Genus ?



# Euler Formula

For a closed (no boundary), manifold, connected surface mesh:

$$V - E + F = 2(1 - G)$$

$V$  = number of vertices

$E$  = number of edges

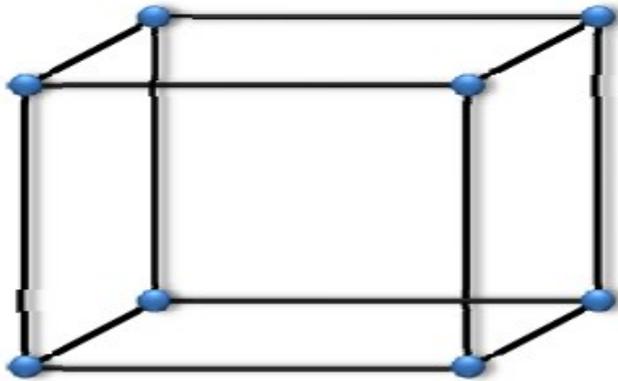
$F$  = number of faces

$G$  = genus (number of holes in the surface)

A **2-manifold** is a surface (locally like a plane)

# For Closed 2-Manifold Polygonal Meshes

$$V + F - E = \chi \quad \text{Euler characteristic}$$

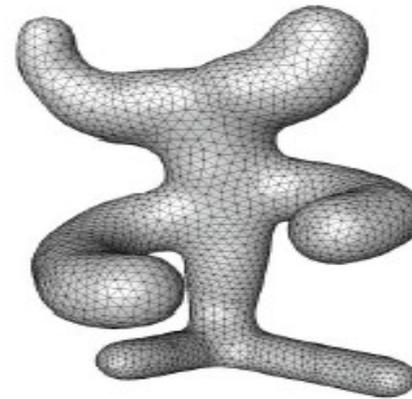


$$V = 8$$

$$E = 12$$

$$F = 6$$

$$\chi = 8 + 6 - 12 = \mathbf{2}$$



$$V = 3890$$

$$E = 11664$$

$$F = 7776$$

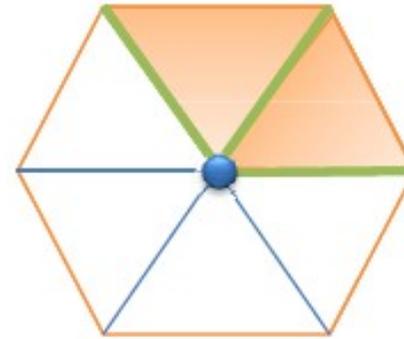
$$\chi = \mathbf{2}$$

# ...and if they are triangle meshes

- *Triangle* mesh statistics

$$E \approx 3V$$

$$F \approx 2V$$



- Avg. valence  $\approx 6$

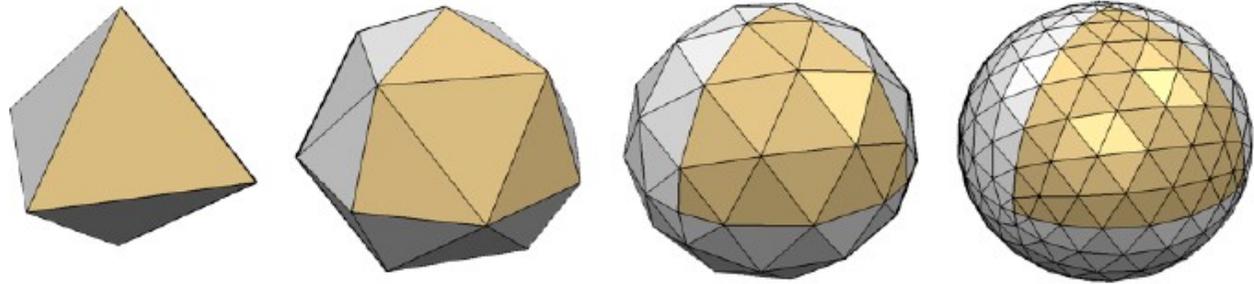
*Show using Euler Formula*



# Mesh Data Structures

## Need to store

Geometry  
Connectivity



Can be used as file formats or internal formats

## Considerations

Space  
Efficient operations

Mesh processing has different requirements than rendering

Example: Smoothing by averaging a vertex with neighbor vertices

# Face Set (STL)

- face:
  - 3 positions

Triangles								
x <sub>11</sub>	y <sub>11</sub>	z <sub>11</sub>	x <sub>12</sub>	y <sub>12</sub>	z <sub>12</sub>	x <sub>13</sub>	y <sub>13</sub>	z <sub>13</sub>
x <sub>21</sub>	y <sub>21</sub>	z <sub>21</sub>	x <sub>22</sub>	y <sub>22</sub>	z <sub>22</sub>	x <sub>23</sub>	y <sub>23</sub>	z <sub>23</sub>
...			...			...		
x <sub>F1</sub>	y <sub>F1</sub>	z <sub>F1</sub>	x <sub>F2</sub>	y <sub>F2</sub>	z <sub>F2</sub>	x <sub>F3</sub>	y <sub>F3</sub>	z <sub>F3</sub>

36 B/f = 72 B/v  
no connectivity!

# Indexed Face Set (OBJ)

- vertex:
  - position
- face:
  - vertex indices

Vertices	Triangles
$x_1 \ y_1 \ z_1$	$v_{11} \ v_{12} \ v_{13}$
...	...
$x_v \ y_v \ z_v$	...
	...
	...
	$v_{f1} \ v_{f2} \ v_{f3}$

$12 \text{ B/v} + 12 \text{ B/f} = 36 \text{ B/v}$   
no neighborhood info

# Half-Edge Data Structure

Consists of 3 tables (or arrays)

- Vertex table
- Halfedge table
- Face table

- **vertex**

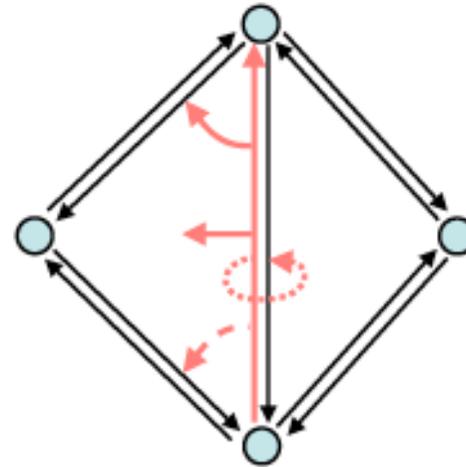
- position
- 1 halfedge

- **halfedge**

- 1 vertex
- 1 face
- 1, 2, or 3 halfedges

- **face**

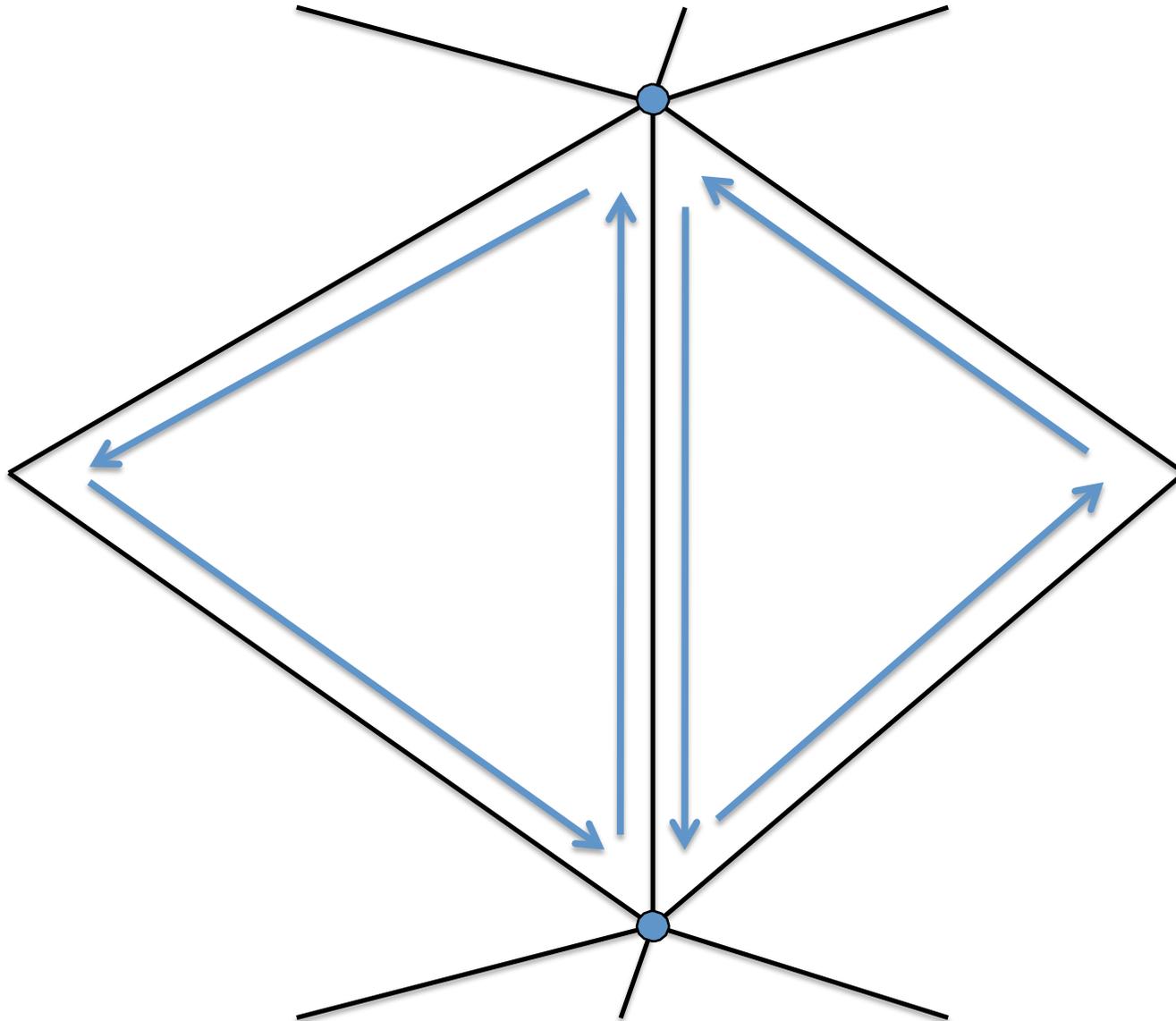
- 1 halfedge



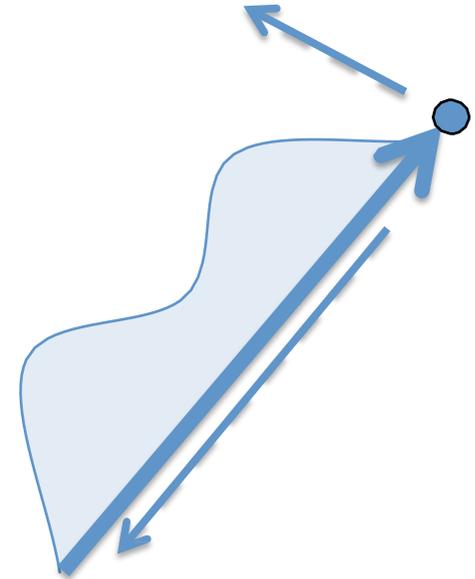
96 to 144 B/v

no case distinctions  
during traversal

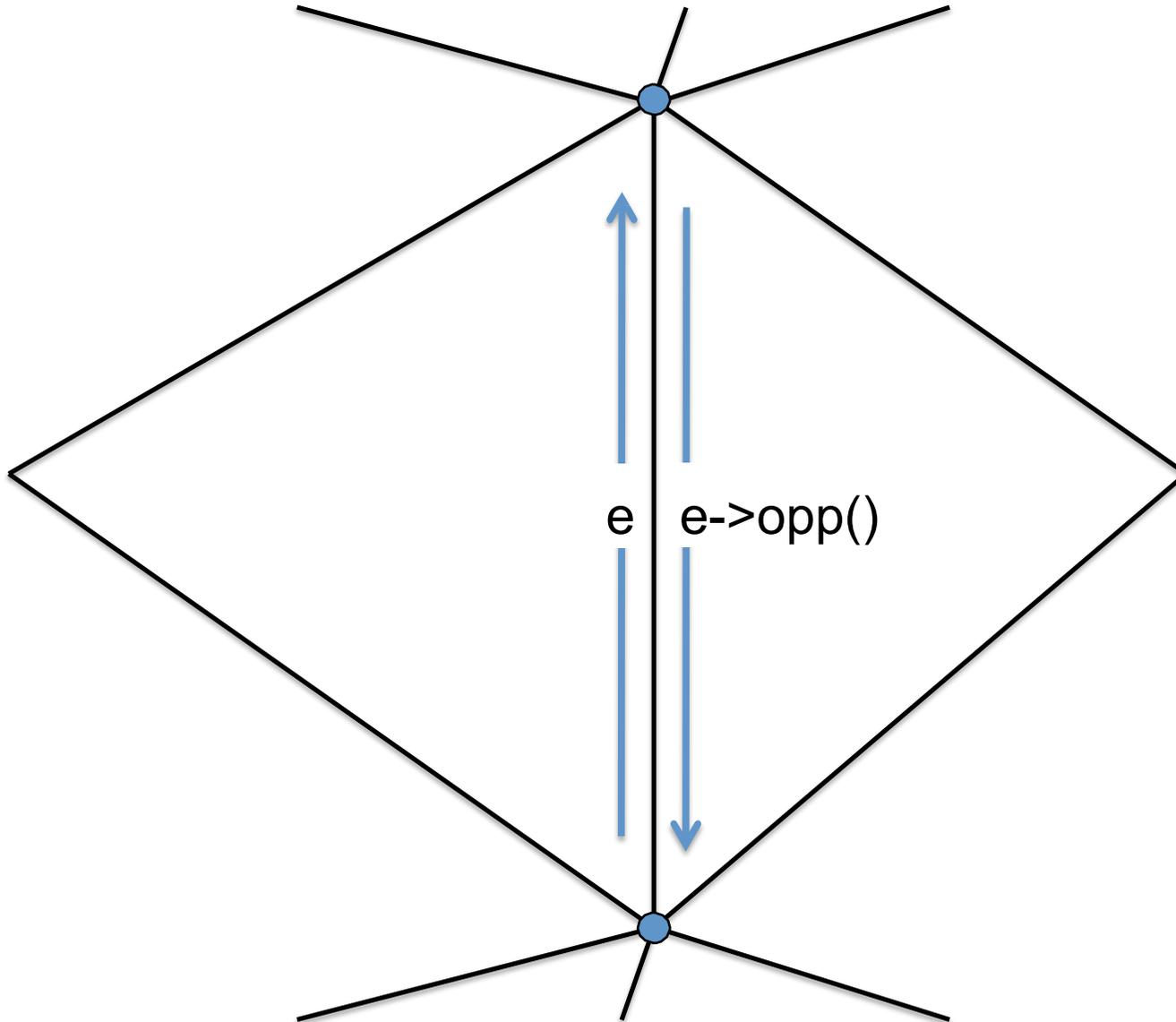
# Half Edge



```
class HalfEdge {  
    HalfEdge *opp;  
    Vertex *end;  
    Face *left;  
    HalfEdge *next;  
};  
  
HalfEdge e;
```

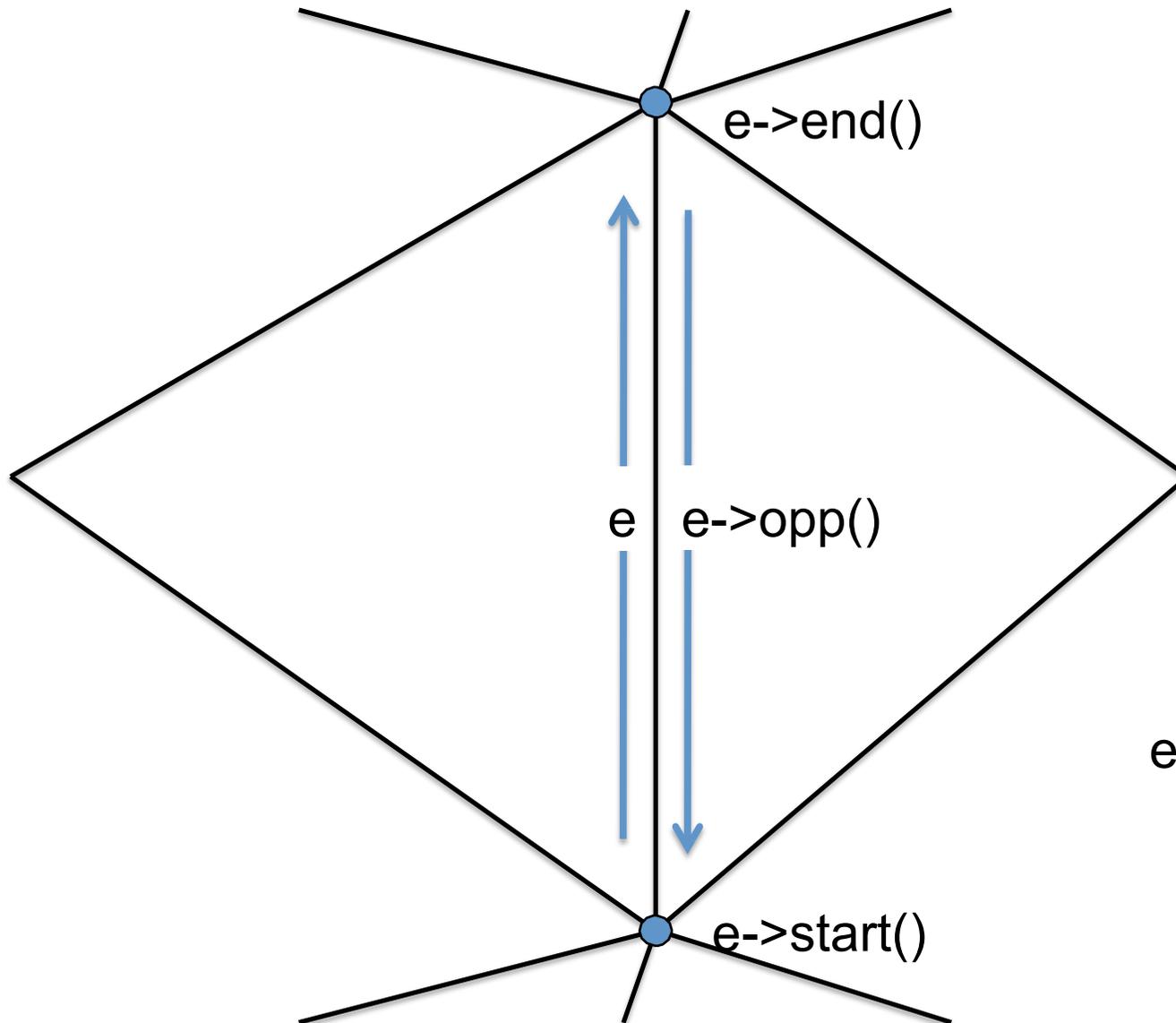


# Half Edge



```
class HalfEdge {  
    HalfEdge *opp;  
    Vertex *end;  
    Face *left;  
    HalfEdge *next;  
};  
  
HalfEdge e;
```

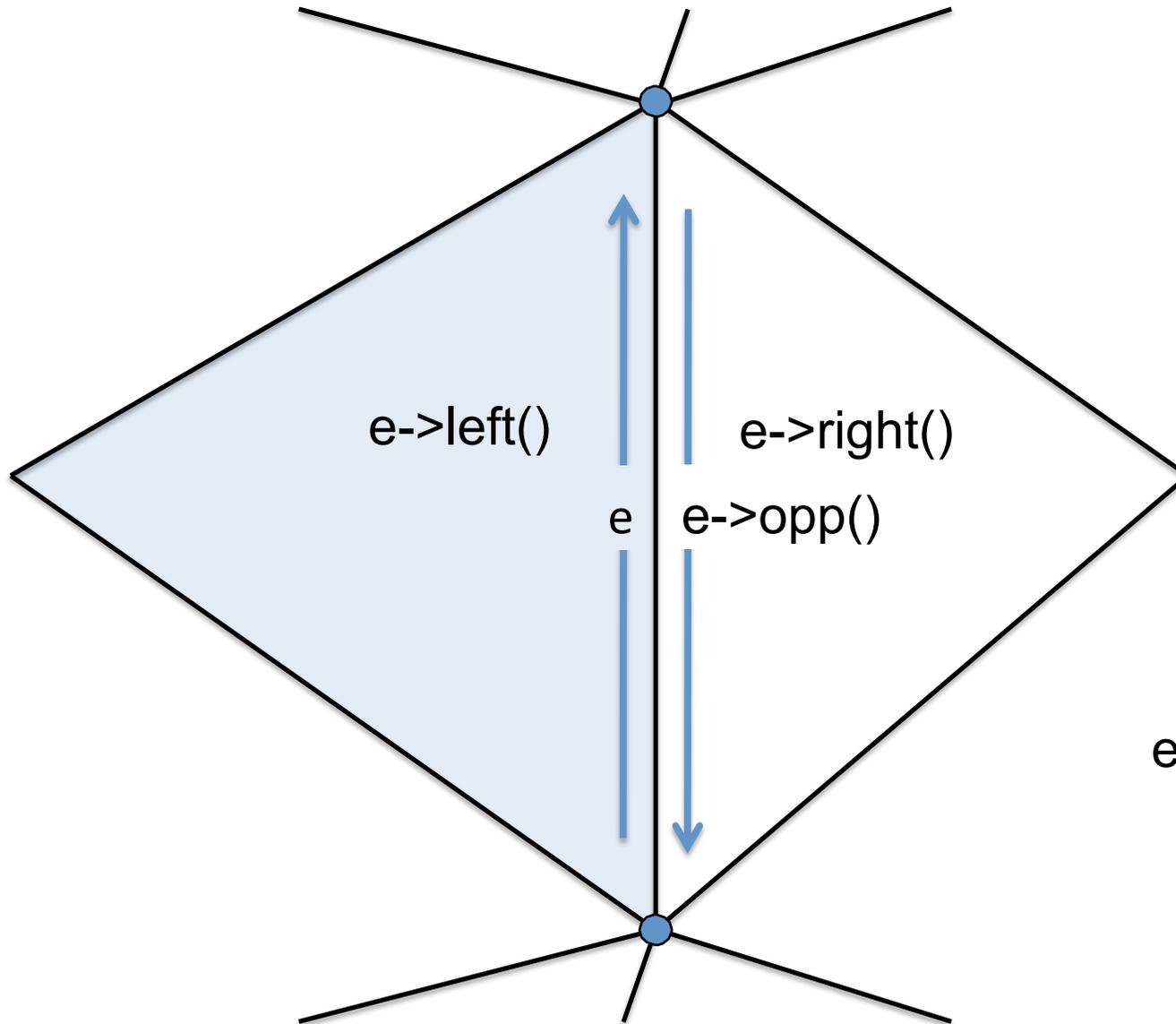
# Half Edge



```
class HalfEdge {  
    HalfEdge *opp;  
    Vertex *end;  
    Face *left;  
    HalfEdge *next;  
};  
  
HalfEdge e;
```

`e->start() = e->opp()->end();`

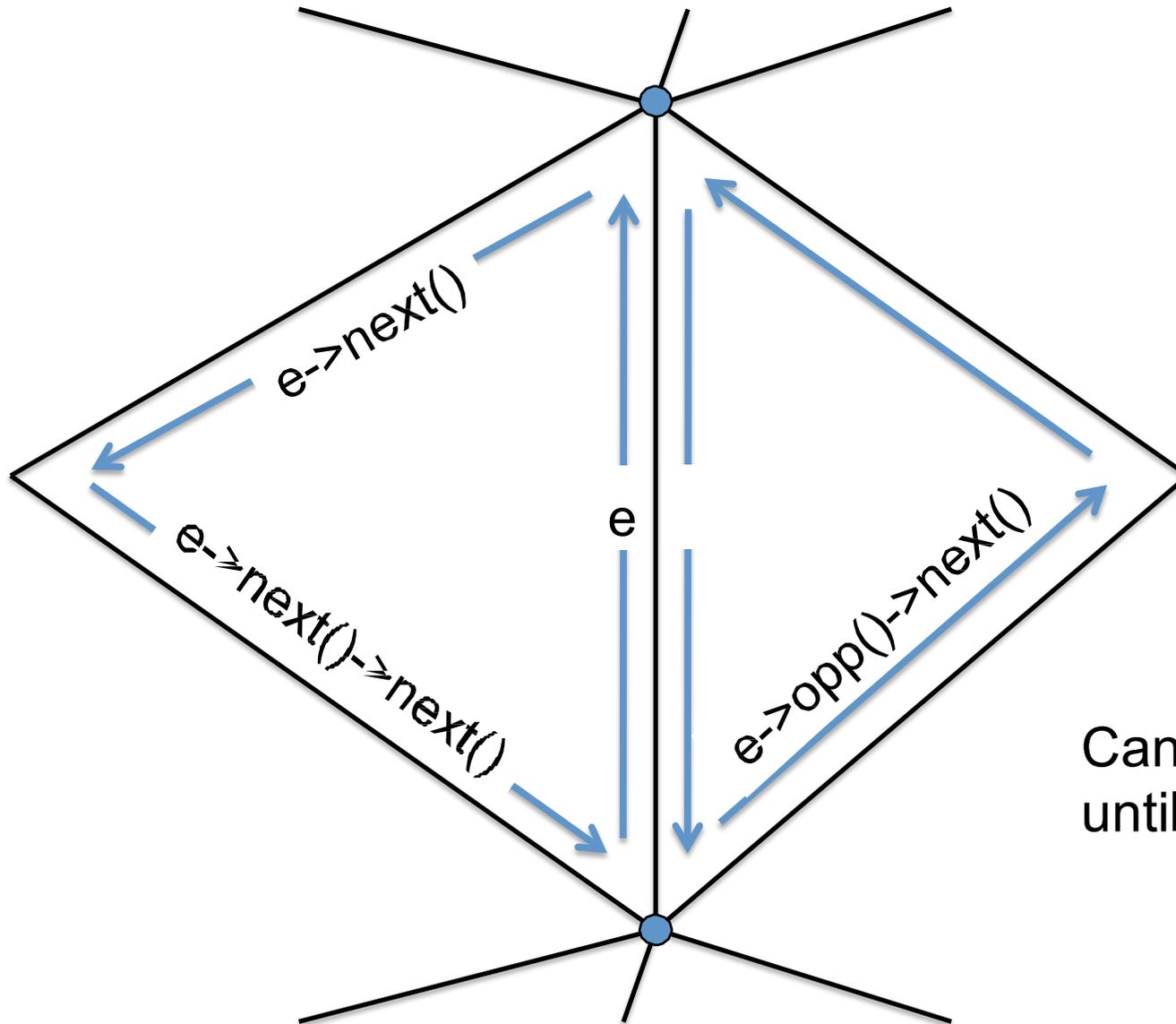
# Half Edge



```
class HalfEdge {  
    HalfEdge *opp;  
    Vertex *end;  
    Face *left;  
    HalfEdge *next;  
};  
  
HalfEdge e;
```

$e \rightarrow \text{right}() = e \rightarrow \text{opp}() \rightarrow \text{left}();$

# Half Edge



```
class HalfEdge {
    HalfEdge *opp;
    Vertex *end;
    Face *left;
    HalfEdge *next;
};

HalfEdge e;
```

Can walk around left face  
until  $e(->next)^n = e$

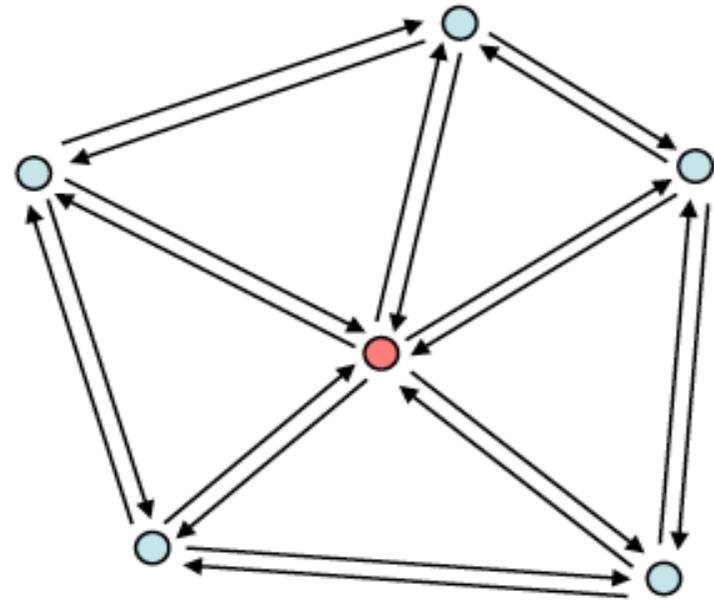
# Vertex Star and 1-Rings

**Vertex Star:** A set consisting of

- the vertex
- its incident edges,
- neighboring vertices

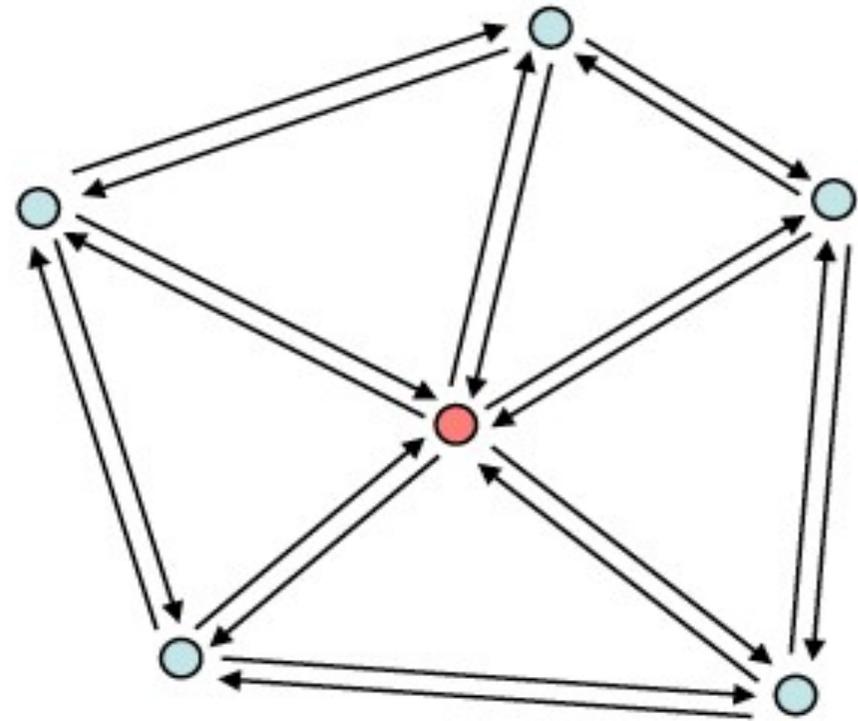
**1- Ring:** A set consisting of all incident

- Edges
- Faces
- Neighboring vertices



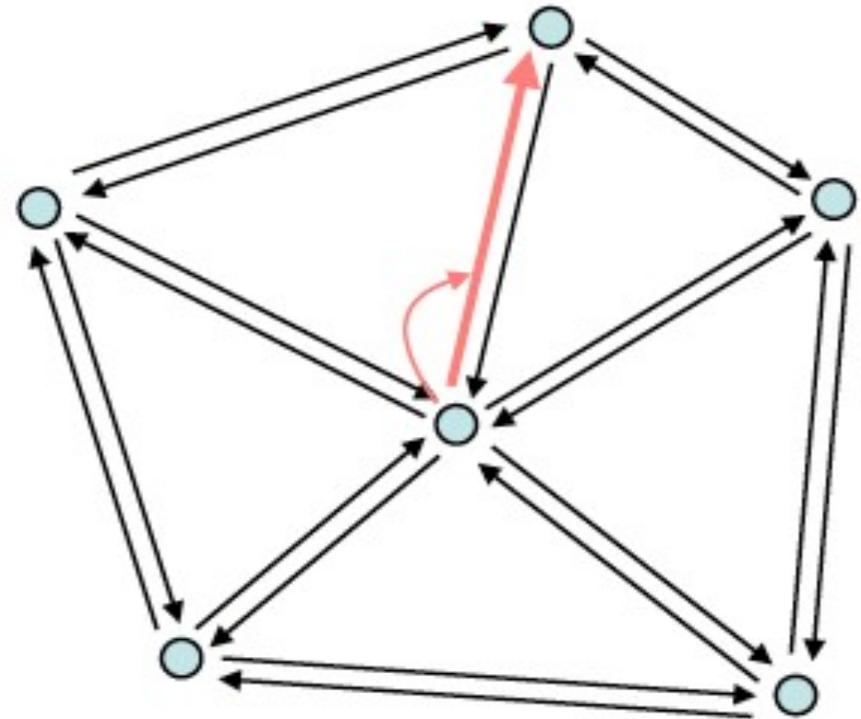
# 1-Ring Traversal

1. Start at vertex



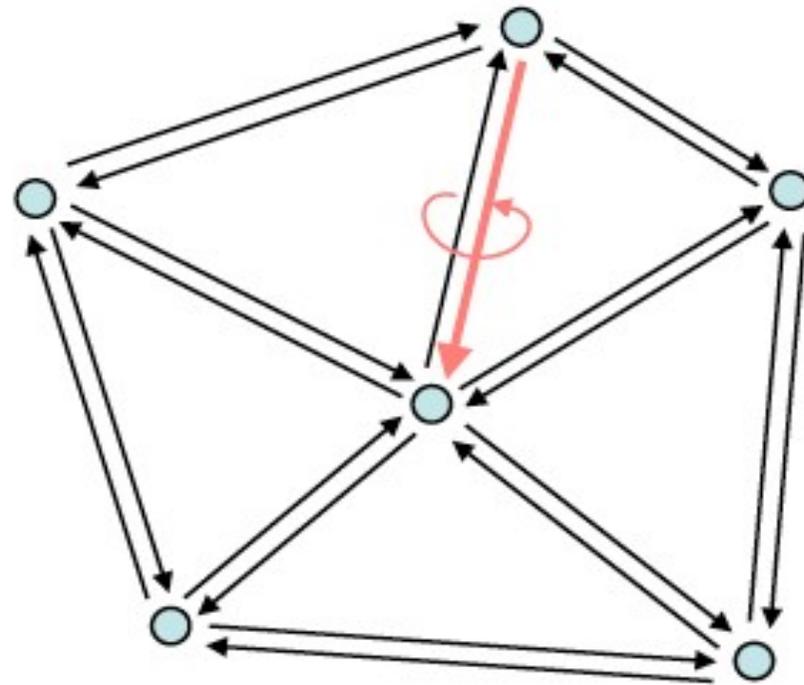
# 1-Ring Traversal

1. Start at vertex
2. Outgoing halfedge



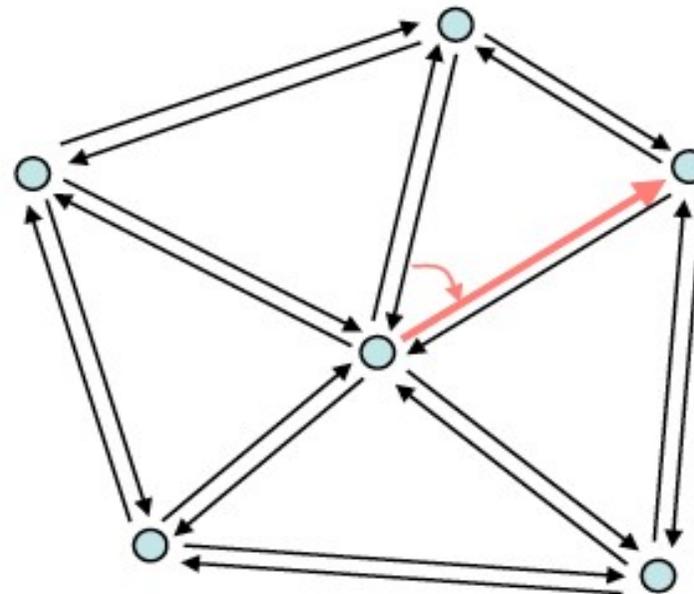
# 1-Ring Traversal

1. Start at vertex
2. Outgoing halfedge
3. Opposite halfedge



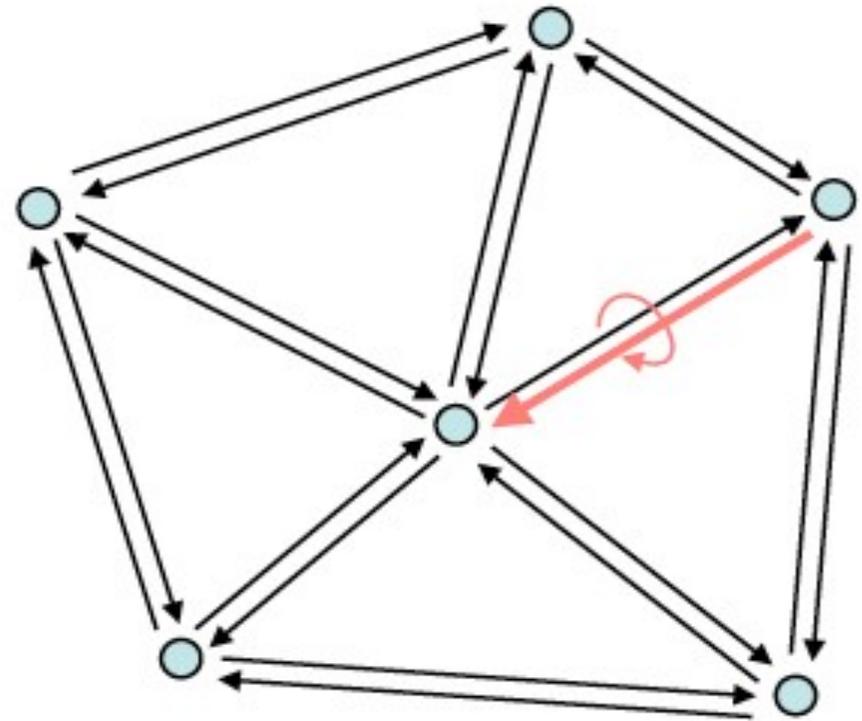
# 1-Ring Traversal

1. Start at vertex
2. Outgoing halfedge
3. Opposite halfedge
4. Next halfedge



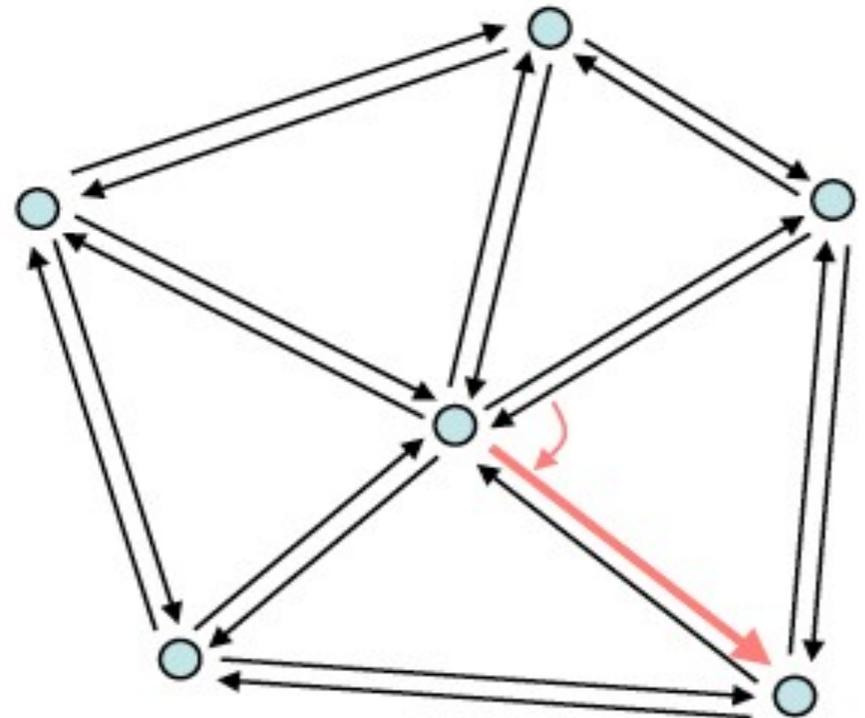
# 1-Ring Traversal

1. Start at vertex
2. Outgoing halfedge
3. Opposite halfedge
4. Next halfedge
5. Opposite



# 1-Ring Traversal

1. Start at vertex
2. Outgoing halfedge
3. Opposite halfedge
4. Next halfedge
5. Opposite
6. Next
7. ....



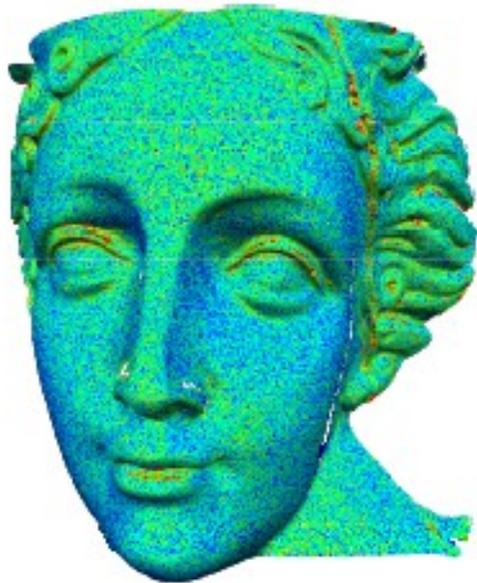
# Mesh Smoothing

(aka Denoising, Filtering, Fairing)

**Input:** Noisy mesh (scanned or other)

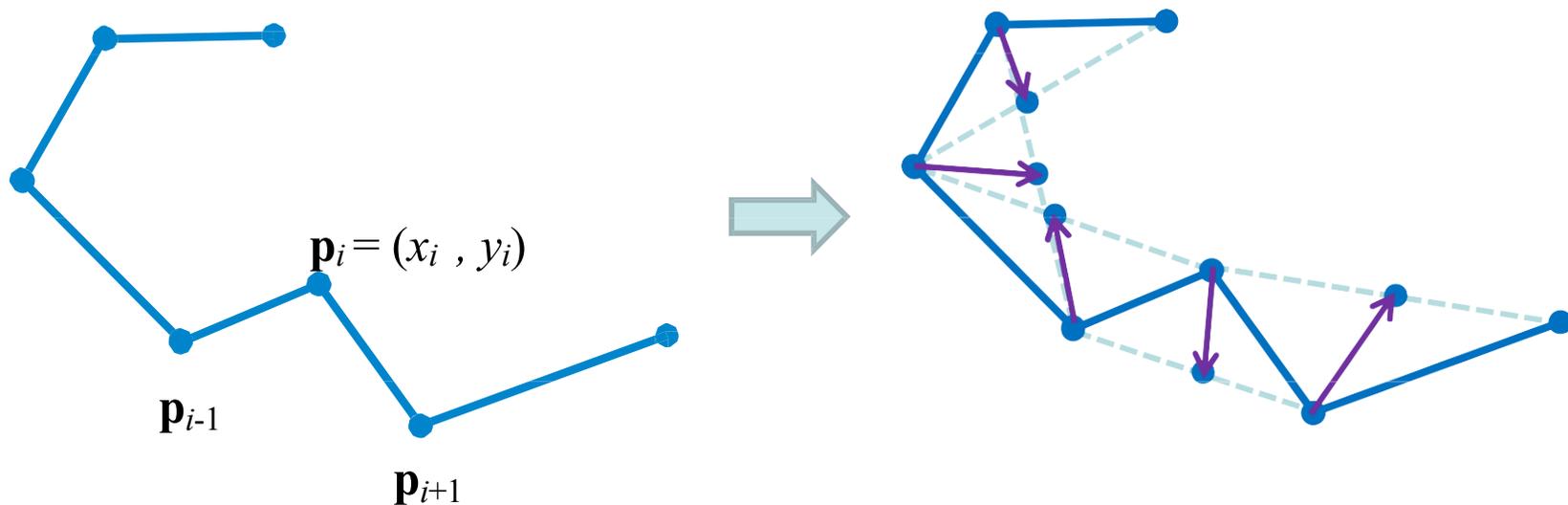
**Output:** Smooth mesh

**How:** Filter out high frequency noise



# Laplacian Smoothing

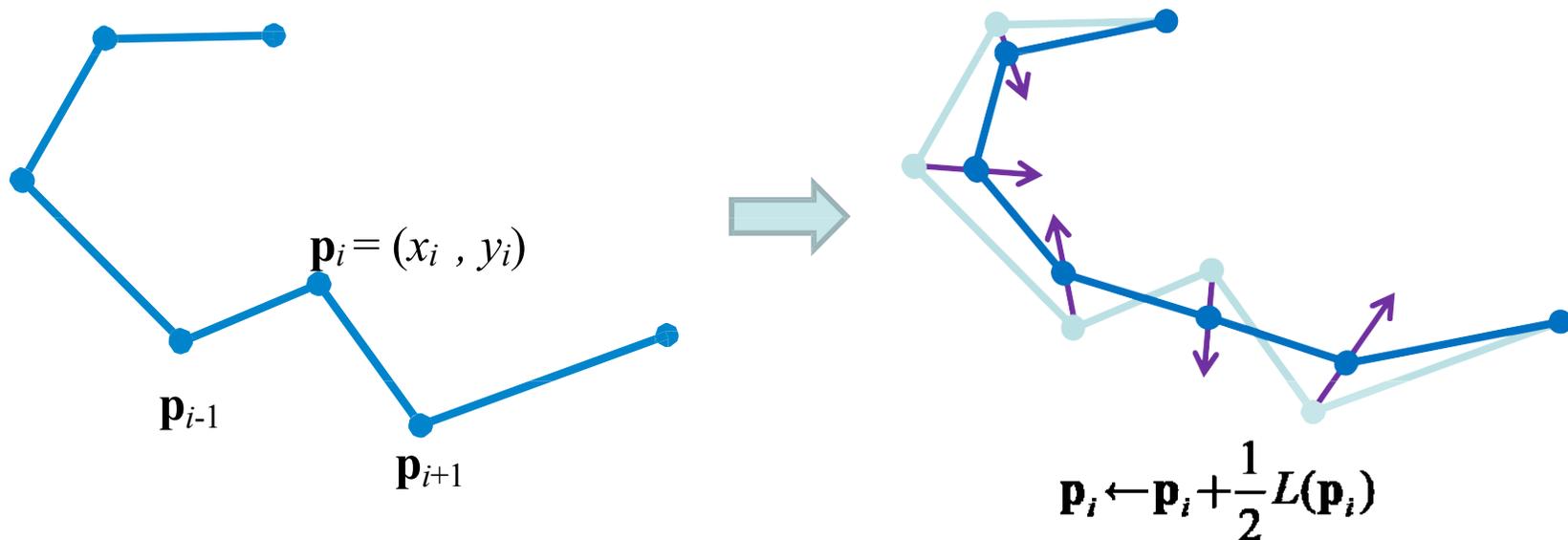
An easier problem: How to smooth a curve?



$$L(\mathbf{p}_i) = \frac{1}{2}(\mathbf{p}_{i+1} - \mathbf{p}_i) + \frac{1}{2}(\mathbf{p}_{i-1} - \mathbf{p}_i)$$

# Laplacian Smoothing

An easier problem: How to smooth a curve?



Finite difference  
discretization of second  
derivative  
= Laplace operator in  
one dimension

$$L(\mathbf{p}_i) = \frac{1}{2}(\mathbf{p}_{i+1} - \mathbf{p}_i) + \frac{1}{2}(\mathbf{p}_{i-1} - \mathbf{p}_i)$$

# Laplacian Smoothing

Algorithm:

Repeat for  $m$  iterations (for non boundary points):

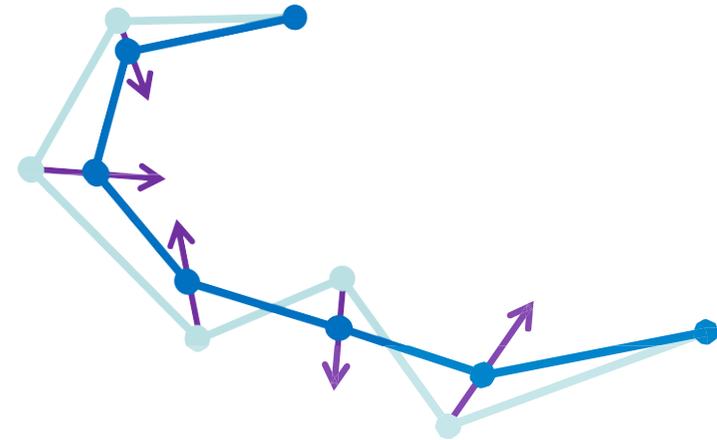
$$\mathbf{p}_i \leftarrow \mathbf{p}_i + \lambda L(\mathbf{p}_i)$$

For which  $\lambda$ ?

$$0 < \lambda < 1$$

Closed curve converges to?

Single point



# Laplacian Smoothing on Meshes

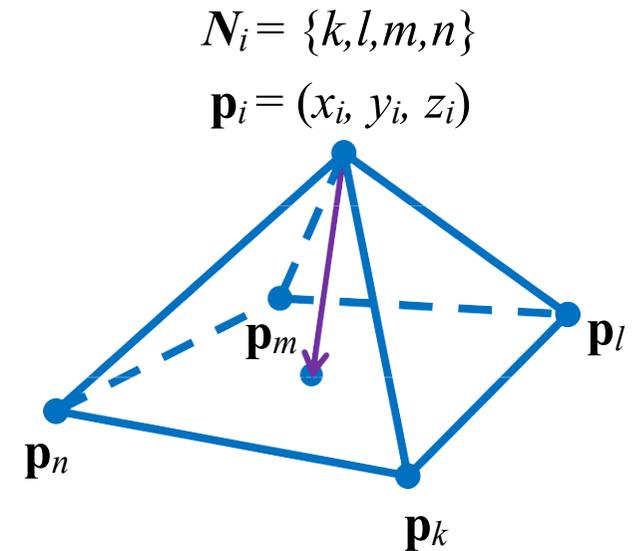
Same as for curves:

$$\mathbf{p}_i^{(t+1)} = \mathbf{p}_i^{(t)} + \lambda \Delta \mathbf{p}_i^{(t)}$$

What is  $\Delta \mathbf{p}_i$  ?

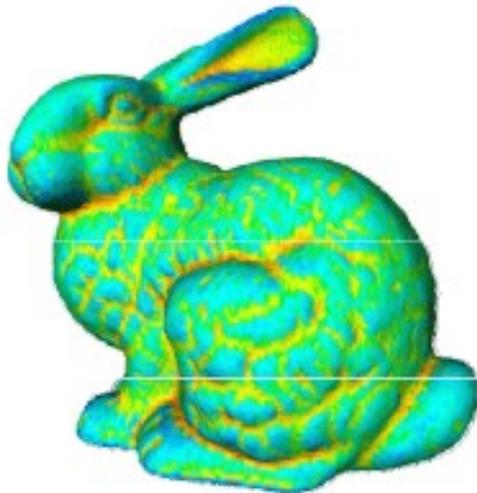


$$\frac{1}{2}(\mathbf{p}_{i+1} + \mathbf{p}_{i-1}) - \mathbf{p}_i$$

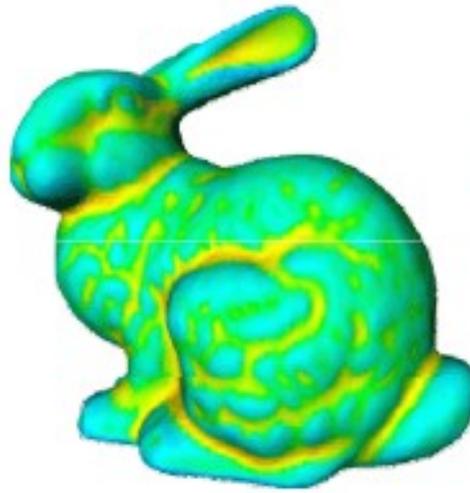


$$\frac{1}{|N_i|} \left( \sum_{j \in N_i} \mathbf{p}_j \right) - \mathbf{p}_i$$

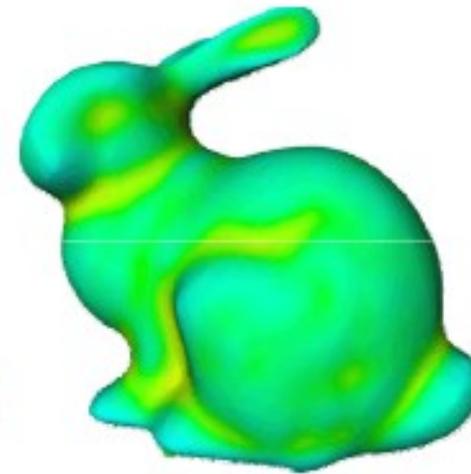
# Laplacian Smoothing on Meshes



0 Iterations



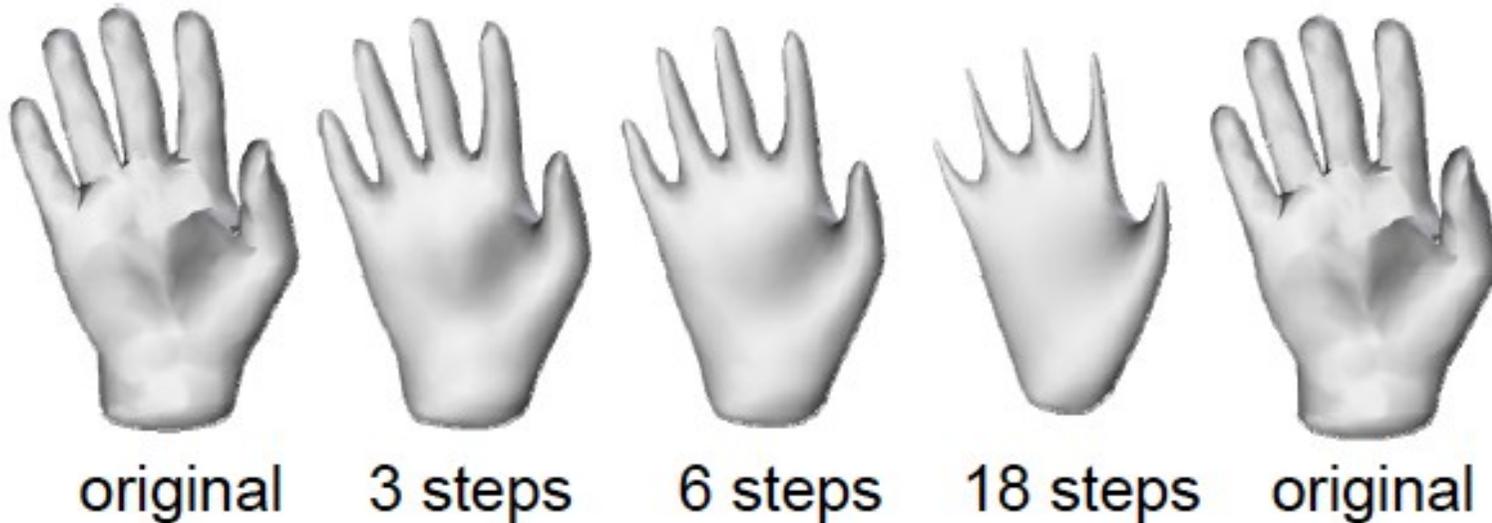
5 Iterations



20 Iterations

# Problem - Shrinkage

Repeated iterations of Laplacian smoothing shrinks the mesh



# Taubin Smoothing

Iterate:

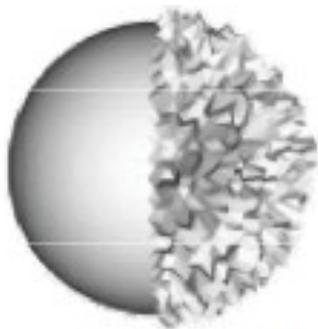
$$\mathbf{p}_i \leftarrow \mathbf{p}_i + \lambda \Delta \mathbf{p}_i$$

$$\mathbf{p}_i \leftarrow \mathbf{p}_i + \mu \Delta \mathbf{p}_i$$

with  $\lambda > 0$  and  $\mu < 0$

Shrink

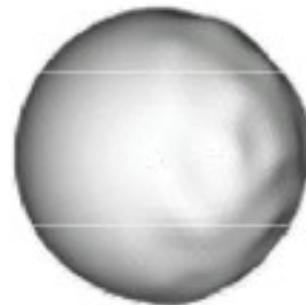
Inflate



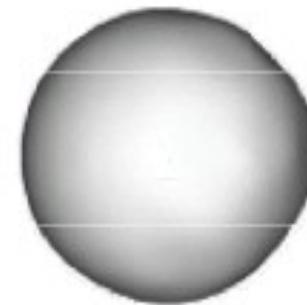
original



10 steps



50 steps

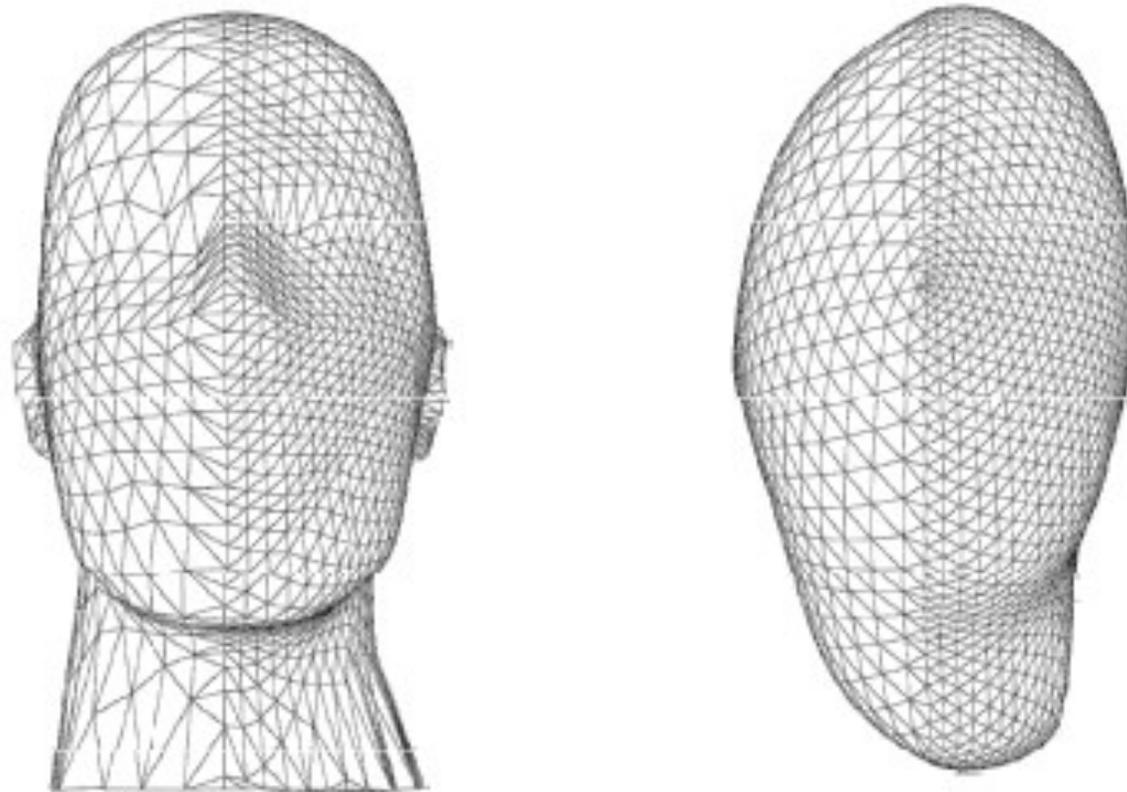


200 steps

# Laplace Operator Discretization

## The Problem

The result should not depend on triangle sizes



# Laplace Operator Discretization

What Went Wrong?

Back to curves:

$$\frac{1}{2}(\mathbf{p}_{i+1} + \mathbf{p}_{i-1}) - \mathbf{p}_i$$



Same weight for both neighbors,  
although one is closer

# Laplace Operator Discretization

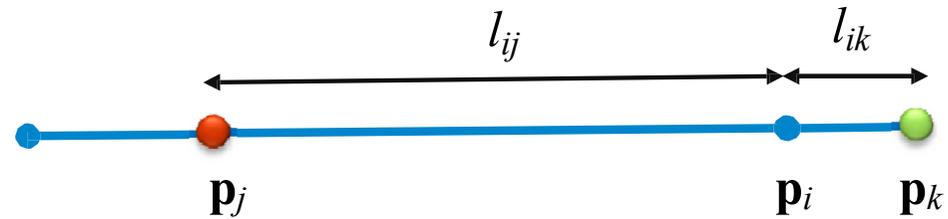
## The Solution

Use a weighted average to define  $\Delta$

Which weights?

$$w_{ij} = \frac{1}{l_{ij}}$$

$$w_{ik} = \frac{1}{l_{ik}}$$



$$L(\mathbf{p}_i) = \frac{w_{ij}\mathbf{p}_j + w_{ik}\mathbf{p}_k}{w_{ij} + w_{ik}} - \mathbf{p}_i$$

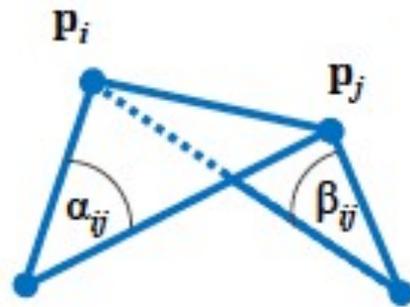
Straight curves will be invariant to smoothing

# Laplace Operator Discretization

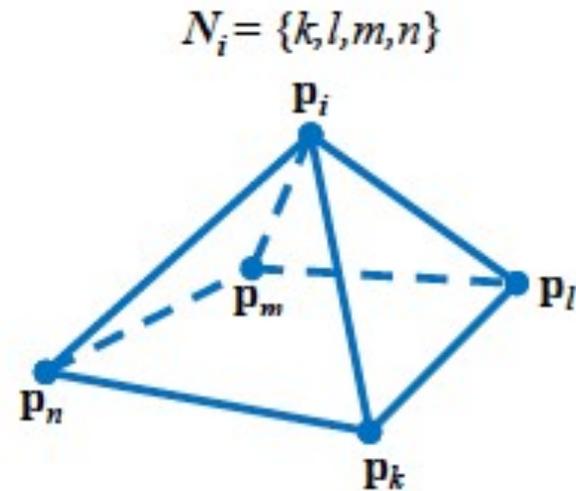
## Cotangent Weights

Use a weighted average to define  $\Delta$

Which weights?



$$w_{ij} = \frac{h_{ij}^1 + h_{ij}^2}{l_{ij}} = \frac{1}{2} (\cot \alpha_{ij} + \cot \beta_{ij})$$



$$L(\mathbf{p}_i) = \frac{1}{\sum w_{ij}} \sum_{j \in N_i} w_{ij} (\mathbf{p}_j - \mathbf{p}_i)$$

Planar meshes will be invariant to smoothing

# Contangent Weights

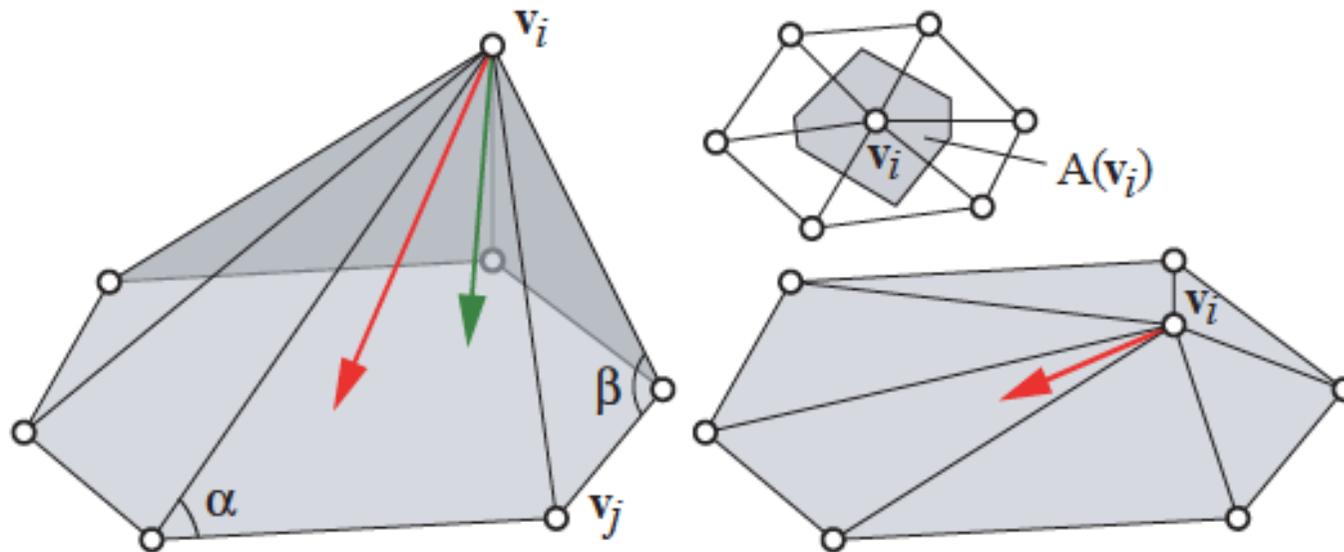
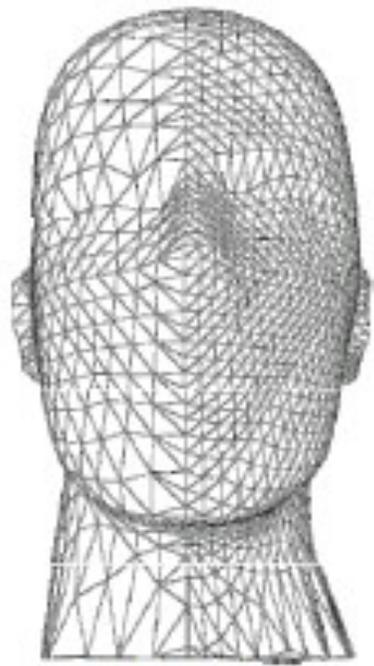
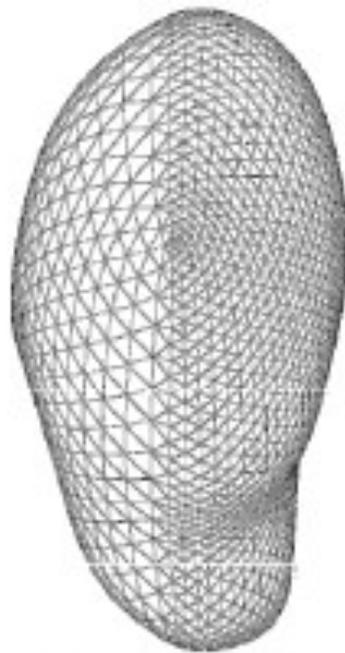


Figure 4: Left: uniform (red) and cotangent (green) Laplacian vectors for a vertex  $v_i$  and its (in this case planar) 1-ring, as well as the angles used in Eqn. 4 for one  $v_j$ , Bottom right: the effect of flattening  $v_i$  into the 1-ring plane. While the cotangent Laplacian vanishes, the uniform Laplacian generally does not. Right top: the Voronoi region  $A(v_i)$  around a vertex.

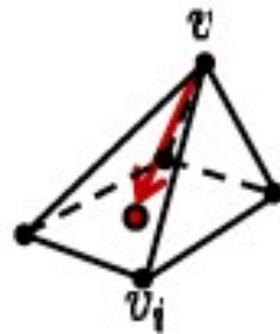
# Smoothing with the Cotangent Laplacian



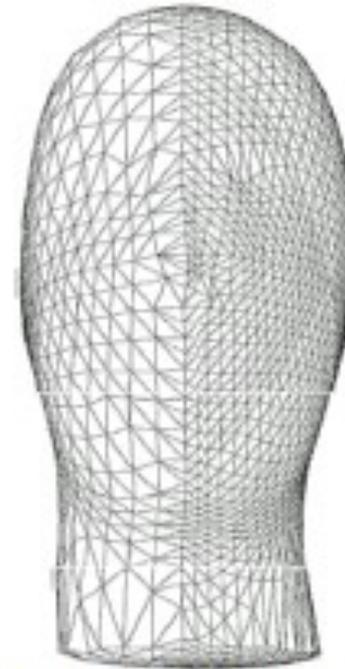
original



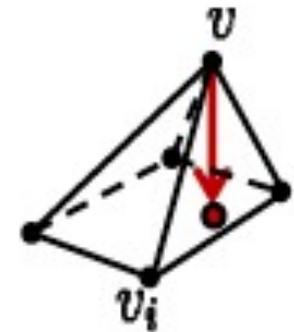
Uniform weights



normal  
and  
tangential  
movement



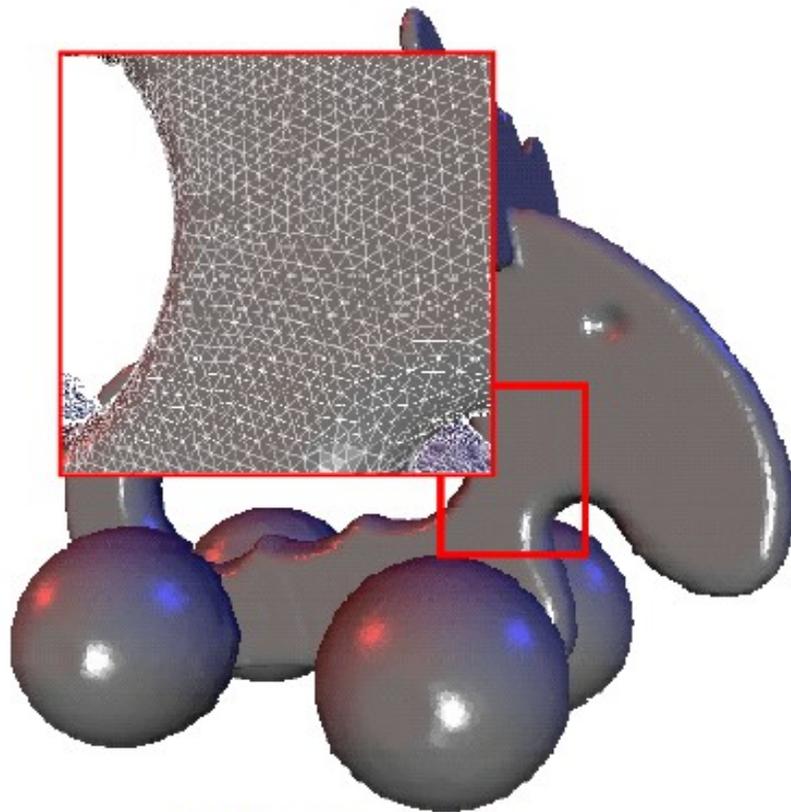
Cotangent weights



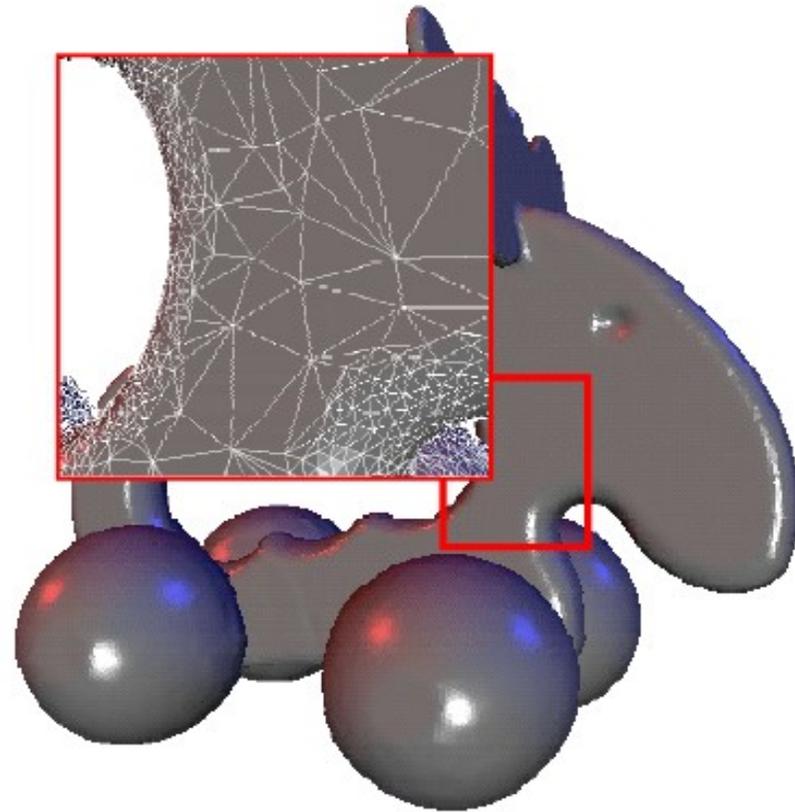
normal  
movement

# Mesh Simplification

- Oversampled 3D scan data



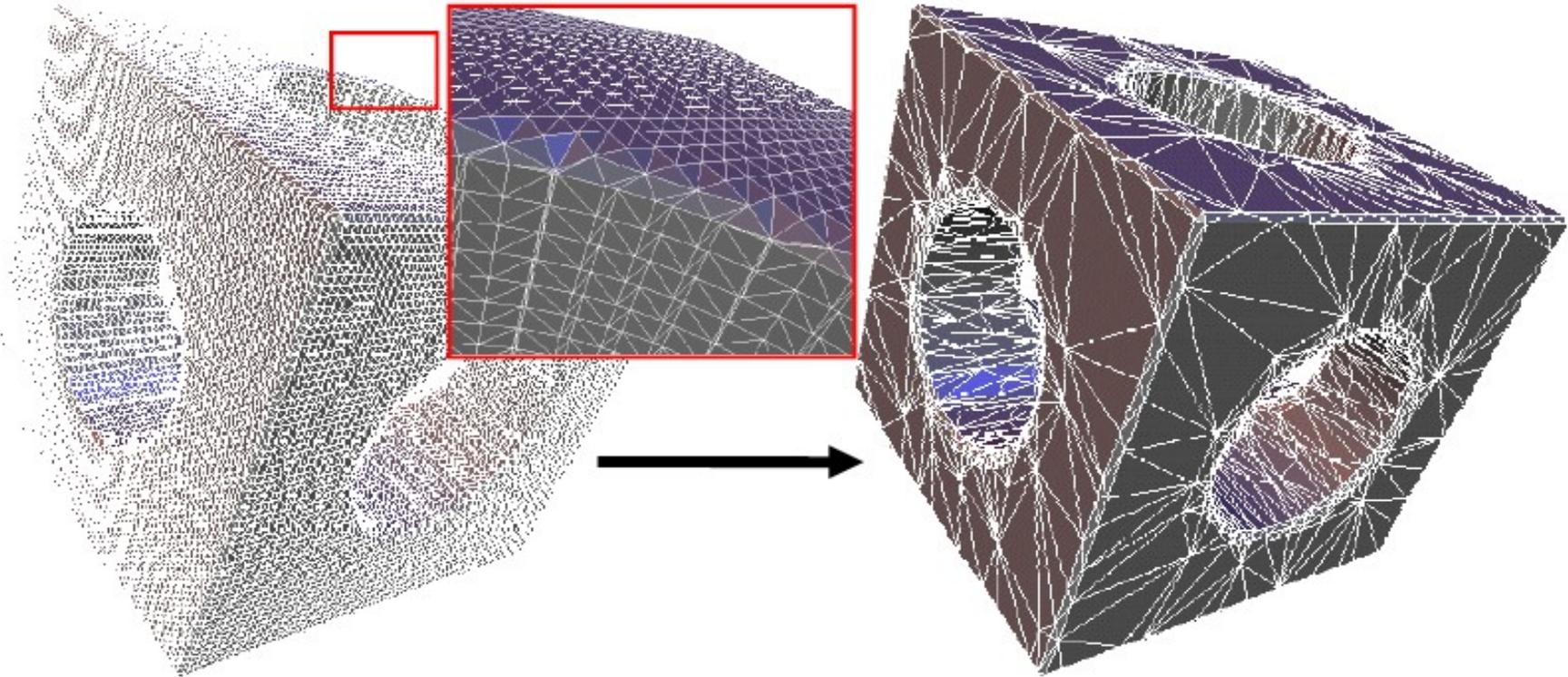
~150k triangles



~80k triangles

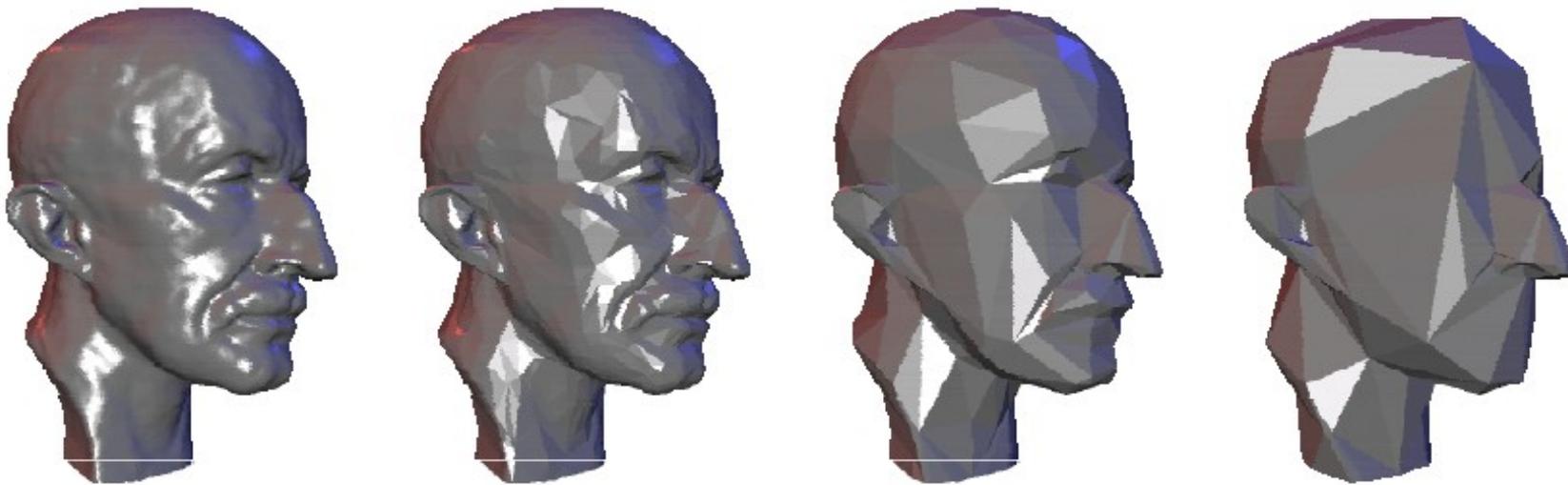
# Simplification: Applications

- Overtessellation: E.g. iso-surface extraction



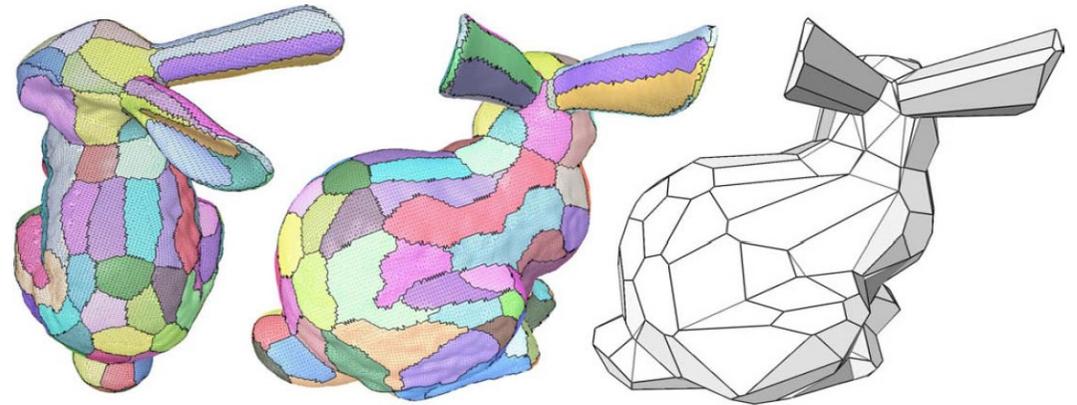
# Simplification: Applications

- Multi-resolution hierarchies for
  - efficient geometry processing
  - level-of-detail (LOD) rendering



# Mesh Decimation Methods

- **Vertex clustering**
- **Incremental decimation**
- Resampling
- Mesh approximation

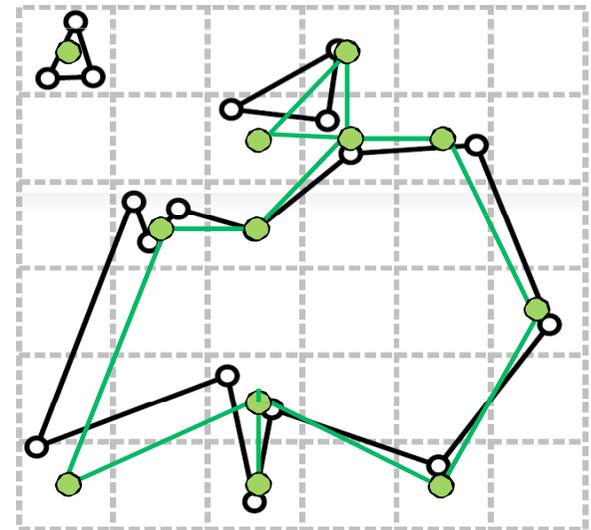


# Vertex Clustering

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

# Vertex Clustering

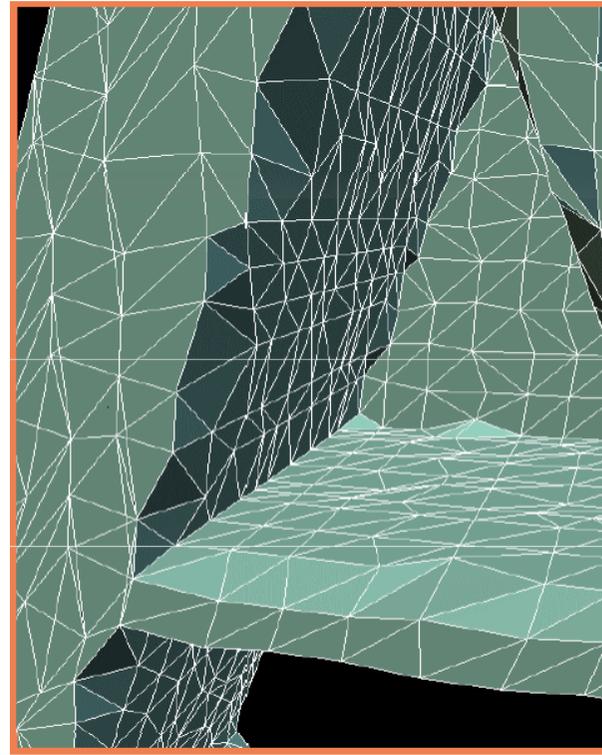
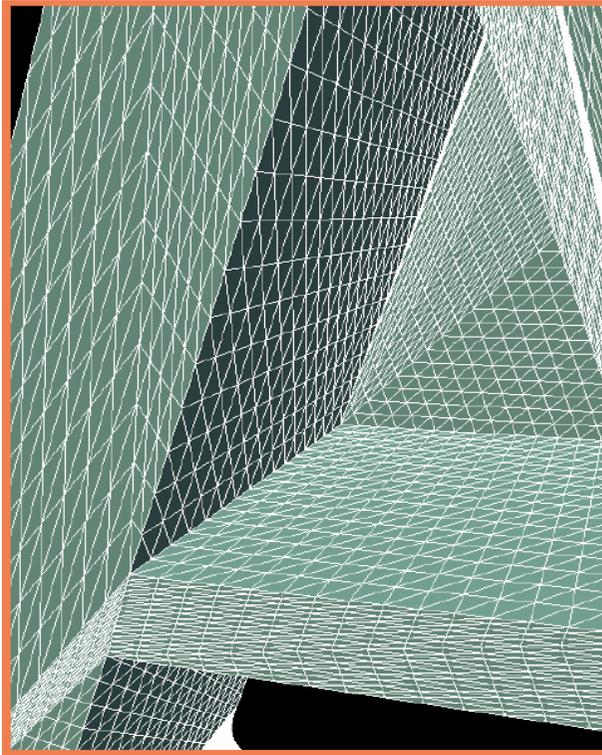
- Cluster Generation
  - Uniform 3D grid
  - Map vertices to cluster cells
- Computing a representative
- Mesh generation
- Topology changes



# Vertex Clustering

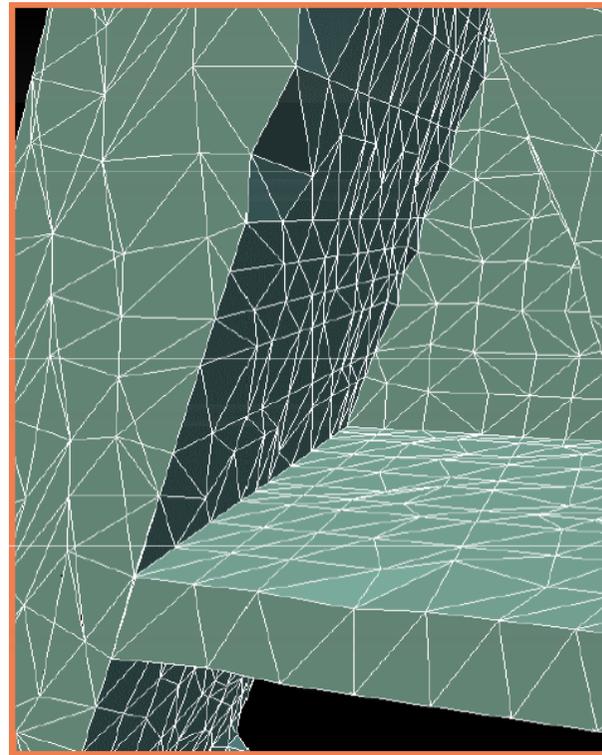
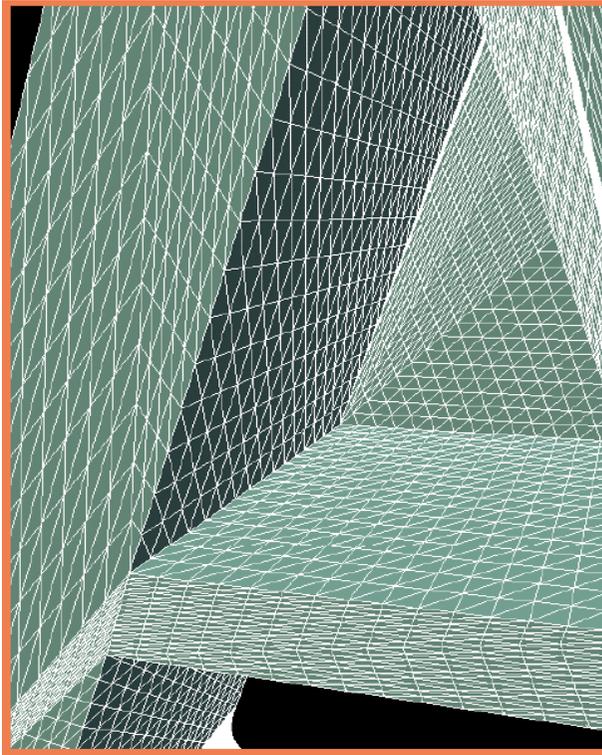
- Cluster Generation
- Computing a representative
  - Average/median vertex position
  - Error quadrics
- Mesh generation
- Topology changes

# Computing a Representative



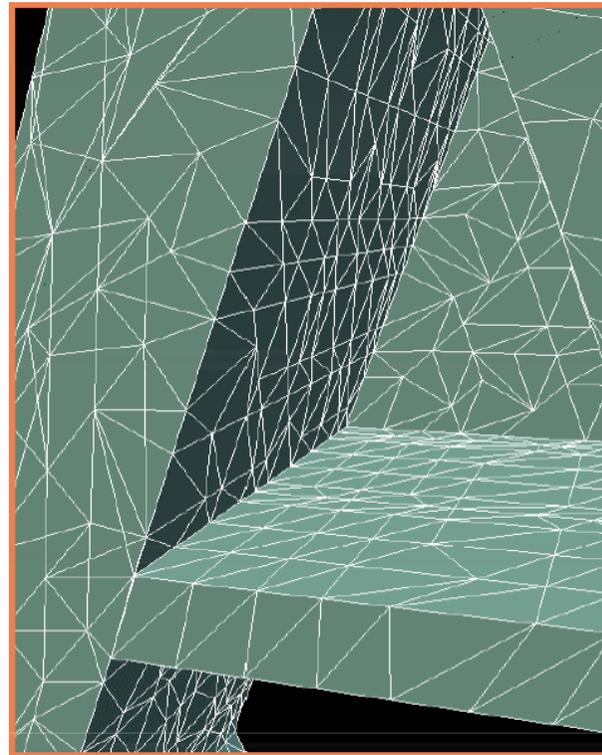
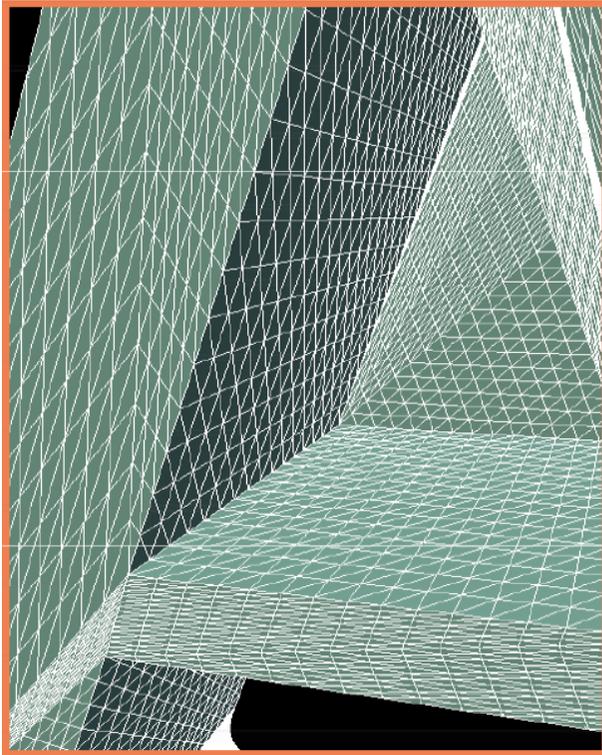
Average vertex position

# Computing a Representative



Median vertex position

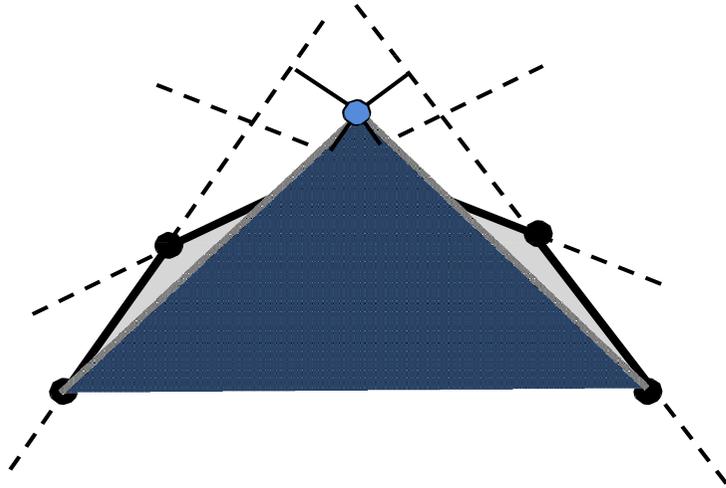
# Computing a Representative



Error quadrics

# Error Quadrics

- Cluster of vertices  $\rightarrow$  set of triangles incident on the vertices
- Compute a new vertex position that minimizes distance to triangles planes



# Error Quadrics

- Squared distance of point  $p$  to plane  $q$ :  
remember plane equation:  $ax + by + cz + d = 0$

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

$$\text{dist}(q, p)^2 = (q^T p)^2 = p^T (qq^T) p =: p^T Q_q p$$

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

# Error Quadrics

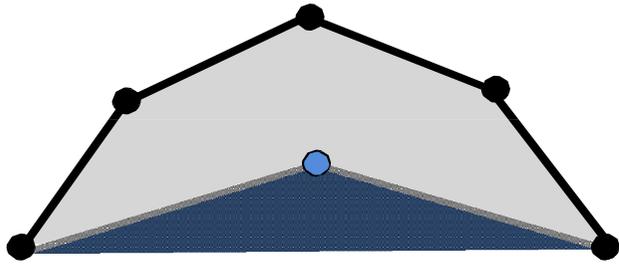
- Sum distances to planes  $q_i$  of vertex neighboring triangles:

$$\sum_i \text{dist}(q_i, p)^2 = \sum_i p^T Q_{q_i} p = p^T \left( \sum_i Q_{q_i} \right) p =: p^T Q_p p$$

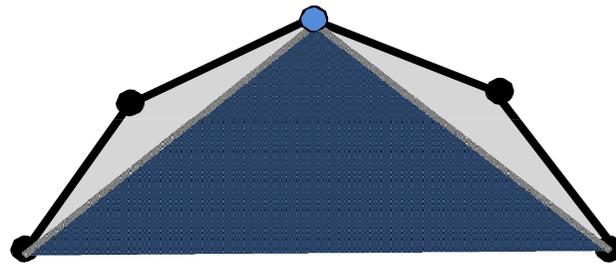
- Point  $p^*$  that minimizes the error satisfies:

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

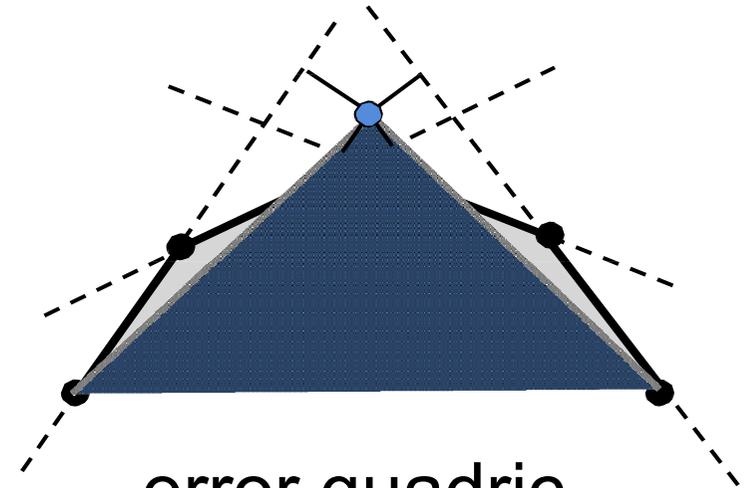
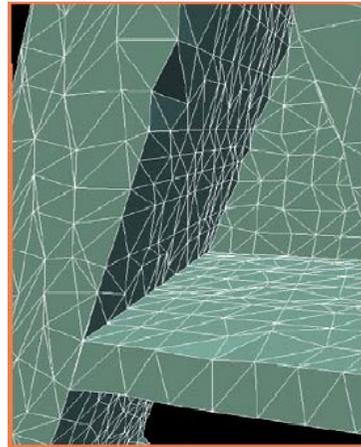
# Comparison



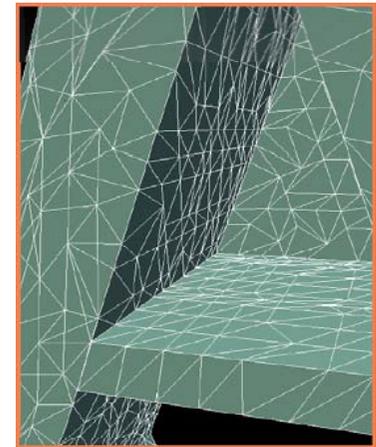
average



median



error quadric

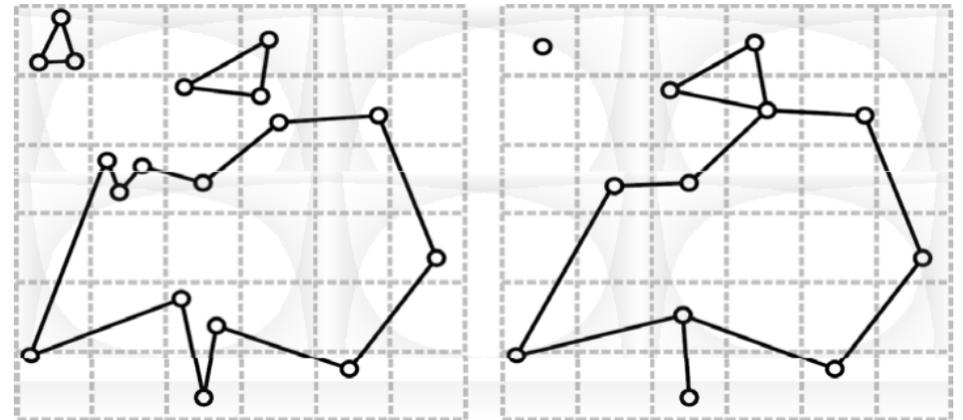


# Vertex Clustering

- Cluster Generation
- Computing a representative
- Mesh generation
  - Clusters  $p \leftrightarrow \{p_0, \dots, p_n\}$ ,  $q \leftrightarrow \{q_0, \dots, q_m\}$
  - Connect  $(p, q)$  if there was an edge  $(p_i, q_j)$
- Topology changes

# Vertex Clustering

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



# Edge Collapse (instead of vertex clustering)

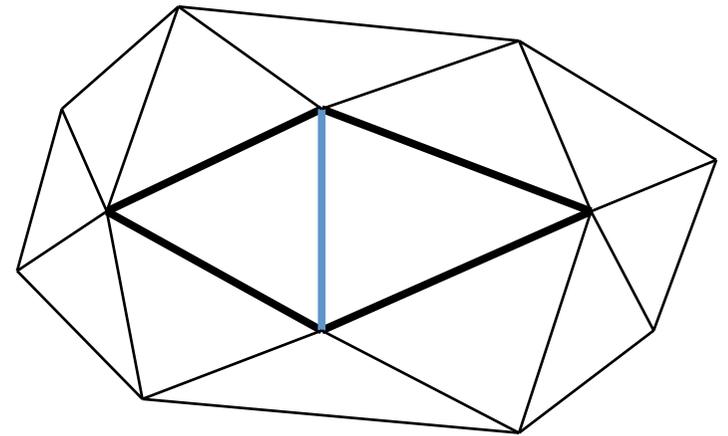


- Merge two adjacent vertices
- Define new vertex position
  - Continuous degrees of freedom
  - Filter along the way

# Edge Collapse

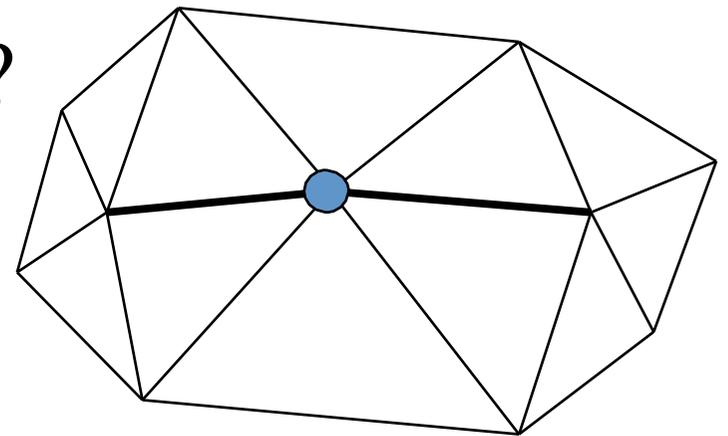
## Removing an edge...

- Merges two vertices into one vertex
- Removes two faces
- Mesh still consists of triangles



Which edges should be removed first?

Where should the new vertices go?



# Quadric Error Metric

Find  $Q$  for each vertex  $v$

$$Q_v = \sum Q_i$$

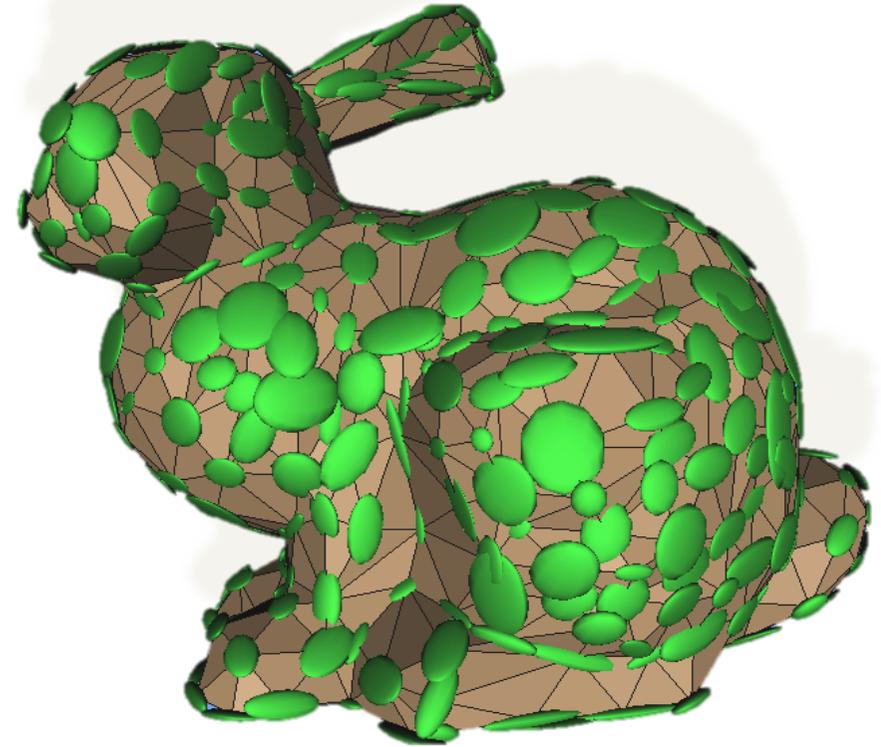
(for adjacent polygons  $i$ )

Create a priority queue of edge collapses:

Each collapse would create new vertex  $\mathbf{v}_{\text{new}}$

$$Q_{v_{\text{new}}} = Q_{v_1} + Q_{v_2}$$

Choose collapse with  $\min Q(\mathbf{v}_{\text{new}})$



$$\mathbf{v}_{12} = - \begin{bmatrix} A^2 & AB & AC \\ AB & B^2 & BC \\ AC & BC & C^2 \end{bmatrix}^{-1} \begin{bmatrix} AD \\ BD \\ CD \end{bmatrix}$$

# Examples

