Mesh Simplification



The Law of Cosine

Here are some commonly used formulas.
First, we learn that c² = a² + b² - 2abcos(θ), where θ is the angle opposite to side c.
Vector form: |X-Y|² = |X|²+|Y|²-2|X|·|Y|cos(θ).
Note that |X|² = X·X, where · is the inner product.
Since (X-Y)·(X-Y) = X·X+Y·Y-2X·Y, we have X·Y = |X|·|Y|cos(θ).





Projection of a Vector to Another

Let A and B be two vectors. We wish to compute the length of projecting A to B.
It is obvious that the length is L = |A|cos(θ).
Since A·B=|A|·|B|cos(θ), we have

$$L = |\mathbf{A}| \cos(\theta) = |\mathbf{A}| \frac{\mathbf{A} \cdot \mathbf{B}}{|\mathbf{A}| \cdot |\mathbf{B}|} = \frac{\mathbf{B}}{|\mathbf{B}|} \mathbf{A}$$

Point to a Plane Distance: 1/2

Let a plane *I* be represented by a base point B and a normal vector n, where n = 1.
Compute the distance from a point X to *I*.
Projecting X to n yields the distance |X-B|cos(θ).
Since cos(θ)=(X-B)·n/(|X-B| · n)=(X-B)·n/|X-B|), the distance is simply (X-B)·n.



4

Point to Plane Distance: 2/2

- Sometimes the plane is given by ax+by+cz+d = 0, where $a^2 + b^2 + c^2 = 1$ (*i.e.*, normalized).
- **The normal vector of this plane is** $n = \langle a, b, c \rangle$ **.**
- □ If $B = \langle u, v, w \rangle$ is a point in this plane, we have au + bv + cw + d = 0 and au + bv + cw = -d.
- **The distance from** $X = \langle x, y, z \rangle$ **to this plane is** $(X B) \bullet n$ **.**

Plugging B and n into this equation yields:

$$(X - B) \bullet n = (\langle x, y, z \rangle - \langle u, v, w \rangle) \bullet \langle a, b, c \rangle$$

= $\langle x, y, z \rangle \bullet \langle a, b, c \rangle - \langle u, v, w \rangle \bullet \langle a, b, c \rangle$
= $(ax+by+cz) - (au+bv+cw)$
= $(ax+by+cz) - (-d)$
= $ax + by + cz + d$

Volume of a Parallelepiped: 1/2

A parallelepiped is defined by three vectors **u**, **v** and **w**.



□ The parallelogram defined by u and v has an area of |u|·|v|sin(θ), which is the length of vector u×v, where θ is the angle between u and v.



Volume of a Parallelepiped: 2/2

- **The volume of a parallelepiped is the product of its base area and its height.**
- \Box The base area is $|\mathbf{u} \times \mathbf{v}|$.
- **\Box** Projecting w to u×v yields the height (u×v)·w/|u×v|.
- **Therefore, the volume is:**



Volume of a Tetrahedron

- A tetrahedron is also defined by three vectors **u**, **v** and **w**.
- □ The volume of a tetrahedron is (BaseArea×Height)/3.
- Base area is half of the parallelogram defined by **u** and **v**, and is equal to |**u**×**v**|/2.
- ☐ Height is our old friend, projecting w to u×v, which is (u×v)·w/|u×v|.

Therefore, the volume is

Volume =
$$\frac{1}{3}$$
BaseArea×Height
= $\frac{1}{3}\left(\frac{1}{2} | \mathbf{u} \times \mathbf{v} |\right) \frac{(\mathbf{u} \times \mathbf{v}) \cdot \mathbf{w}}{|\mathbf{u} \times \mathbf{v}|}$ (u×v)·w/| u×v)
= $\frac{1}{6}(\mathbf{u} \times \mathbf{v}) \cdot \mathbf{w}$ 8

Mesh Simplification: 1/2

- □ *Mesh simplification/decimation* is a class of algorithms that transform a given polygonal mesh into another with fewer faces, edges, and vertices.
- □ The simplification process is usually controlled by a set of *user-defined quality criteria* that can preserve specific properties of the original mesh as much as possible (*e.g.*, geometric distance, visual appearance , etc).
- ☐ Mesh simplifications *reduces the complexity* of a given mesh.

Mesh Simplification: 2/2

- Simplification schemes usually work iteratively (*i.e.*, removing a vertex/edge at a time) and can be reversed. Thus, one can transmit the final result followed by the "reversed" operators.
- A mesh simplification scheme can be viewed as a *decomposition operator* to obtain a low frequency component (*i.e.*, the decimated mesh) and a high frequency component (*i.e.*, the difference between the original and decimated meshes). Then, a *reconstruction operator* can perform the inverse decimation to recover the original data from its low frequency component.

Mesh Simplification Approaches

- Vertex Clustering: It is in general fast, robust and of O(n), where n is the number of vertices; however, quality is not always satisfactory.
- □ Incremental Decimation: It can deliver higher quality meshes in most cases, and can take arbitrary user-defined criteria into account according to how the next removal operation is chosen. However, complexity may be $O(n\log_2 n)$ or even $O(n^2)$.
- **Resampling:** The most general approach; however, new samples may be freely distributed.

Vertex Clustering: 1/4

- □ Given a tolerance $\varepsilon > 0$, the bounding space of the given mesh is partitioned into cells with diameter $\leq \varepsilon$.
- □ For each cell a *representative vertex* is computed (will talk about this later). If a cell has more than one vertices, they are all mapped to this representative vertex.



Vertex Clustering: 2/4

Then, degenerate triangles are removed. **If P and Q are the** representative vertices of $p_0, p_1, ..., p_m$ and $q_0, q_1, ...,$ q_n , respectively, **P** and **Q** are connected in the decimated mesh if at least one pair of vertices $(\mathbf{p}_i, \mathbf{q}_i)$ was connected in the original mesh.



solid: original mesh dotted: new mesh

Vertex Clustering: 3/4

- The resulting mesh may not be a 2-manifold even though the original one is, because a portion of a surface could collapse to a point.
- However, it can reduce the complexity of a mesh significantly, and guarantee a global approximation of the original mesh.



solid: original mesh dotted: new mesh

Vertex Clustering: 4/4

How to compute those representatives?

- ➤ The easiest way is to average the vertices in the same cell. If $P_1, P_2, ..., P_k$ are vertices in the same cell, then the representative is $P = (P_1 + P_2 + ... + P_k)/k$.
- ➢ Or, depending on the importance of each vertex (of the mesh) one might assign a weight $w_i ≥ 0$ to vertex P_i . Then, the representative of $P_1, P_2, ..., P_k$ in the same cell is their *weighted* average:

$$\mathbf{P} = \frac{w_1 \mathbf{P}_1 + w_2 \mathbf{P}_2 + \ldots + w_k \mathbf{P}_k}{w_1 + w_2 + \ldots + w_k}$$

Incremental Decimation: 1/2

- Incremental algorithms remove one vertex or edge at a time based on user-specified criteria.
- **Criteria can be binary or continuous.**
- Binary criteria determine if a vertex is allowed to remove (*i.e.*, yes or no), while a continuous one rates the quality of the mesh (*i.e.*, roundness of triangles, small normal changes between neighboring triangles) before/after removal.

Incremental Decimation: 2/2

- The surface geometry changes in the neighborhood of the removed vertex/edge, and the quality criteria have to be re-evaluated.
- **To make the re-evaluation process more efficient,** the candidates for removal are usually stored in a heap with the best removal operation on top.
- In this way, each update only costs O(log n) for large meshes if the criteria evaluation has constant time complexity.

Topological Operators

- - Edge collapse (inverse: edge split)
 - Half edge collapse (inverse: restricted vertex split)

Vertex Removal

- Vertex removal deletes a vertex and its adjacent edges and faces, creating a *k*-side hole, where *k* is the valence of the vertex.
- □ This hole is triangulated by adding *k*-2 triangles back.
- Thus, the # of vertices and # of triangles are reduced by 1 and 2, respectively.



Edge Collapse

- **Edge collapse** selects an edge and collapses it to a new vertex. Its two adjacent triangles also collapse to two edges.
- Thus, the # of vertices and # of triangles are reduced by 1 and 2, respectively.
- However, we are allowed to choose a *new* vertex!



Half-Edge Collapse

- Given a selected edge with adjacent vertices p and q, the half-edge collapse operator moves p to q or q to p.
- **This is a special case of the edge collapse operator.**
- Note that moving p to q and moving q to p are *two* different operations.
- Note also that no degree of freedom is available.



Decimation Operator Notes: 1/2

- □ While the half-edge collapse operator is a special case of the edge collapse operator, its effect becomes noticeable only for extremely strong decimation where the exact location of individual vertices really matters.
- The global optimization that uses user specified criteria to make selections is completely separate from the decimation operator. This makes the design of decimation more orthogonal.

Decimation Operator Notes: 2/2

- All three operators preserve mesh topology and the topology of the underlying surface may change near the end of decimation.
- **Non-Euler** operators **CAN** change mesh topology.
- The vertex contraction operator merges two arbitrary vertices into one even if they are not connected by an edge is a good example.
- □ The vertex contraction operator reduces the # of vertices by 1 but preserves the # of faces/edges.

A Vertex Decimation Algorithm for Triangular Mesh: 1/15

- One of the earliest decimation algorithm was due to Schroeder, Zarge and Lorensen published in SIGGRAPH 1992.
- □ This algorithm uses vertex removal only and has a scheme as follows.

while there is a vertex X that can be removed do begin apply the vertex removal operator to X; this creates a hole, not necessary planar; re-triangulate the hole; end

A Vertex Decimation Algorithm for Triangular Mesh: 2/15

- Not all vertices are candidates for decimation.
- Each vertex is assigned one of five possible classifications: simple, complex, boundary, interior edge, or corner vertex.
- A simple vertex is surrounded by a closed fan of triangles.





A Vertex Decimation Algorithm for Triangular Mesh: 3/15

- If an edge is shared by more than two triangles, or if a vertex is used by a triangle that is not in the fan, this vertex is a complex vertex.
- If a mesh contains a complex vertex, it is not a 2-manifold. We only deal with 2-manifolds in this course.

□ If a vertex is on the boundary of a mesh, it is a boundary vertex.

complex vertex

boundary vertex



A Vertex Decimation Algorithm for Triangular Mesh: 4/15

User Specified Criteria (Basic Idea):

- **>** Do not remove sharp corners
- If vertex X is "far" away from its adjacent vertices, X should not be removed because removing X flattens the vicinity of vertex X.
- Thus, good candidates should be vertices in "flat" regions.
- The "flatness" is measured by a plane, an average plane, representing the vicinity of X's adjacent vertices.



A Vertex Decimation Algorithm for Triangular Mesh: 5/15

User Specified Criteria:

- If X is a simple vertex, the distance from X to an "average" plane is computed. If this distance is smaller than the given distance (*i.e.*, reasonably flat), X is removed.
- If X is a boundary vertex, then use the distance from this vertex to the *boundary edge line*.



A Vertex Decimation Algorithm for Triangular Mesh: 6/15

Compute the "Average Plane":

- Let X be the vertex under consideration.
- **\therefore** Let T_i be a triangle in the fan of X.
- Let c_i, A_i and n_i be the center, area and normal vector of triangle T_i, respectively.
- The base point B and normal vector n of the average plane are calculated as follows:

$$B = \frac{\sum A_i \times c_i}{\sum A_i} \qquad n = \frac{\sum A_i \times n_i}{\sum A_i}$$

A Vertex Decimation Algorithm for Triangular Mesh: 7/15

Split Line and Split Plane:

- A split line is a line joining two nonadjacent vertices.
- A split plane is the plane that satisfies two conditions:
 - 1) it contains a split line and is perpendicular to the chosen average plane
 - 2) it divides the loop into two separate links such that all vertices of one link are in one side of the split plane and the remaining vertices are in the other.



A Vertex Decimation Algorithm for Triangular Mesh: 8/15

Aspect Ratio:

- Given a split line and its split plane, the aspect ratio is defined as the *minimum* distance of the loop vertices to the split plane, divided by the length of the split line.
- The "best" choice of a split line is the one that can produce the maximum aspect ratio.



A Vertex Decimation Algorithm for Triangular Mesh: 9/15

Re-triangulation

- Find a split line with a maximal aspect ratio.
- Each of these two links and the split line forms a loop.
- Recursively re-triangulate each loop.
- If re-triangulation fails, do not remove this vertex.



A Vertex Decimation Algorithm for Triangular Mesh: 10/15

A Few Notes: 1/5

***** Repeated decimation may produce a tetrahedron. Further decimation reduces it to a triangle. So, we have *two* identical triangles!

This is a change of topology.



A Vertex Decimation Algorithm for Triangular Mesh: 11/15

A Few Notes: 2/5



A Vertex Decimation Algorithm for Triangular Mesh: 12/15

A Few Notes: 3/5



A Vertex Decimation Algorithm for Triangular Mesh: 13/15

A Few Notes: 4/5

A Vertex Decimation Algorithm for Triangular Mesh: 14/15

A Few Notes: 5/5

A Vertex Decimation Algorithm for Triangular Mesh: 15/15

A Few Notes: 4/4

Thus, in the decimation process, a check must be made to prevent duplicated triangles and triangle edges. In this way, the topology of the mesh can be preserved.

Vertex Error

Some Results: 1/4 Note that flat portions are simplified first.

Some Results: 2/4

Note that flat portions are simplified first.

Some Results: 3/4

Note that flat portions are simplified first.

Some Results: 4/4

Note that flat portions are simplified first.

Quadric Error Metric Decimation: 1/9

- This algorithm is due to Michael Garland and Paul S. Heckbert, published in *IEEE Visualization 1998*.
- **This algorithm uses the quadric error distance measure and the edge collapse operator.**
- Each vertex of a given mesh is associated with an error metric, a 4×4 symmetric matrix, and a quadric (*i.e.*, second degree) error.
- □ For each edge, a new vertex with minimum error value (based on the error metric) is found and used for selecting an edge to be collapsed.

Quadric Error Metric Decimation: 2/9

- Since this algorithm uses edge collapse, we need a criterion for selecting an edge.
- Given two vertices, p and q, a pair (p,q) is a valid pair for collapsing, if

*pq is an edge, or

 $|\mathbf{p} - \mathbf{q}| < \varepsilon$, where ε is a user-defined constant

If ε > 0, two very close vertices may be collapsed together (*i.e.*, vertex contraction), creating a nonmanifold mesh. Thus, if vertex contraction is unwanted, set ε to 0!

Quadric Error Metric Decimation: 3/9

What is an error metric?

- **◆**It is a 4×4 symmetric matrix **Q**!
- Each vertex v has an error metric matrix Q_v. We shall show how to find it later.
- * The error at a vertex $\mathbf{v} = [\mathbf{v}_1, \mathbf{v}_2, \mathbf{v}_3, \mathbf{1}]^T$, $\Delta(\mathbf{v})$, is defined as $\mathbf{v}^T \mathbf{Q}_v \mathbf{v}$.
- Since $\mathbf{Q}_{\mathbf{v}}$ is a 4×4 matrix, $\Delta(\mathbf{v}) = \mathbf{v}^{\mathsf{T}}\mathbf{Q}_{\mathbf{v}}\mathbf{v} = \delta$ is a surface of second degree in \mathbf{v} , where δ is a given value.
- Hence, this error metric is referred to as a quadric error metric.

Quadric Error Metric Decimation: 4/9

How do we collapse an edge?

- If (p,q) is a valid pair, a simple way is to move p to q, move q to p, or move p and q to (p+q)/2.
- ✦However, there is a better way. We may move to a new point v that minimizes the error ∆(v) = $(v^TQ_pv + v^TQ_qv)/2 = [v^T(Q_p+Q_q)v]/2$, where Q_p and Q_q are the error metric matrices of vertices p and q.
- After v is computed, edge pq is collapsed and v receives the error value $\Delta(v)$ and error metric matrix $\mathbf{Q}_{p} + \mathbf{Q}_{q}$

Quadric Error Metric Decimation: 5/9

```
compute error and error matrix for each vertex of the mesh;
select all valid edges pq such that |\mathbf{p} - \mathbf{q}| < \varepsilon;
for each selected edge pq do
    begin
         minimize \Delta(\mathbf{r}) = [\mathbf{r}^{\mathrm{T}}(\mathbf{Q}_{\mathrm{p}} + \mathbf{Q}_{\mathrm{q}})\mathbf{r}]/2 to find r;
         let \Delta(\mathbf{r}) = (\Delta(\mathbf{p}) + \Delta(\mathbf{q}))/2 and \mathbf{Q}_{\mathbf{r}} = \mathbf{Q}_{\mathbf{p}} + \mathbf{Q}_{\mathbf{q}};
         place all selected edges in a heap using \Delta(\mathbf{r}) as a key;
    end;
while there are edges on the heap do
    begin
         remove the top edge pq;
         collapse it to the computed r;
         update the mesh and the keys;
    end
```

Quadric Error Metric Decimation: 6/9

\Box How do we find \mathbf{Q}_{v} for v, initially? 1/3

- * Given a plane P: ax+by+cz+d=0, where $a^2+b^2+c^2=1$ (*i.e.*, normalized), and a point $v=(v_1,v_2,v_3)$, the error (*i.e.*, distance) from v to P is $\Delta_P(v) = av_1 + bv_2 + cv_3 + d$.
- ★ Let $P = \langle a, b, c, d \rangle$ and $v = \langle v_1, v_2, v_3, 1 \rangle$. Then, we have $\Delta_P(v) = av_1 + bv_2 + cv_3 + d = P \bullet v$.
- Thus, the error at v with respect to P is calculated by plugging v's coordinates into P's equation. If P•v is zero, v is in P. Otherwise, P•v gives the *signed* "distance" from v to P.

Quadric Error Metric Decimation: 7/9

 $(\mathbf{P}^{\mathrm{T}})$

 \Box How do we find \mathbf{Q}_{v} for v, initially? 2/3 **Since error may** be negative, we use its square! Since **Pov** can be rewritten into a matrix form **P**^T**v**, where **P** and **v** are row matrices, we have this

$$\mathbf{v} \mathbf{v}^{2} = (\mathbf{P}^{\mathrm{T}} \cdot \mathbf{v})^{\mathrm{T}} (\mathbf{P}^{\mathrm{T}} \cdot \mathbf{v})$$

$$= (\mathbf{v}^{\mathrm{T}} \cdot \mathbf{P}) (\mathbf{P}^{\mathrm{T}} \cdot \mathbf{v})$$

$$= \mathbf{v}^{\mathrm{T}} (\mathbf{P} \mathbf{P}^{\mathrm{T}}) \mathbf{v}$$

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

Quadric Error Metric Decimation: 8/9

 \Box How do we find \mathbf{Q}_{v} for v, initially? 3/3

The error metric matrix of v w.r.t. P is the matrix shown earlier rather than the error value itself! Let this matrix be M_P(v).

Now, for each vertex v in the given mesh, the error metric matrix of vertex v is the sum of all M_P(v), where P is a plane that contains an incident triangle of v:

$$\mathbf{Q}_{\mathbf{v}} = \sum_{\text{all } \mathbf{P's incident to } \mathbf{v}} \mathbf{M}_{\mathbf{P}}(\mathbf{v})$$

Quadric Error Metric Decimation: 9/9

 \Box How do we find a v that minimizes $v^T \mathbf{Q}_v v$?

Once Q_v is computed from Q_p and Q_q, where pq is the edge to be collapsed, we need to find a new vertex v such that v^TQ_vv is minimized.

Since v^TQ_vv is a second degree function in v, its minimum can easily be found. Compute and set the partial derivatives of v^TQ_vv to zero, and solve for x, y and z!

The Minimum of a Quadric Function

□ The vector **v** in the function $\mathbf{v}^{\mathsf{T}}\mathbf{Q}_{\mathsf{v}}\mathbf{v}$ has three variables, *i.e.*, $\mathbf{v} = (x, y, z)$, and the function itself is of second degree.

Therefore, function $\mathbf{v}^{\mathsf{T}}\mathbf{Q}_{\mathsf{v}}\mathbf{v}$ has a form of $F(x, y, z) = ax^2 + by^2 + cz^2 + 2dxy + 2exz + 2fyz + 2gx + 2hy + 2iz + j$

Setting the partial derivatives to zero and solving for *x*, *y* and *z* yield the vector **v**.

$$\frac{\partial F}{\partial x} = ax + dy + ez + g = 0$$

$$\frac{\partial F}{\partial y} = dx + by + fz + h = 0$$

$$\frac{\partial F}{\partial z} = ex + fy + cz + i = 0$$

Quadric Error Metric

Decimation vs Error Metric

Results and Comparisons: 1/3

vertex decimation: V=3602

error metric: V=3555

Results and Comparisons: 2/3

Results and Comparisons: 3/3

More Comparisons: 1/2

More Comparisons: 2/2

The End