

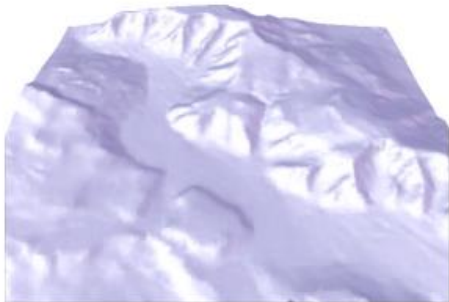
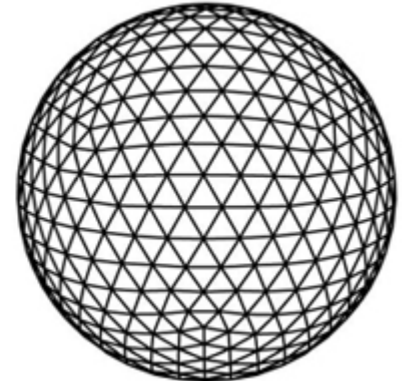
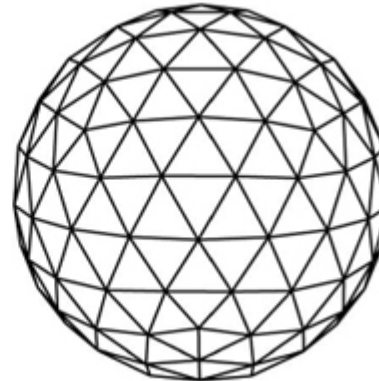
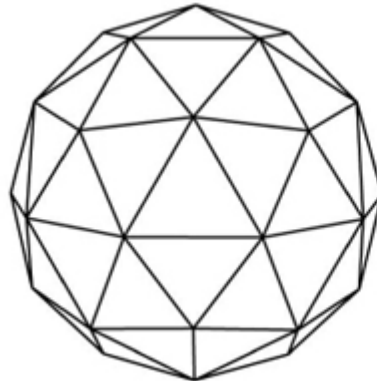
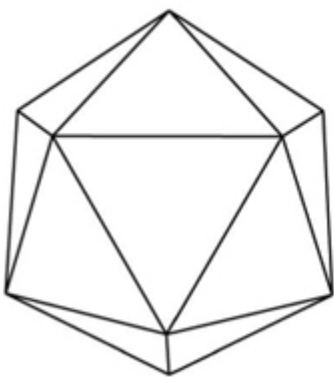
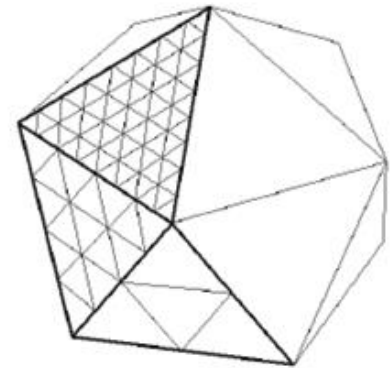
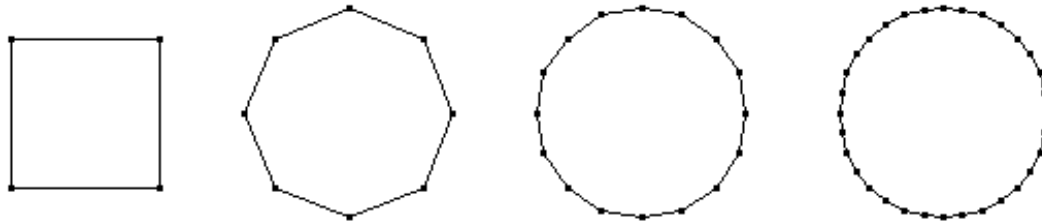
Geometric Modeling in Graphics

Part 4: Mesh smoothing

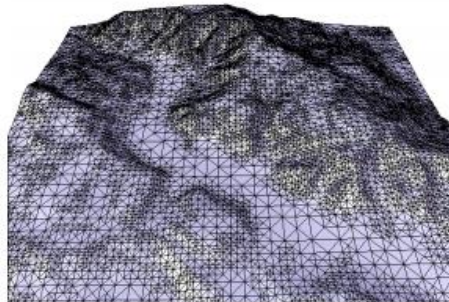
Subdivision

- ▶ Generating new object (mesh, polyline) from old one by dividing edges or faces into smaller parts
- ▶ Generating new vertices, edges, faces, changing position of old vertices
- ▶ One step of subdivision – from object \mathbf{P}^i to object \mathbf{P}^{i+1} , $i=0, \dots$
 - ▶ Subdivision scheme S – $\mathbf{P}^{i+1} = S(\mathbf{P}^i)$
 - ▶ Control (starting) object – \mathbf{P}^0
 - ▶ Limit object – \mathbf{P} , $\mathbf{P}^\infty = \lim \mathbf{P}^i, i \rightarrow \infty$
- ▶ Interpolation schemes – vertices of \mathbf{P}^i are included in \mathbf{P}^{i+1} , each \mathbf{P}^i and \mathbf{P} passes through vertices of \mathbf{P}^0
- ▶ Approximation schemes – Each object \mathbf{P}^i and \mathbf{P} only approximates shape of \mathbf{P}^0
- ▶ Continuity – continuity of limit object \mathbf{P} , usually C^0, C^1, C^2, \dots

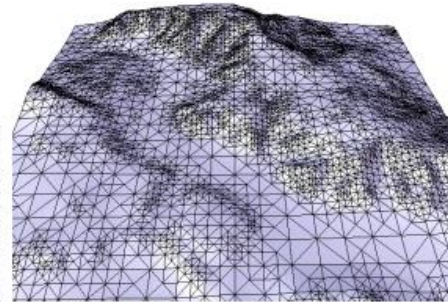
Subdivision



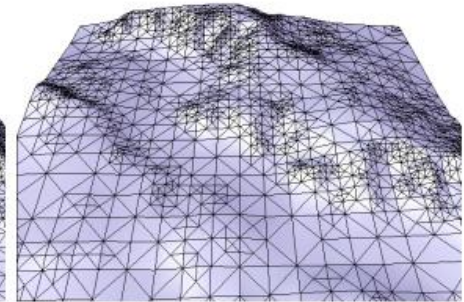
a) full resolution



b) 55% reduction



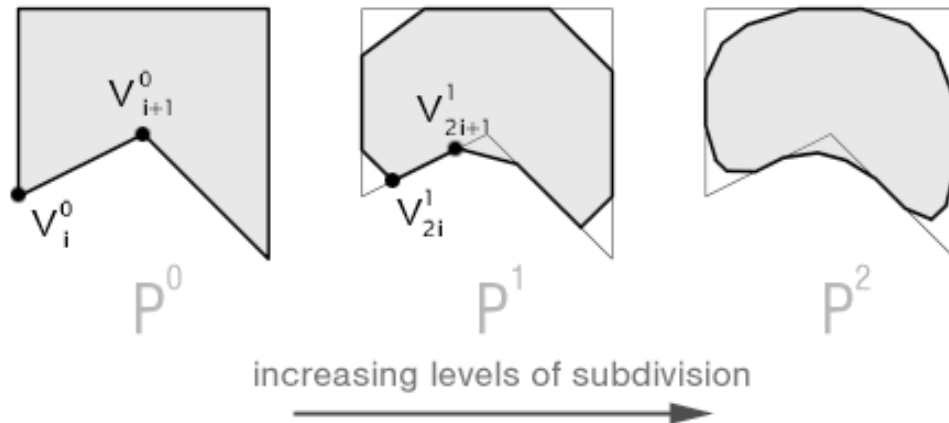
c) 82% reduction



d) 93% reduction

Polyline subdivision

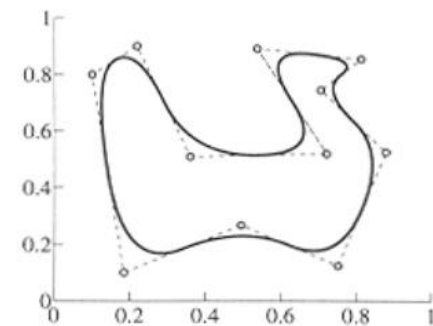
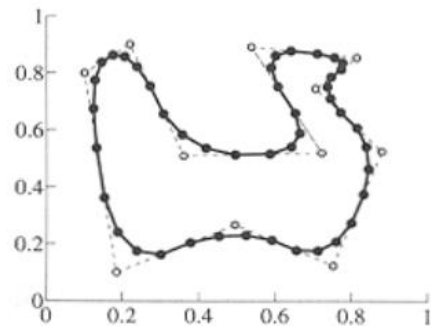
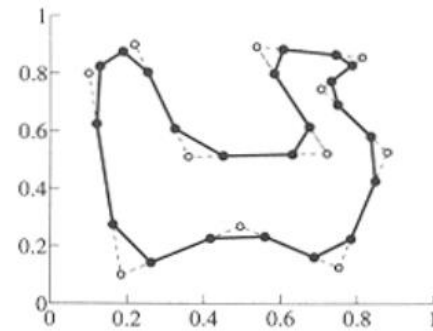
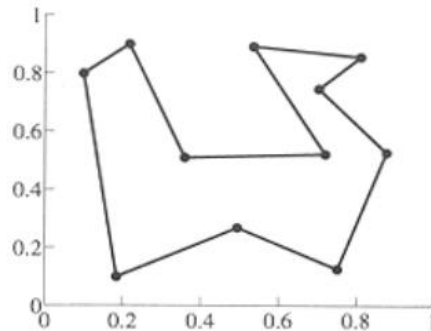
- ▶ Chaikin subdivision scheme
- ▶ Corner cutting algorithm, approximating scheme
- ▶ P^i has vertices $V_1^i, V_2^i, \dots, V_n^i$
- ▶ P^{i+1} has vertices $V_1^{i+1}, V_2^{i+1}, \dots, V_m^{i+1}$
- ▶ $V_{2j}^{i+1} = 0.25 * V_j^i + 0.75 * V_{j+1}^i, j=1, 2, \dots, m / 2$
- ▶ $V_{2j-1}^{i+1} = 0.75 * V_j^i + 0.25 * V_{j+1}^i, j=1, 2, \dots, m / 2$
- ▶ Open polyline
 - ▶ $m=2n-2$
- ▶ Closed polyline
 - ▶ $m=2n$
 - ▶ $V_{n+1}^i = V_n^i$



Chaikin scheme

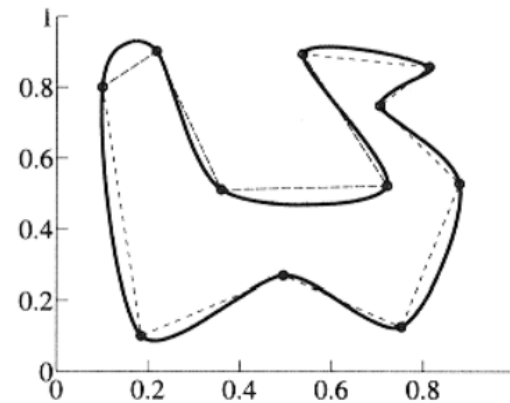
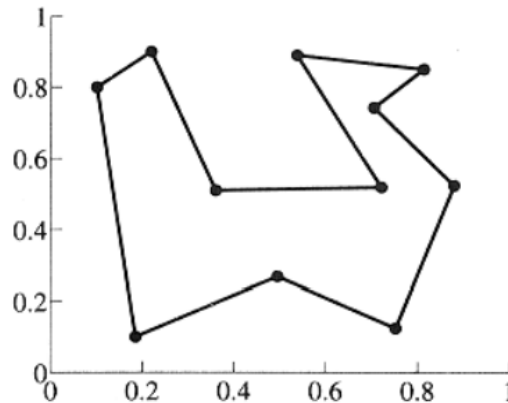
- ▶ Limit of Chaikin scheme – C^1 quadratic B-spline curve
- ▶ Limit curve in convex hull of control polyline
- ▶ Matrix notation, used for determination of mathematical properties

$$\begin{bmatrix} f_0 \\ f_1 \\ f_2 \\ f_3 \\ f_4 \\ f_5 \\ f_6 \\ f_7 \end{bmatrix} = \begin{bmatrix} \frac{3}{4} & \frac{1}{4} & 0 & 0 \\ \frac{1}{4} & \frac{3}{4} & 0 & 0 \\ 0 & \frac{1}{4} & \frac{3}{4} & 0 \\ 0 & \frac{1}{4} & \frac{3}{4} & 0 \\ 0 & 0 & \frac{1}{4} & \frac{3}{4} \\ 0 & 0 & \frac{1}{4} & \frac{3}{4} \\ \frac{1}{4} & 0 & 0 & 0 \\ \frac{3}{4} & 0 & 0 & 0 \end{bmatrix} \begin{bmatrix} c_0 \\ c_1 \\ c_2 \\ c_3 \end{bmatrix}$$



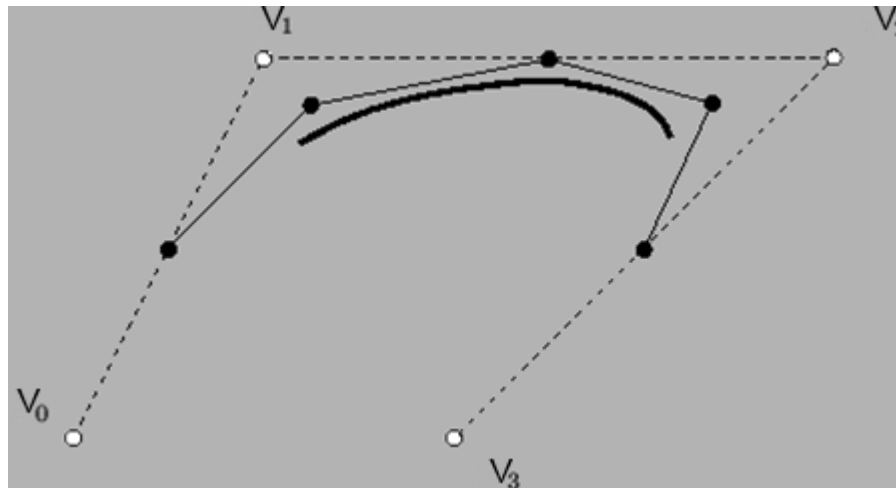
Polyline subdivision

- ▶ Interpolation Scheme, limit curve is C^1
- ▶ Dyn-Levin-Gregory
- ▶ $V_{2j-1}^{i+1} = V_j^i, j=1, 2, \dots, m/2$
- ▶ $V_{2j}^{i+1} = (-1/16)V_{j-1}^i + (9/16)V_j^i + (9/16)V_{j+1}^i + (-1/16)V_{j+2}^i$
 $j=1, 2, \dots, m/2$
- ▶ Open polyline: $m=2n-1, V_0^i = V_1^i, V_{n+1}^i = V_n^i$
- ▶ Closed polyline: $m=2n, V_0^i = V_n^i, V_{n+1}^i = V_2^i$



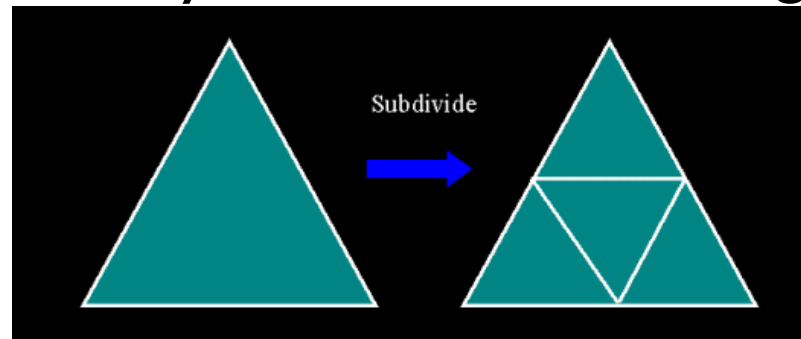
Polyline subdivision

- ▶ Catmul-Clark approximating subdivision scheme
- ▶ Limit curve is C^2 cubic B-spline curve
- ▶ $V_{2j}^{i+1} = (1/2) * V_j^i + (1/2) * V_{j+1}^i, j=1, 2, \dots, m / 2$
- ▶ $V_{2j-1}^{i+1} = (1/8) V_{j-1}^i + (6/8) V_j^i + (1/8) V_{j+1}^i, j=1, 2, \dots, m / 2$
- ▶ Open polyline: $m=2n-1, V_0^i = V_1^i, V_{n+1}^i = V_n^i$
- ▶ Closed polyline: $m=2n, V_0^i = V_n^i, V_{n+1}^i = V_2^i$



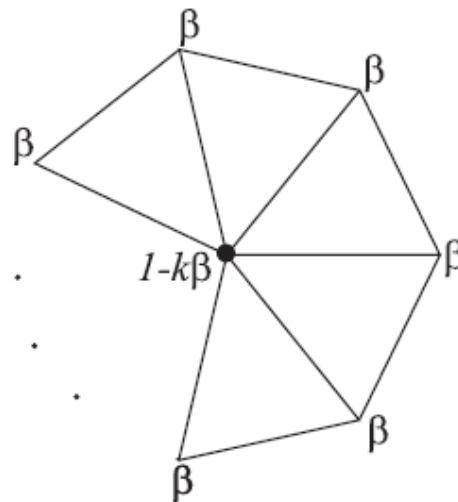
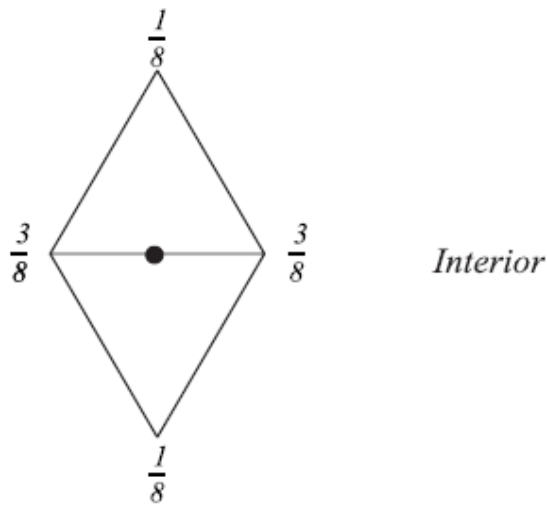
Loop subdivision

- ▶ Loop approximating scheme for triangular meshes
- ▶ Each subdivision step, triangle is divided into 4 subtriangles
- ▶ For each edge of mesh, new vertex is created near center of edge (odd vertex)
- ▶ Each old vertex is moved to new position (even vertex)
- ▶ Position of odd and even vertex is computed as barycentric combination of old vertices in its neighborhood – barycentric coordinates given as mask



Loop subdivision

- ▶ Special rules for vertices, edges lying on boundary or marked as crease
- ▶ Using DCEL to get vertex neighborhood info



Original Loop

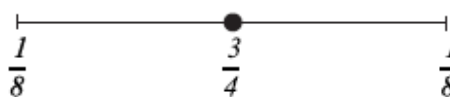
$$\beta = \frac{1}{n} \left(\frac{5}{8} - \left(\frac{3}{8} + \frac{1}{4} \cos \frac{2\pi}{n} \right)^2 \right)$$

Warren

$$\beta = \begin{cases} \frac{3}{8n} & n > 3 \\ \frac{3}{16} & n = 3 \end{cases}$$



Crease and boundary

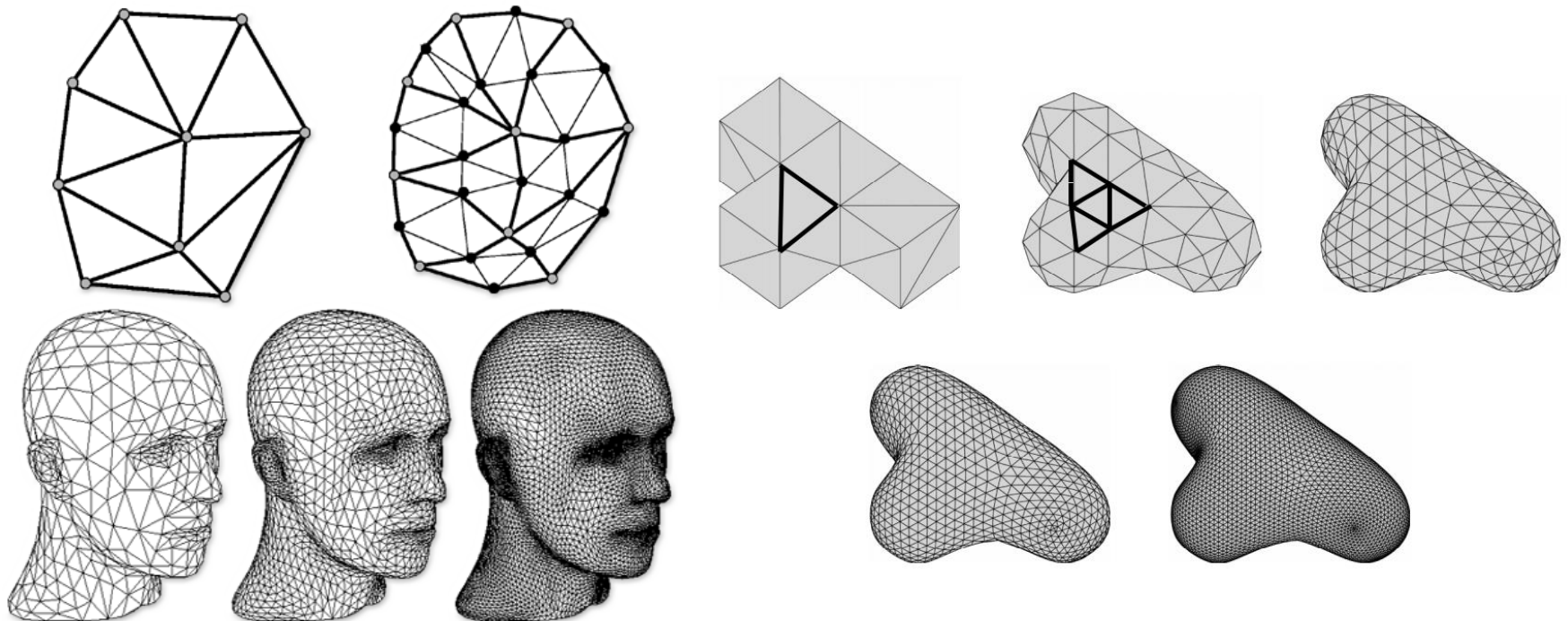


a. Masks for odd vertices

b. Masks for even vertices

Loop subdivision

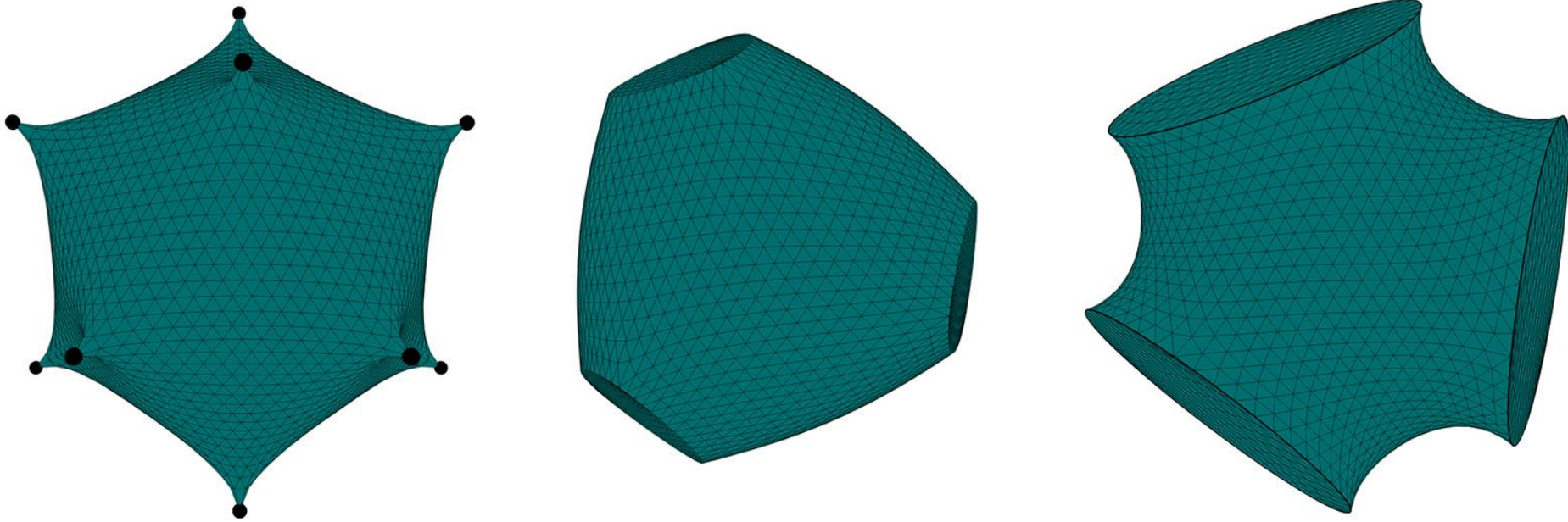
- ▶ Control mesh \mathbf{M}^0 – arbitrary triangular mesh
- ▶ Limit mesh \mathbf{M}^∞ – C^2 smooth except small neighborhood of extraordinary vertices
- ▶ Extraordinary vertex – with valence not equal to 6



Loop subdivision & DCEL

- ▶ One Loop subdivision step from mesh \mathbf{M}^i to mesh \mathbf{M}^{i+1}
- ▶ Creating DCEL structure for mesh \mathbf{M}^{i+1}
 - ▶ 1. For each vertex of \mathbf{M}^i , create new even vertex of \mathbf{M}^{i+1} and compute its position from positions of \mathbf{M}^i vertices, remember connection of new and old vertex
 - ▶ 2. For each edge of \mathbf{M}^i , create and compute coordinates of new odd vertex, remember connection of new vertex with both half-edges of edge
 - ▶ 3. For each face of \mathbf{M}^i , create 4 new DCEL faces (triangles) and 12 new half-edges and fill its properties based on connections from previous steps except opposite pointers, remember connection of new faces with old faces
 - ▶ 4. Fill opposite half-edges of mesh \mathbf{M}^{i+1} using connections from step 3

Loop subdivision - Creases



<http://www.bespokegeometry.com/2015/01/29/mesh-subdivision-loop-and-catmull-clark/>

Catmull-Clark subdivision

- ▶ Originally designed for quad meshes
- ▶ Generalized for control mesh with arbitrary simple polygons
- ▶ Approximating scheme, at least C^2 except neighborhood of extraordinary vertices
- ▶ After first step of subdivision, only quads are present
- ▶ For regular quad control mesh, limit surface is bicubic B-spline surface
- ▶ Extraordinary vertices are with valence not equal to 4
- ▶ Most popular scheme in modeling packages
- ▶ Used in many movies, first in short called Geri's game
- ▶ Catmull – working in Pixar, Disney

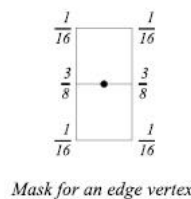
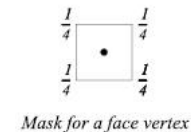
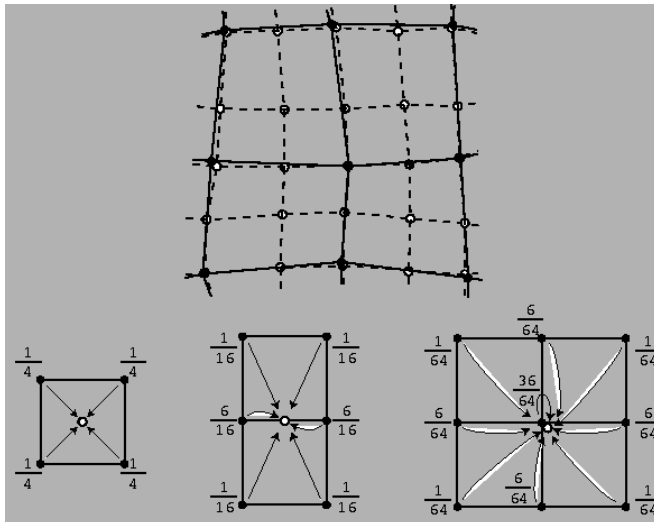
Catmull-Clark subdivision

- ▶ One step of subdivision process, \mathbf{M}^i to mesh \mathbf{M}^{i+1}
- ▶ 3 kinds of new vertices of mesh \mathbf{M}^{i+1} , created for each element (face, edge, vertex) of \mathbf{M}^i
 - ▶ Face point – average of all vertices of face
 - ▶ Edge point – average of two points from neighboring faces
 - ▶ Vertex point
 - ▶ F – average of all face points for faces touching vertex
 - ▶ R – average of all edge points for edges touching vertex
 - ▶ P – position of vertex
 - ▶ n – valence of vertex
- ▶ To create mesh \mathbf{M}^{i+1} , connect each face point with corresponding edge points and each vertex point with corresponding edge points

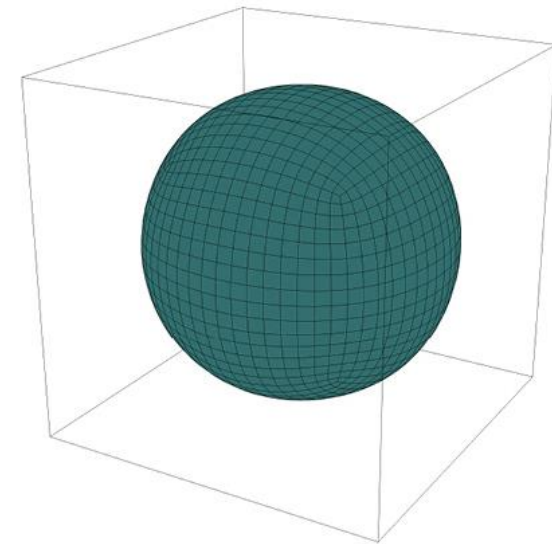
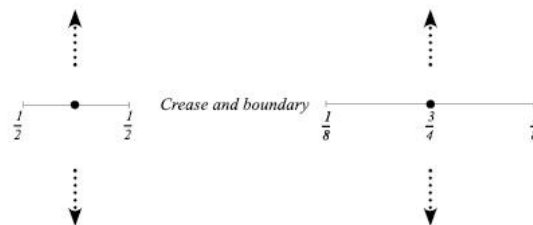
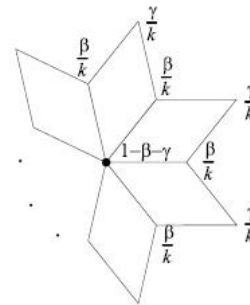
$$\frac{F + 2R + (n - 3)P}{n}.$$

Catmull-Clark subdivision

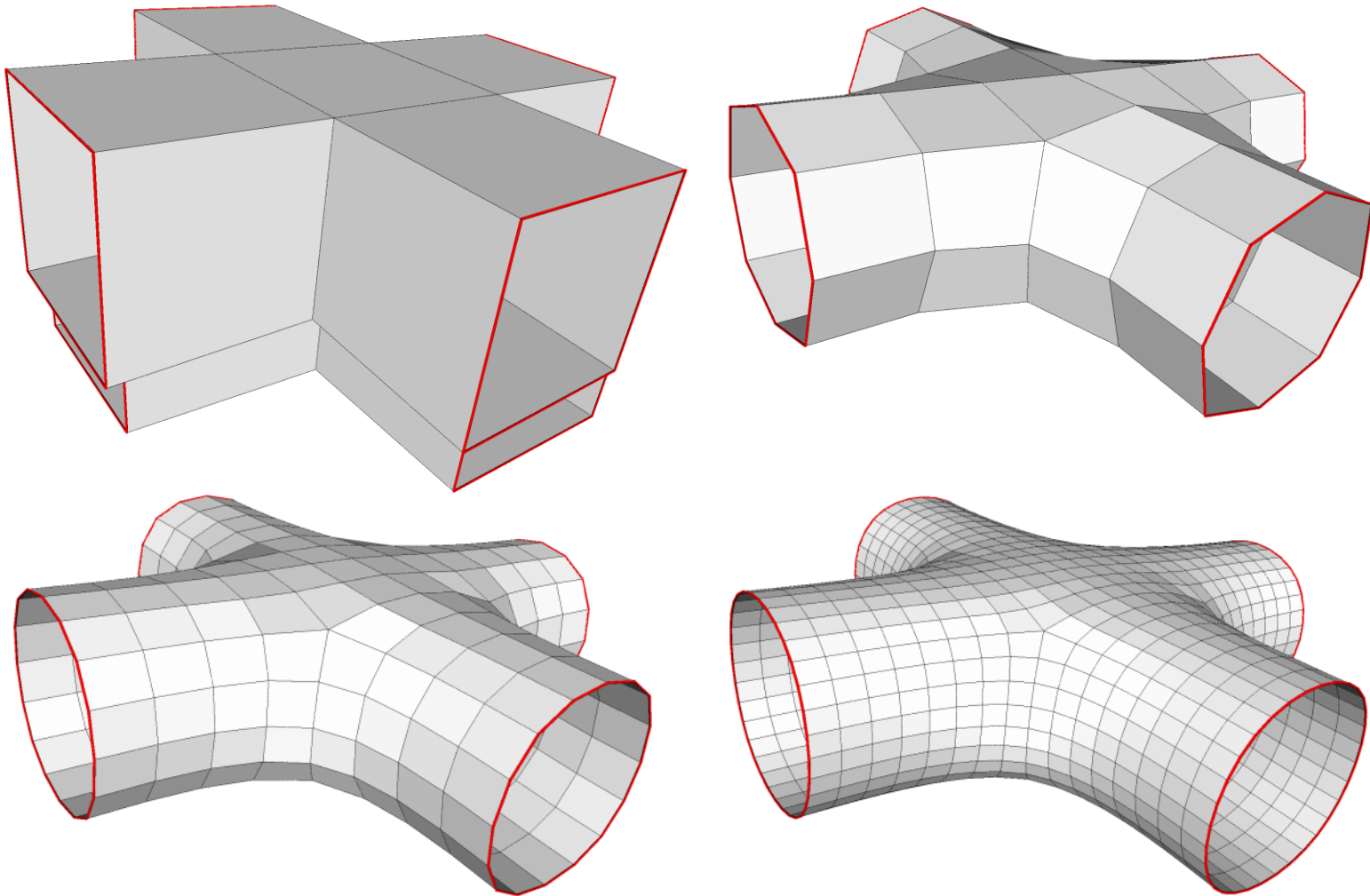
- ▶ Rules for boundary and crease are given by curve rules
 - ▶ Edge Point is computed as center of edge
 - ▶ $EP = (1/2) * V_1 + (1/2) * V_2$
 - ▶ Vertex point is computed as combination of vertex and its neighbor vertices on boundary (crease)
 - ▶ $VP = (1/8) N_1 + (6/8) V + (1/8) N_2$



Interior



Catmull-Clark subdivision



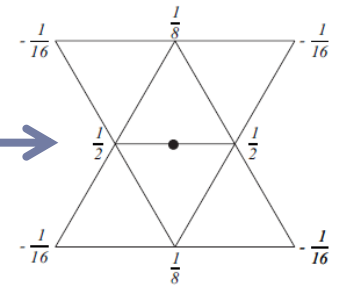
Modified Butterfly subdivision

- ▶ Interpolation scheme on triangular meshes
- ▶ C1 smooth everywhere except vertices with valence equal to 3 or greater than 7
- ▶ Extraordinary vertices with valence not equal to 6
- ▶ Dividing each triangle of mesh \mathbf{M}^i into 4 triangles of \mathbf{M}^{i+1}
- ▶ All vertices of \mathbf{M}^i are present in \mathbf{M}^{i+1}
- ▶ For each edge of \mathbf{M}^i , new edge point (odd vertex) is created and used when triangle is divided into 4 new triangles
- ▶ Rules for edge point are based on valence of end vertices of that edge

Modified Butterfly subdivision

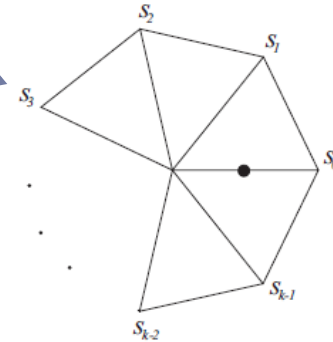
- ▶ Computing edge point (odd vertex) for edge (V_1, V_2) leads to 4 possibilities

- ▶ V_1 and V_2 both have valence $k=6$ (are regular) →

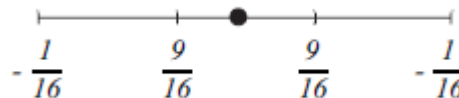


- ▶ V_1 has valence $k=6$ and V_2 has not →

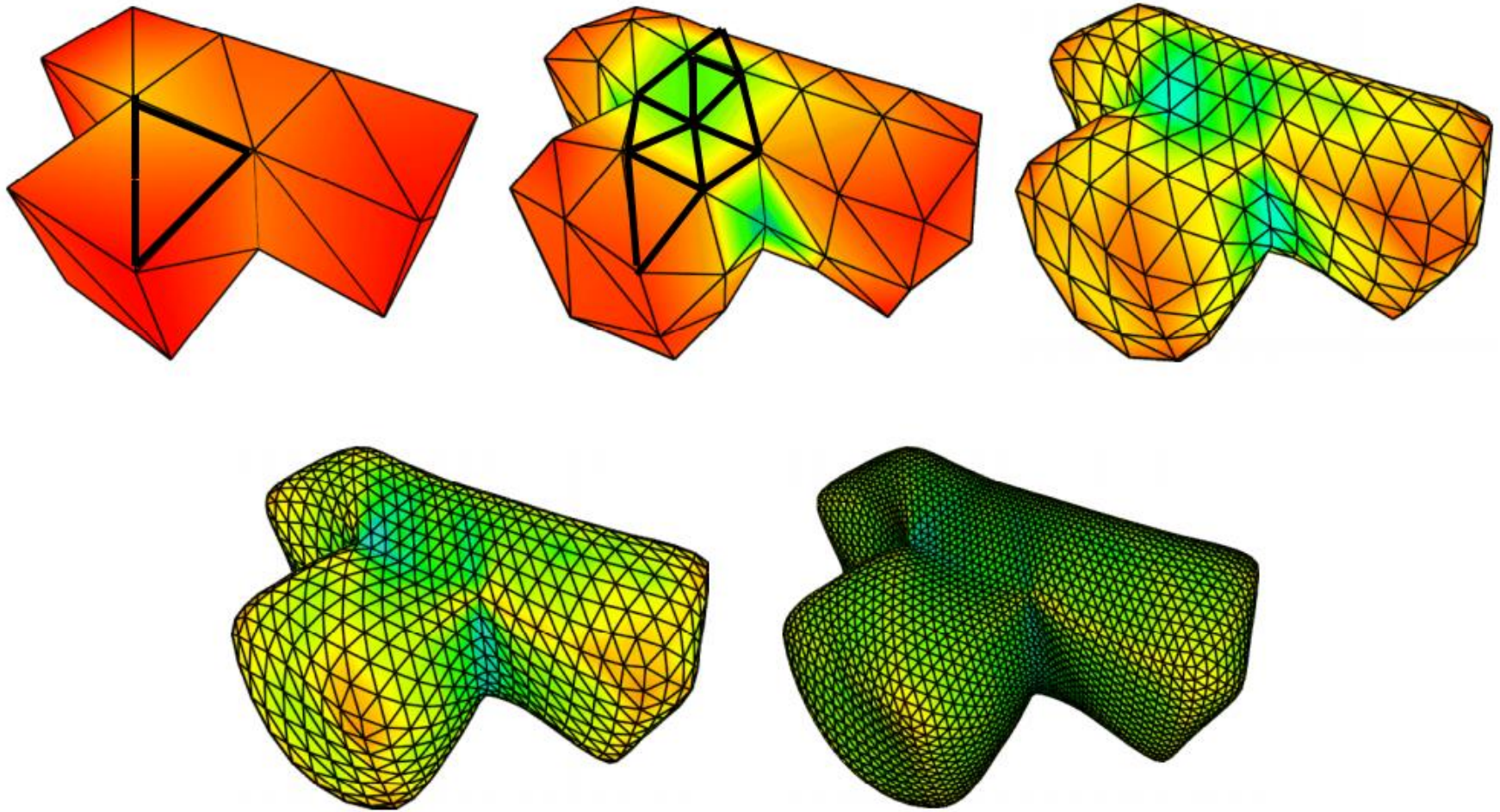
- ▶ for $k = 3$ $s_0 = \frac{5}{12}, s_{1,2} = -\frac{1}{12}$
- ▶ for $k = 4$ $s_0 = \frac{3}{8}, s_2 = -\frac{1}{8}, s_{1,3} = 0$
- ▶ for $k \geq 5$ $s_i = \frac{1}{k} \left(\frac{1}{4} + \cos \frac{2i\pi}{k} + \frac{1}{2} \cos \frac{4i\pi}{k} \right)$



- ▶ V_1 and V_2 have valence not equal to 6
 - ▶ Average the results of using the extraordinary stencil on each of them
- ▶ Edge is on boundary



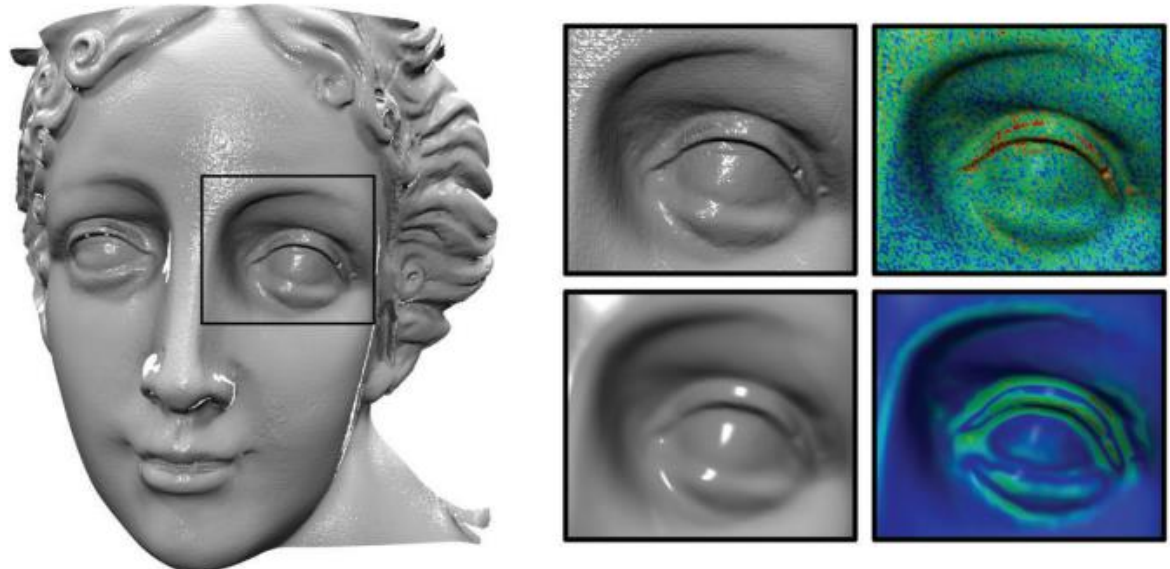
Modified Butterfly subdivision



http://graphics.stanford.edu/courses/cs468-10-fall/LectureSlides/10_Subdivision.pdf

Mesh smoothing

- ▶ Changing position of mesh vertices such that updated mesh is more smooth than given mesh
- ▶ No topology change inside mesh
- ▶ Increasing continuity of function over mesh
- ▶ Simulating (heat) diffusion, low pass filter
- ▶ Noise removal



[http://staff.ustc.edu.cn/~tongwh/GM_2011/textbooks/Polygon Mesh Processing Mario Botsch et.al 2010.pdf](http://staff.ustc.edu.cn/~tongwh/GM_2011/textbooks/Polygon%20Mesh%20Processing%20Mario%20Botsch%20et.al%202010.pdf)

Laplacian smoothing

- ▶ Based on Fourier analysis
- ▶ Vertices of mesh are incrementally moved in direction of Vector Laplacian

$$\Delta f = \nabla^2 f = \sum_{i=1}^n \frac{\partial^2 f}{\partial x_i^2} \quad \nabla^2 \mathbf{A} = (\nabla^2 A_x, \nabla^2 A_y, \nabla^2 A_z),$$

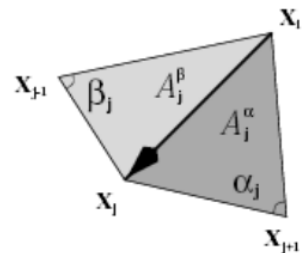
- ▶ Approximating Laplacian on meshes
 - ▶ Computation of mesh Laplacian for each vertex $x_i - L(x_i)$
 - ▶ Mesh Laplacian is vector created as linear combination of vertex x_i and vertices from its 1-ring neighborhood $N_1(i)$

$$L(x_i) = \sum_{j \in N_1(i)} w_{ij} (x_j - x_i)$$

- ▶ Simple Laplacian, uniform weights $w_{ij} = \frac{1}{m}$
- ▶ Scale-dependent Laplacian, Fujiwara weights $w_{ij} = \frac{1}{|e_{ij}|}$
- ▶ Cotangent Laplacian

$$w_{ij} = \cot \alpha_j + \cot \beta_j$$

- ▶ $L(x_i) = -2H\mathbf{n}_i$ (Laplacian is mean curvature normal)

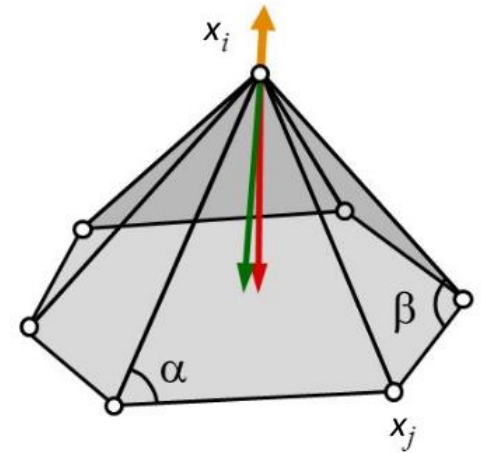


Laplacian smoothing

- ▶ Simulating diffusion on mesh using forward difference

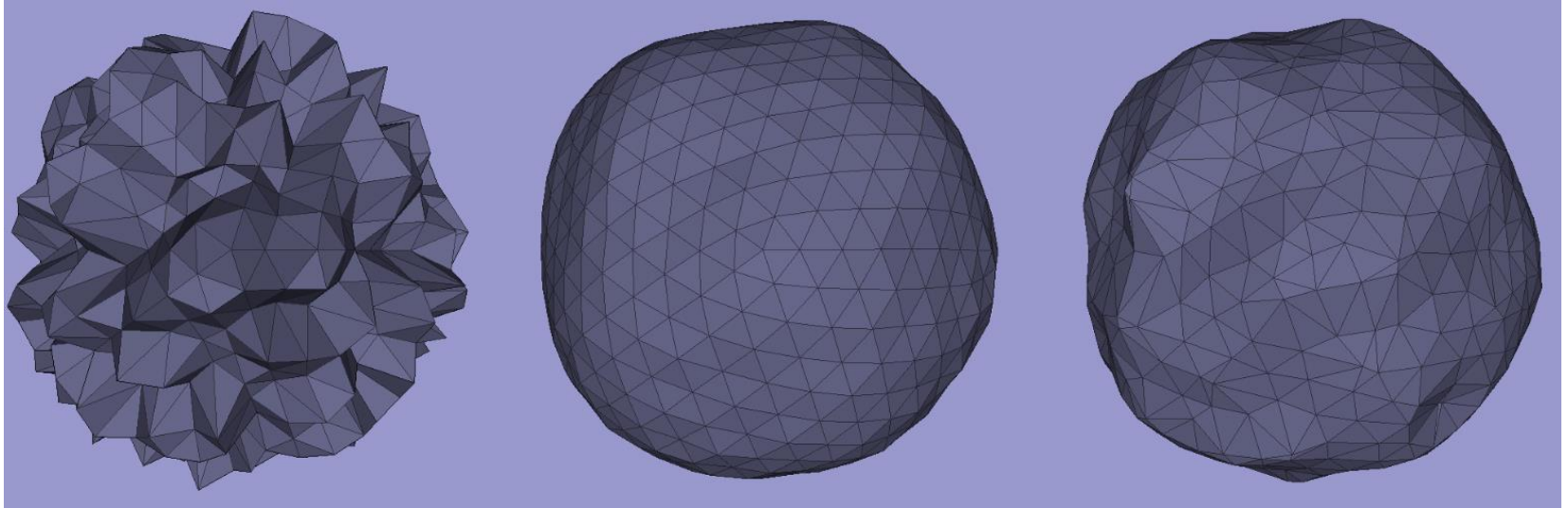
$$\frac{\partial X}{\partial t} = \lambda L(X)$$

- ▶ Iterative process over each vertex, starting with base mesh
 - ▶ $(x_1, x_2, \dots, x_n) = (x_1^0, x_2^0, \dots, x_n^0)$
- ▶ One step of process computes new positions of vertices
 - ▶ $(x_1^j, x_2^j, \dots, x_n^j) \rightarrow (x_1^{j+1}, x_2^{j+1}, \dots, x_n^{j+1})$
 - ▶ Compute $L(x_i^j)$
 - ▶ $x_i^{j+1} = x_i^j + \lambda dt L(x_i^j)$, $i = 1, 2, \dots, n$
 - ▶ λ - scalar that controls the diffusion speed
 - ▶ dt - sufficiently small time step
- ▶ Finish after user defined number of steps



Laplacian smoothing

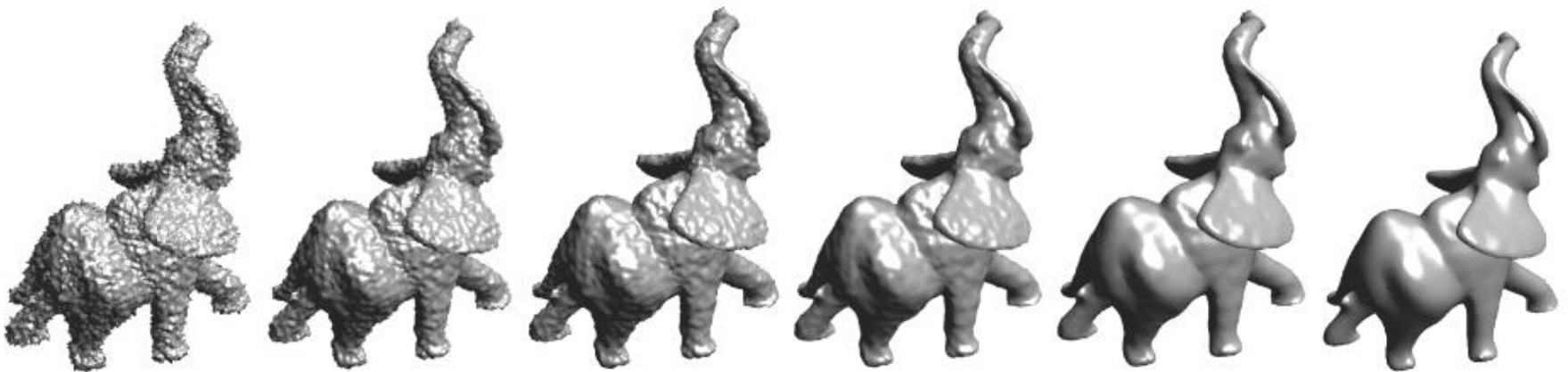
<http://w3.impa.br/~zang/pg2012/exe3.html>



Base mesh with noise

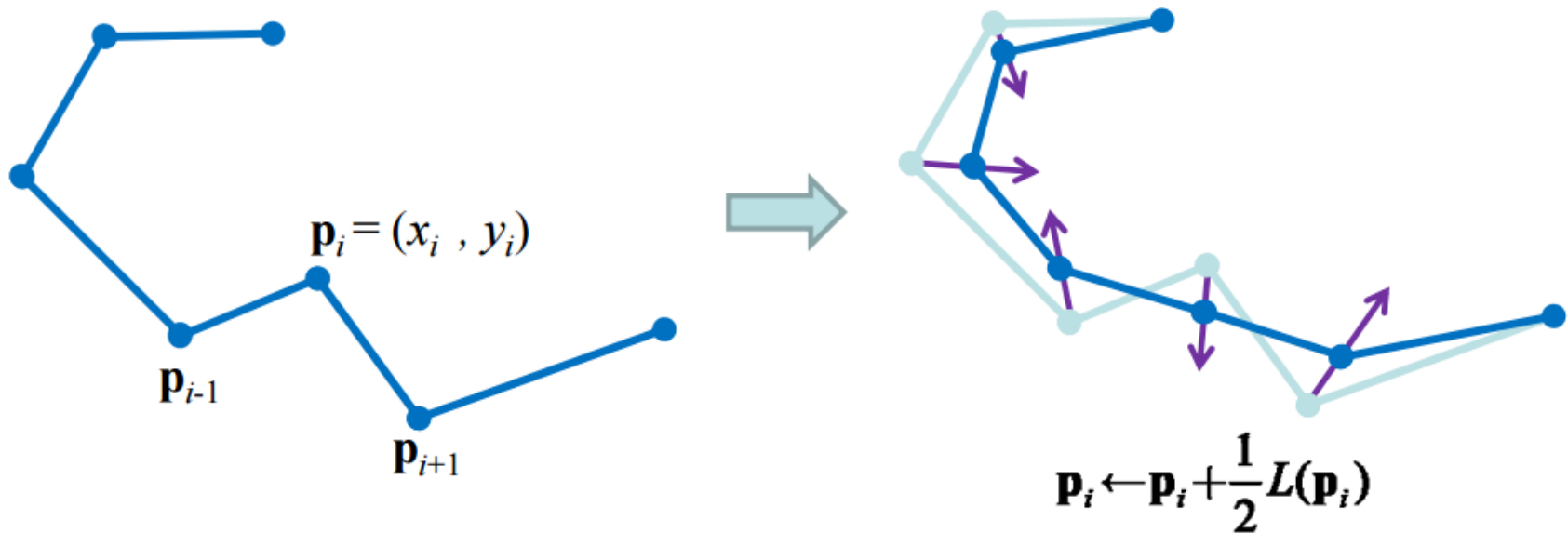
Uniform Laplacian smooth, 3 iterations

Cotangent Laplacian smooth, 3 iterations



<https://www.ceremade.dauphine.fr/~peyre/teaching/manifold/tp4.html>

Laplacian smoothing - Curves



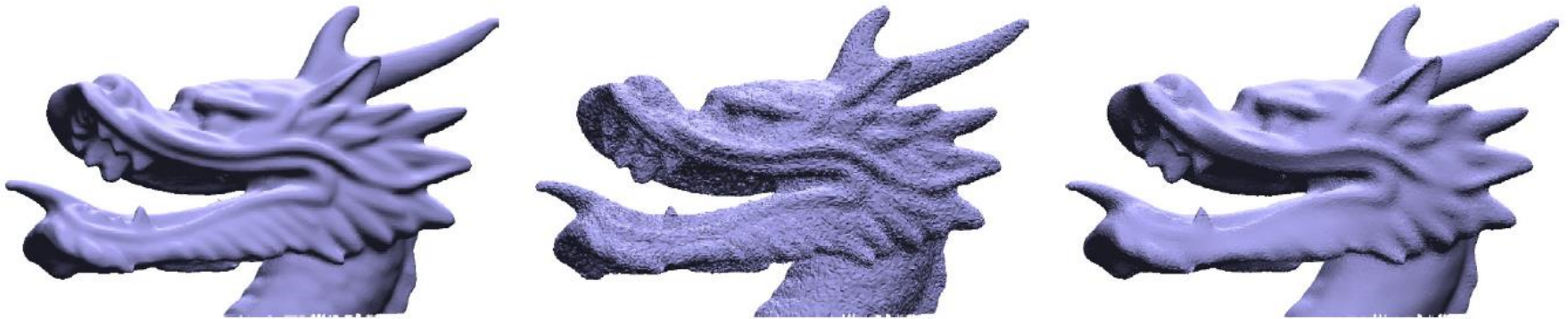
Finite difference
discretization of second
derivative
= Laplace operator in
one dimension

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

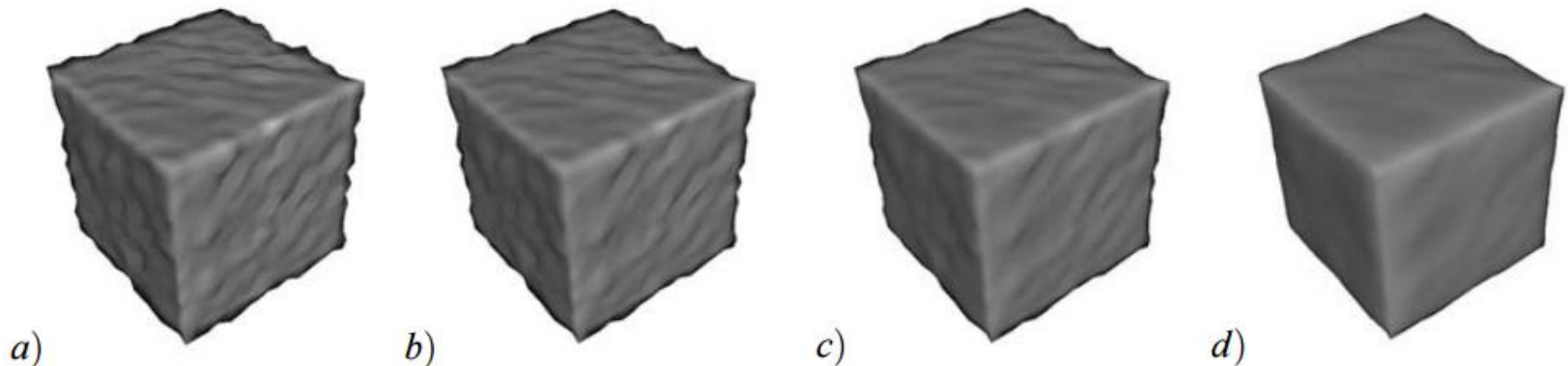
http://graphics.stanford.edu/courses/cs468-12-spring/LectureSlides/06_smoothing.pdf

Other smoothing algorithms

- ▶ <http://www.geometry.caltech.edu/pubs/JDD03.pdf>



- ▶ <https://otik.uk.zcu.cz/bitstream/handle/11025/10872/Svub.pdf?sequence=1>





The End for today