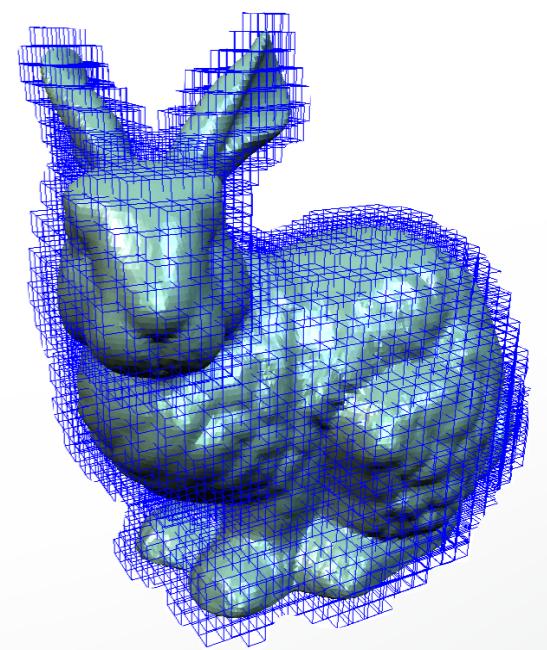


3.1 Explicit & Implicit Surfaces

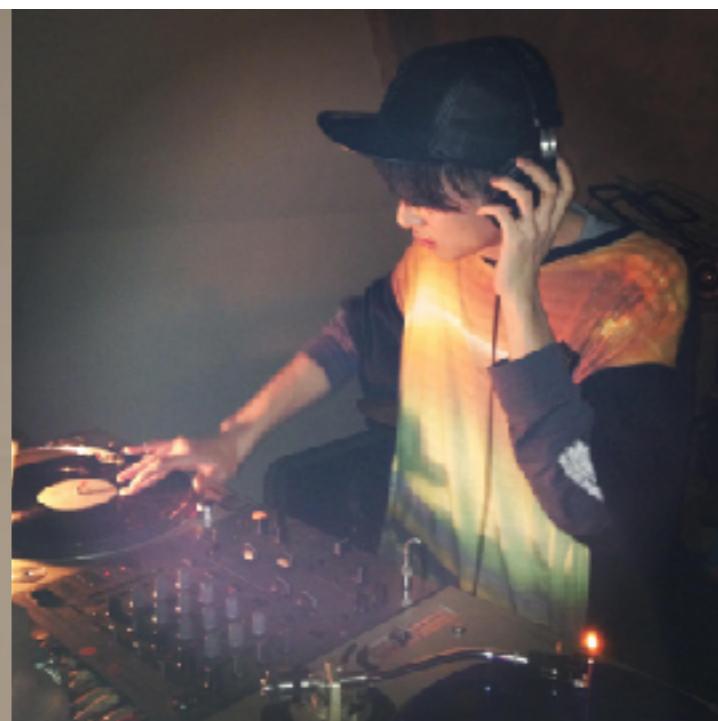


Hao Li

<http://cs621.hao-li.com>

Administrative

- **Exercise 1 discussion: Later**
- **Hao Li (Instructor)**
 - Office Hour: Tue 2:30 PM - 3:00 PM, SAL 244
- **Yi Zhou & Shunsuke Saito (TA)**
 - Office Hour: Still TBD :-)



Last Time

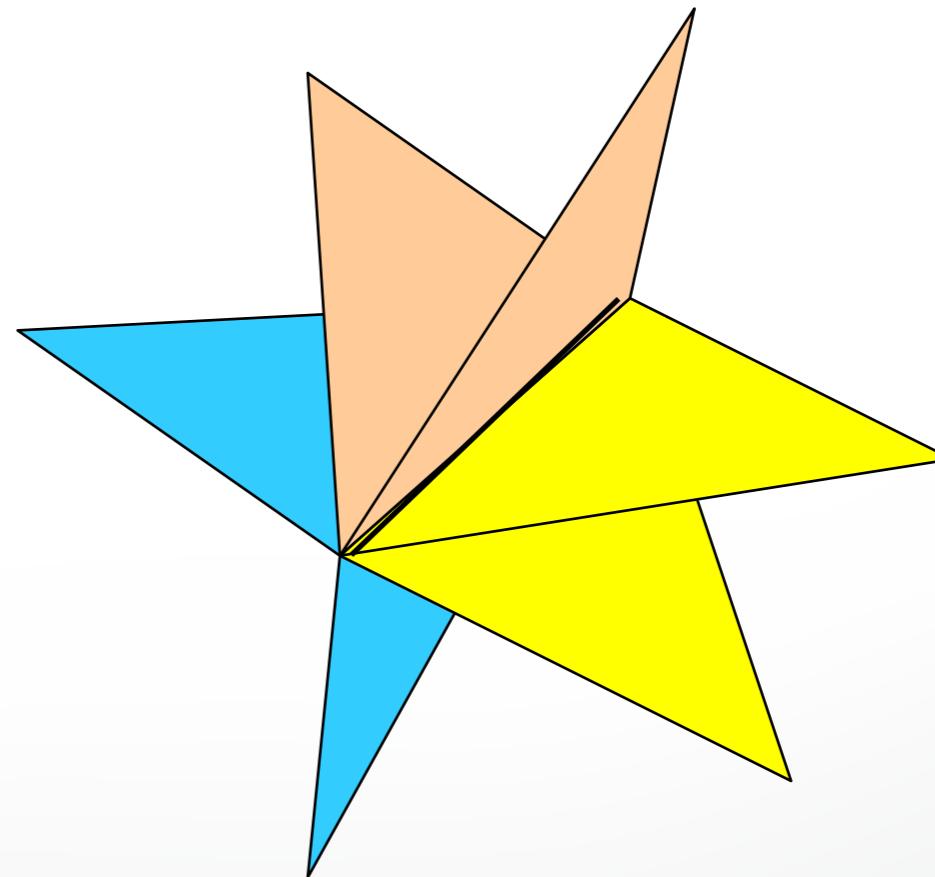
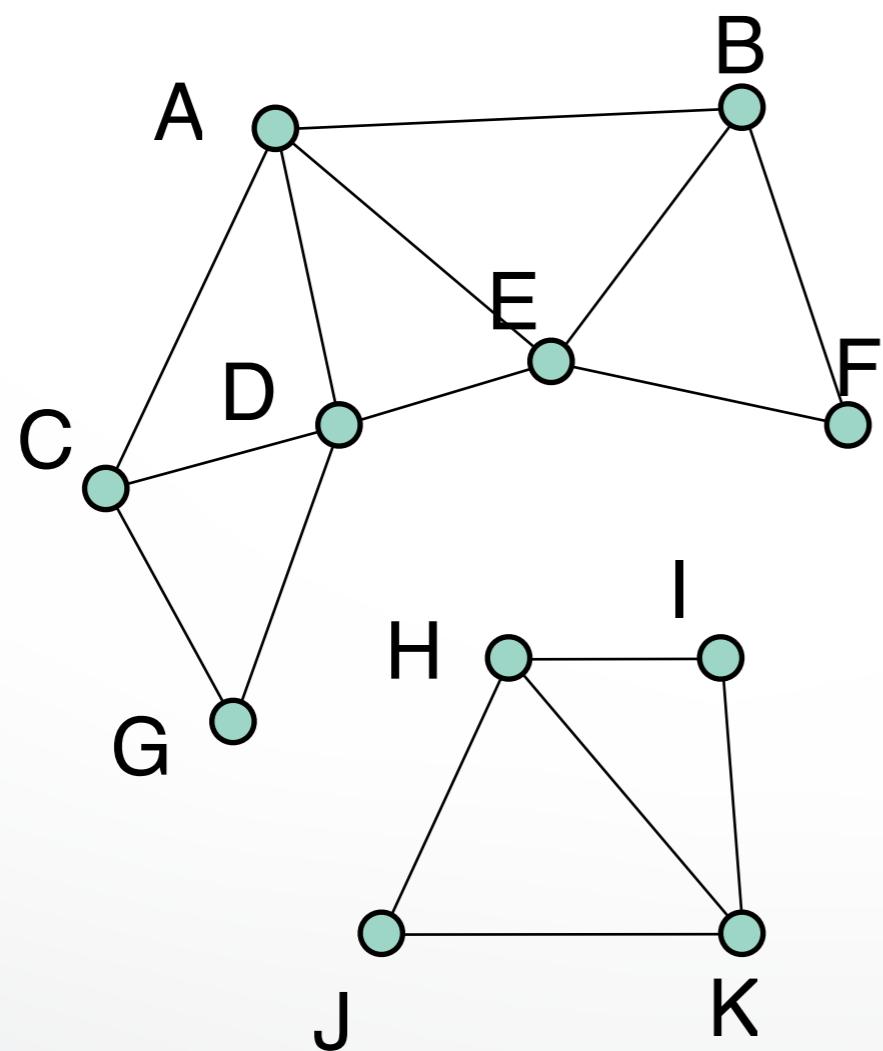
Polygonal meshes are

- Effective representations
- Flexible
- Efficient, simple, enables unified processing



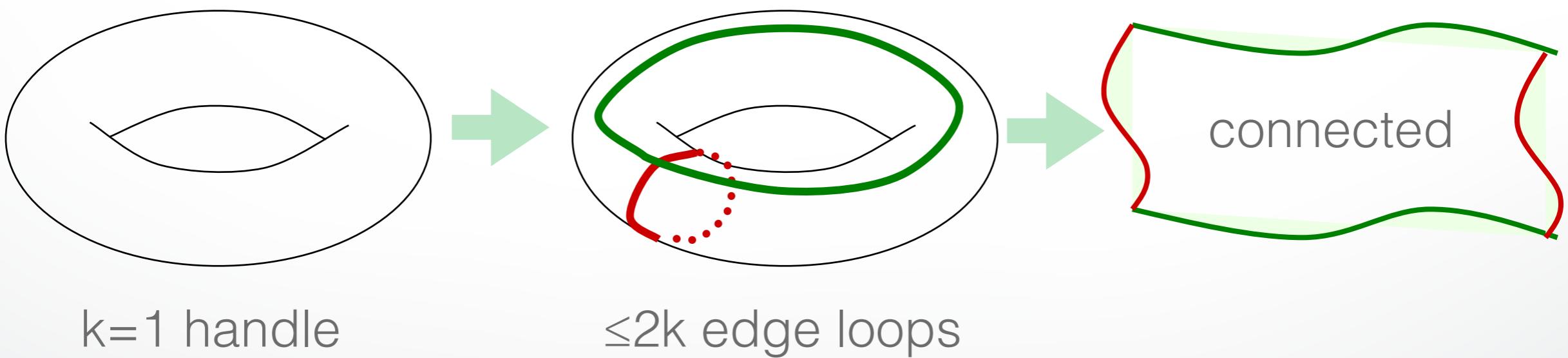
Connection between Meshes and Graphs

- Formalism (valence, connections, subgraph, embedding...)
- Definitions (boundary, regular edge, singular edge, closed mesh)
- triangulation → triangle mesh



Topology

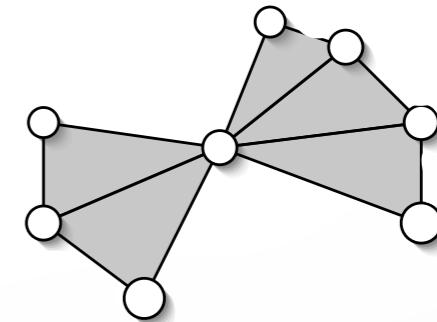
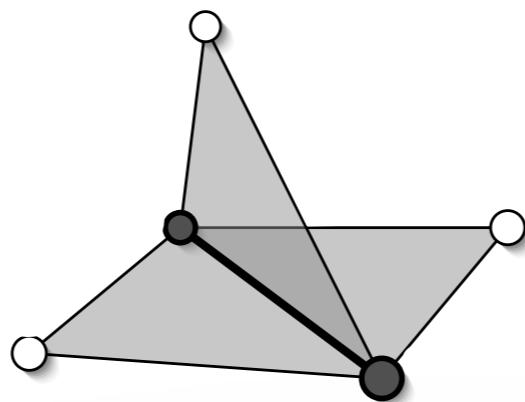
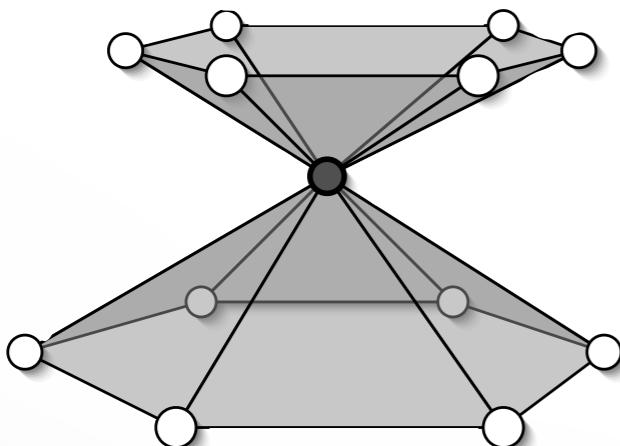
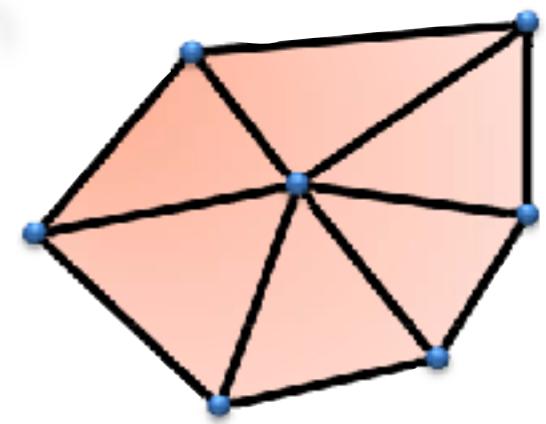
- Genus, Euler characteristic
- Euler Poincaré formula $V - E + F = 2(1 - g)$
- Average valence of triangle mesh: 6
- Triangles: $F = 2V$, $E = 3V$
- Quads: $F = V$, $E = 2V$



Last Time

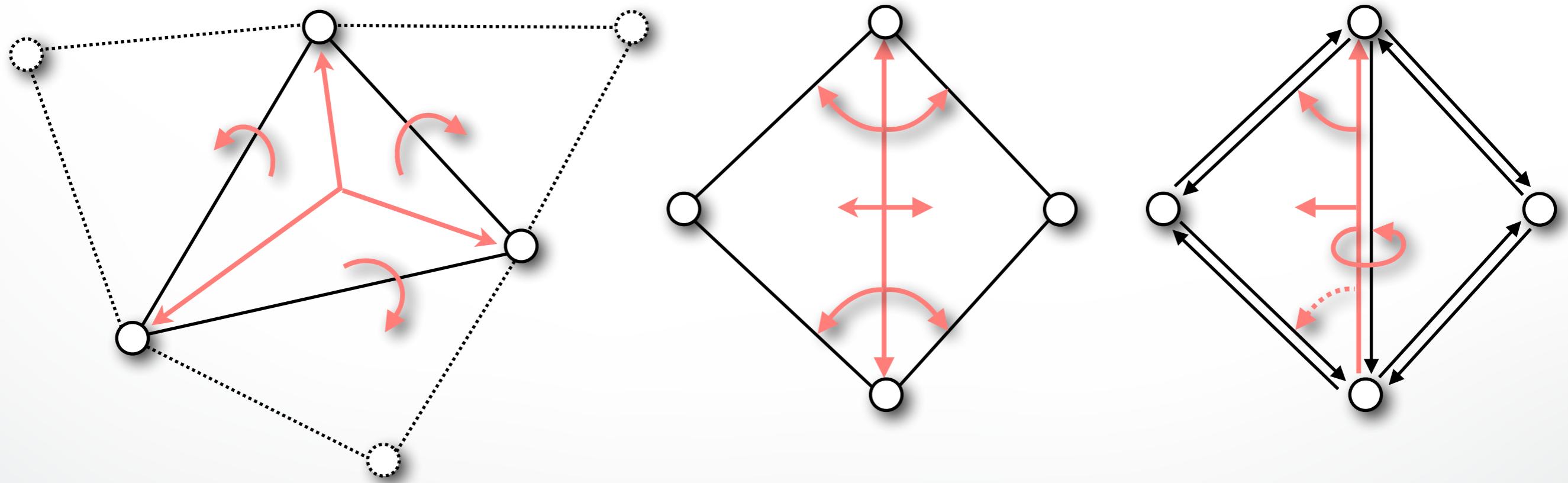
2-Manifold Surface

- Local Neighborhood is disk-shaped $\mathbf{f}(D_\epsilon[u, v]) = D_\delta[\mathbf{f}(u, v)]$
- Guarantees meaningful neighbor enumeration
- Non-manifold



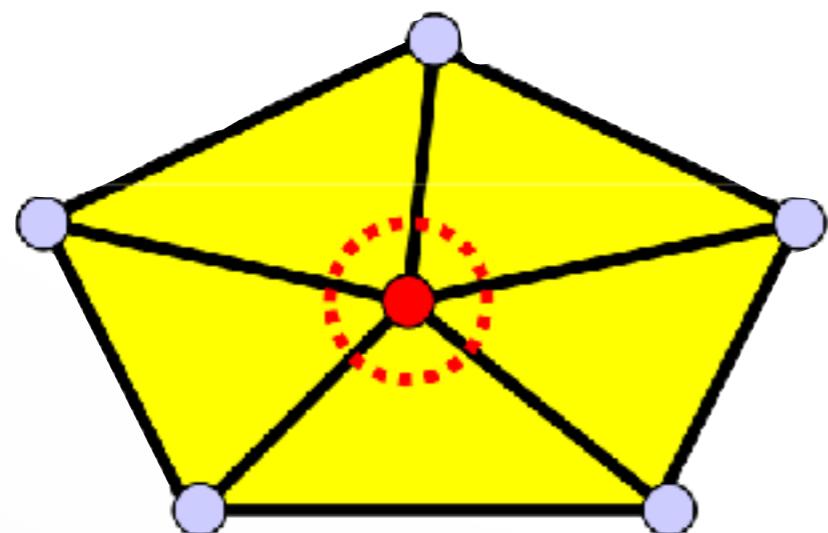
Data Structures

- Face-Based
- Edge-Based, edges always have two faces
- Halfedge-Based

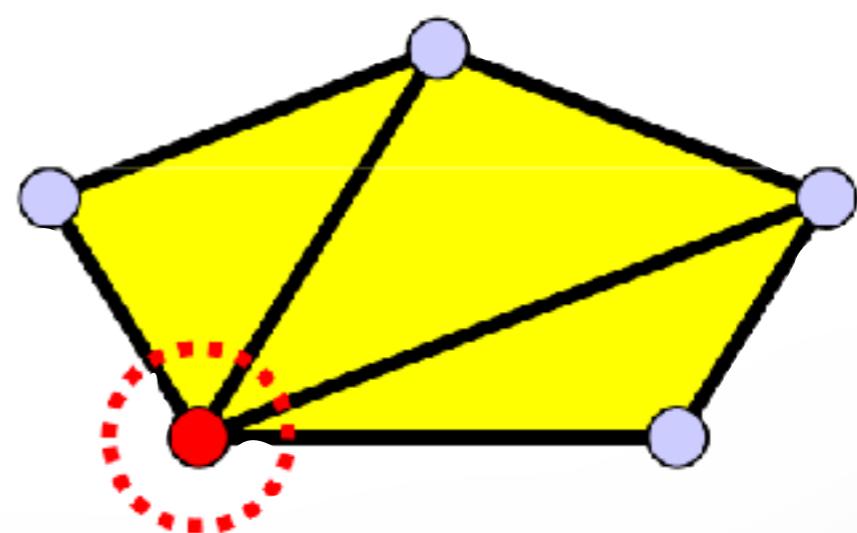


When is a Triangle Mesh a Manifold?

- Every Edge incident to 1 or 2 Triangles
- Faces incident to a vertex form closed or open fan



closed fan



open fan

Outline

- **Surface Representations**
 - Explicit Surfaces
 - Implicit Surfaces
 - Conversion

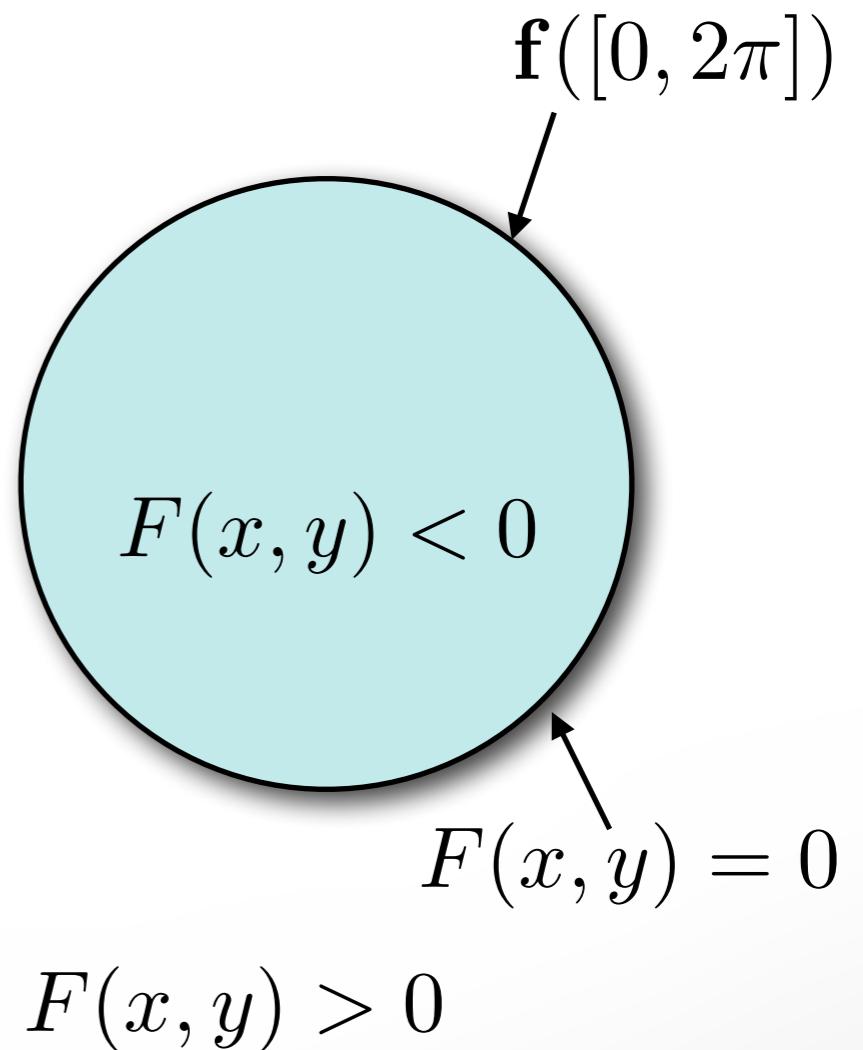
Explicit vs. Implicit

Explicit: $\mathbf{f}(x) = (r \cos(x), r \sin(x))^T$

- Range of parameterization function

Implicit: $F(x, y) = \sqrt{x^2 + y^2} - r$

- Kernel of implicit function



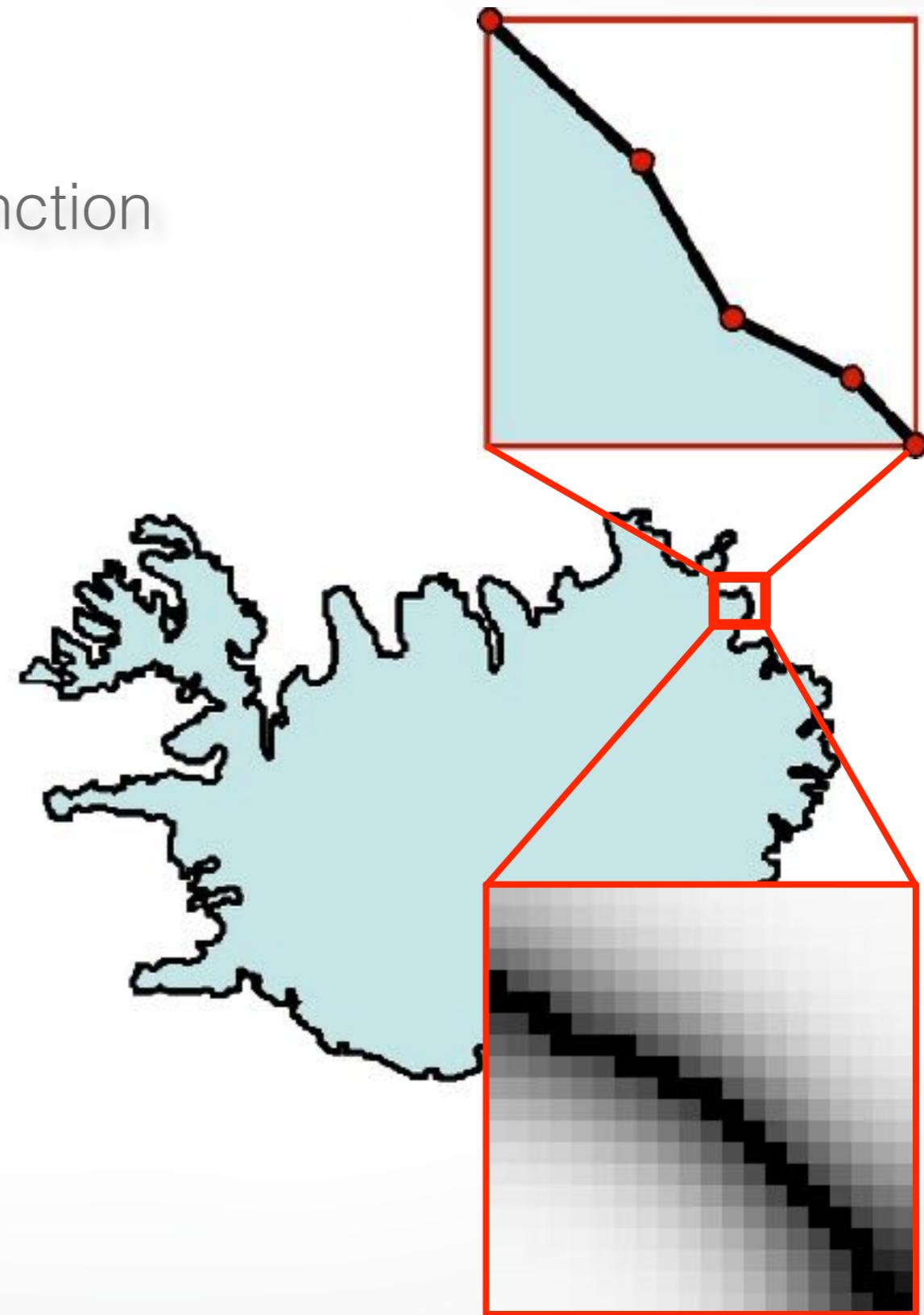
Explicit vs. Implicit

Explicit: $f(x) = ?$

- Range of parameterization function
- Piecewise approximation

Implicit: $F(x, y) = ?$

- Kernel of implicit function
- Piecewise approximation



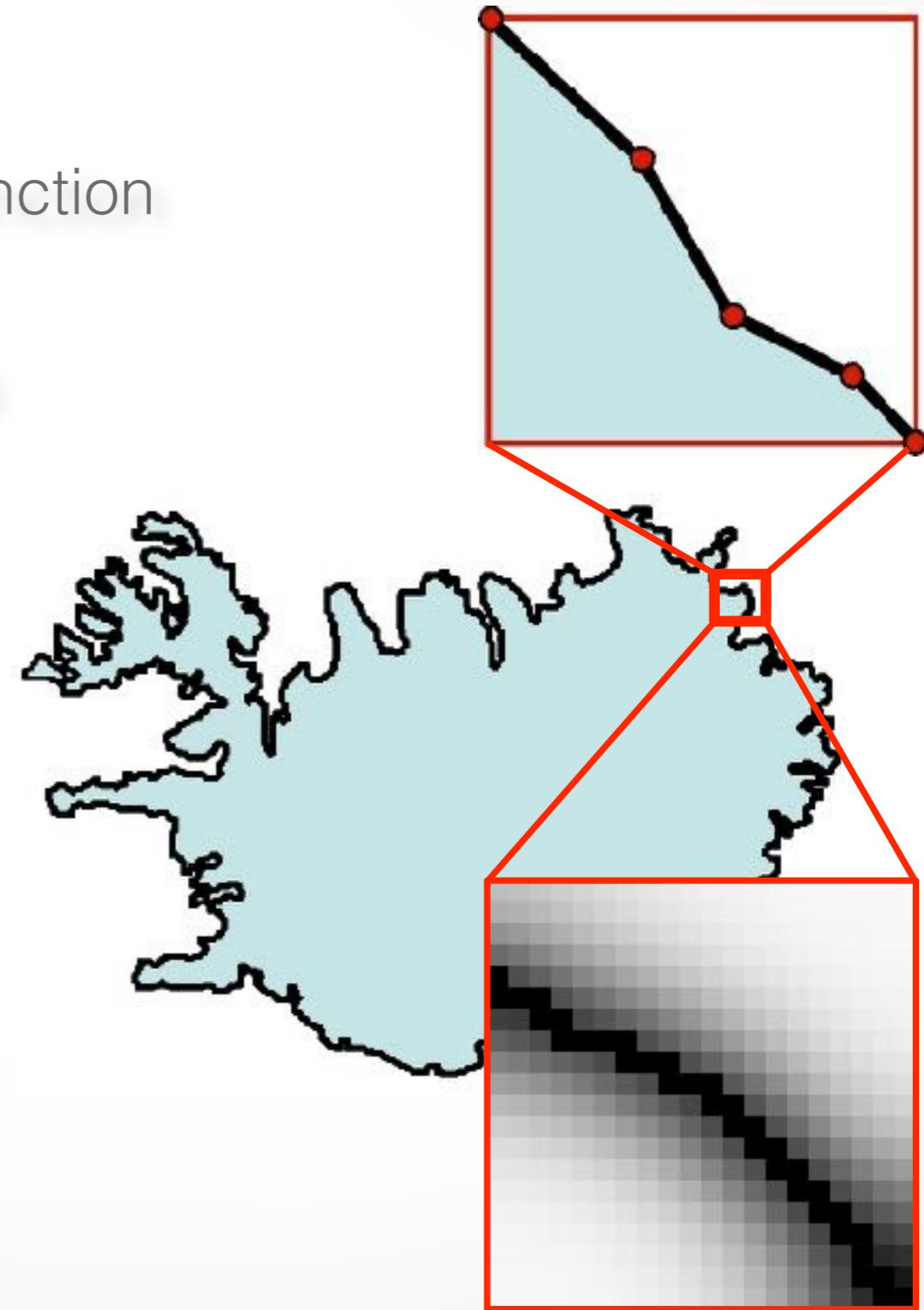
Explicit vs. Implicit

Explicit:

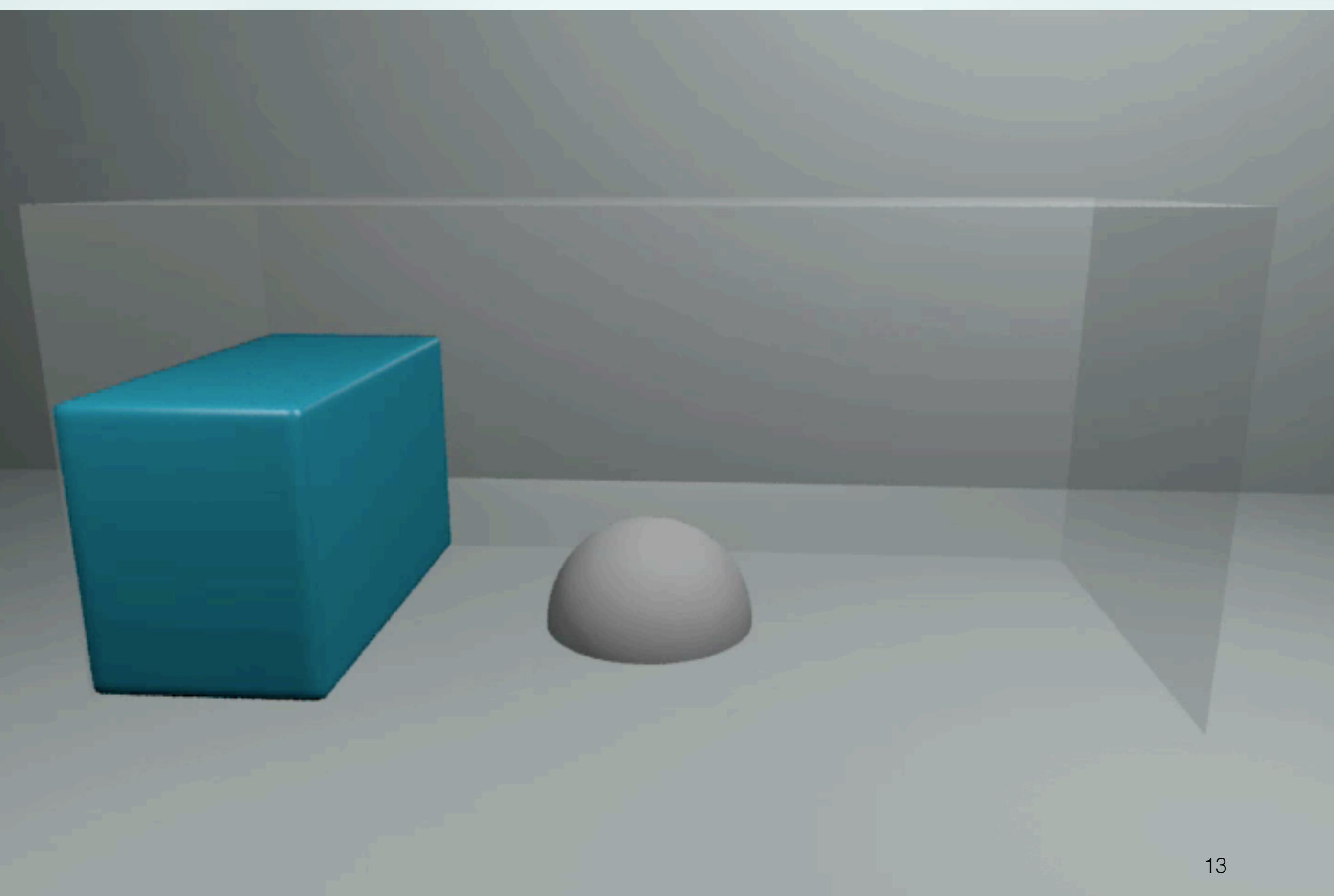
- Range of parameterization function
- Piecewise approximation
- Splines, triangle mesh, points
- Easy enumeration
- Easy geometry modification

Implicit:

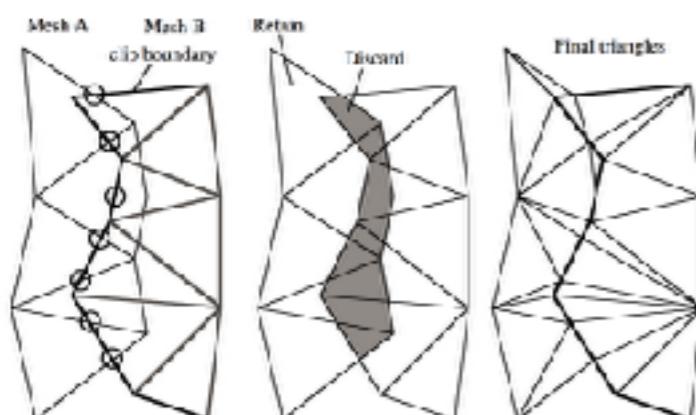
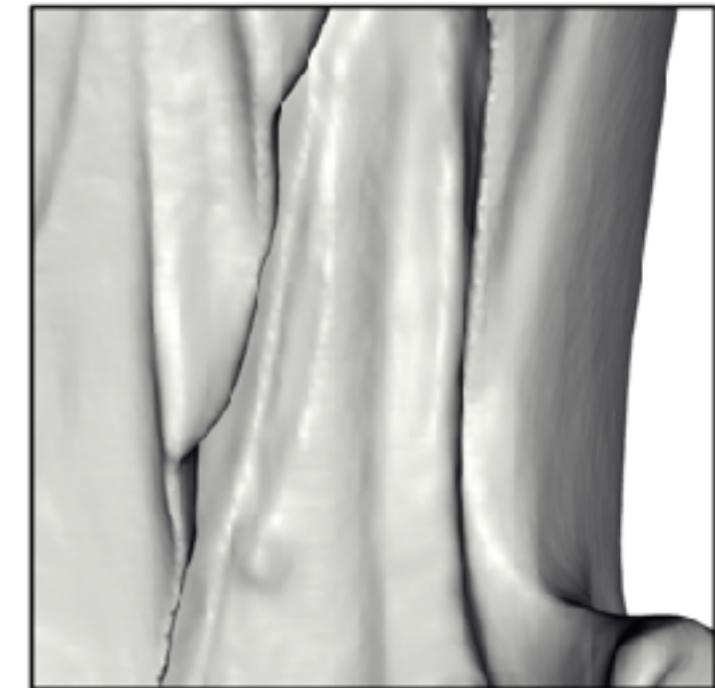
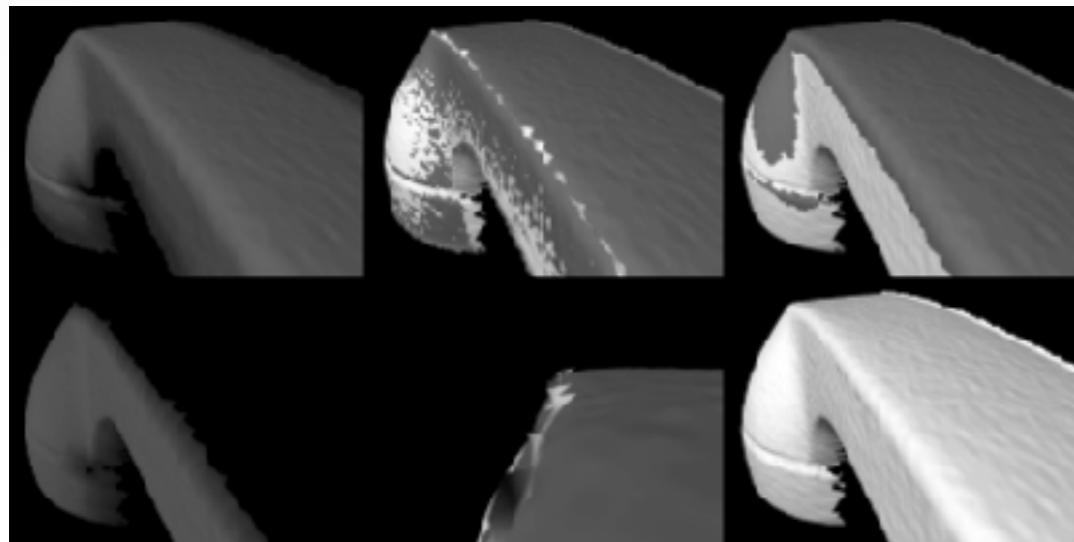
- Kernel of implicit function
- Piecewise approximation
- Scalar-valued 3D grid
- Easy in/out test
- Easy topology modification



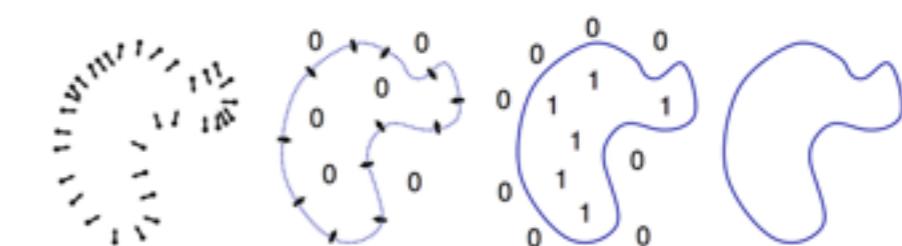
Examples: Fluid Simulation



Examples: 3D Reconstruction



Zippering



Poisson Reconstruction

Examples: Kinect Fusion



1. Capture
2. Align
3. Fuse



<http://msdn.microsoft.com/en-us/library/dn188670.aspx>

Outline

- Surface Representations
- **Explicit Surfaces**
- Implicit Surfaces
- Conversion

Polynomial Approximation

Polynomials are computable functions

$$f(t) = \sum_{i=0}^p c_i t^i = \sum_{i=0}^p \tilde{c}_i \phi_i(t)$$

Taylor expansion up to degree p

$$g(h) = \sum_{i=0}^p \frac{1}{i!} g^{(i)}(0) h^i + O(h^{p+1})$$

Error for approximation g by polynomial f

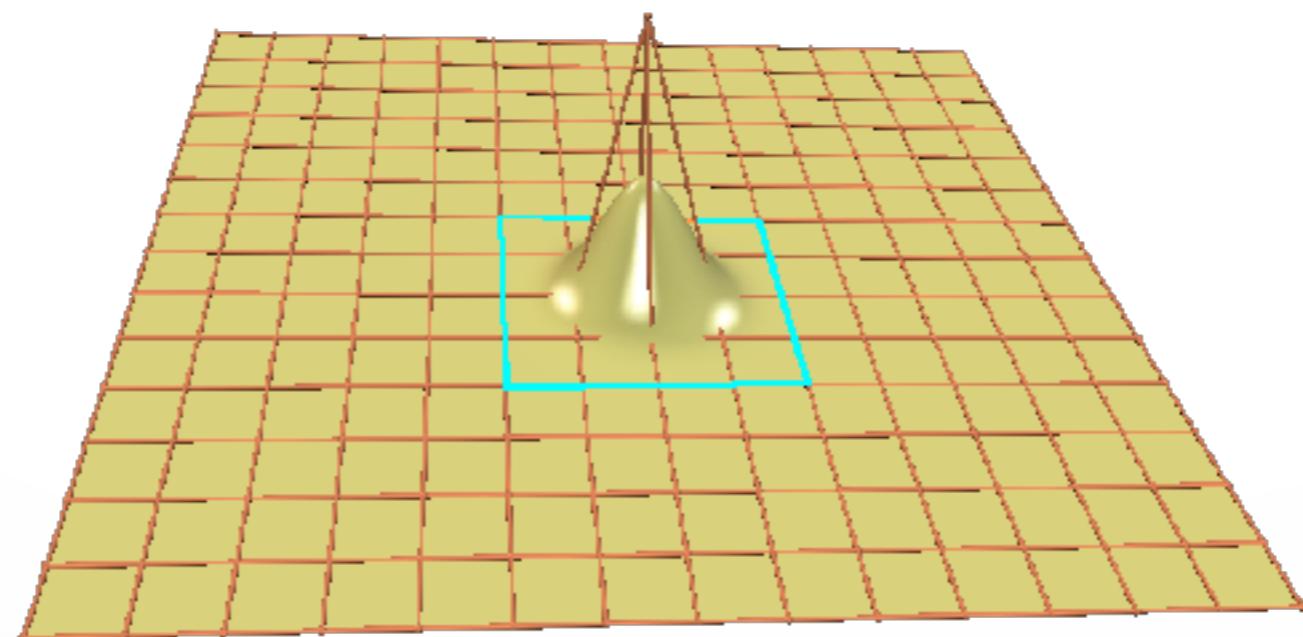
$$f(t_i) = g(t_i), \quad 0 \leq t_0 < \dots < t_p \leq h$$

$$|f(t) - g(t)| \leq \frac{1}{(p+1)!} \max f^{(p+1)} \prod_{i=0}^p (t - t_i) = O(h^{(p+1)})$$

Spline Surfaces

Piecewise polynomial approximation

$$\mathbf{f}(u, v) = \sum_{i=0}^n \sum_{j=0}^m \mathbf{c}_{ij} N_i^n(u) N_j^m(v)$$

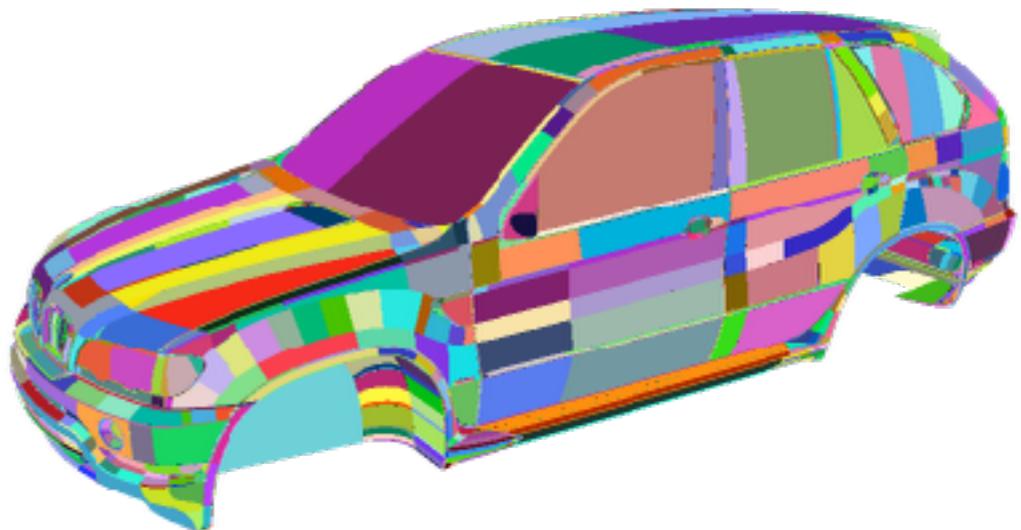


Spline Surfaces

Piecewise polynomial approximation

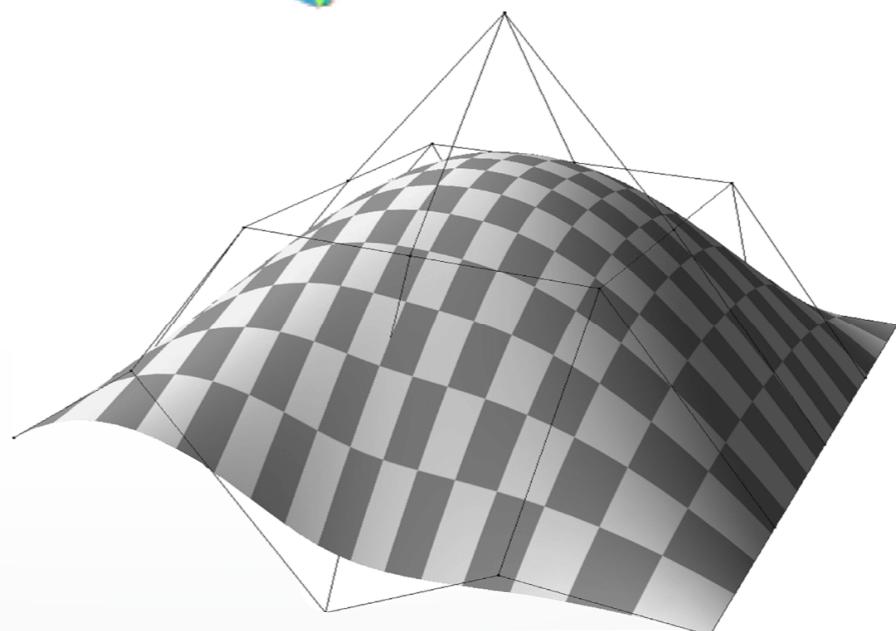
Geometric constraints

- Large number of patches
- Continuity between patches
- Trimming



Topological constraints

- Rectangular patches
- Regular control mesh



Polygon Meshes

Polygonal meshes are a good compromise

- Piecewise linear approximation → error is $O(h^2)$
- Error inversely proportional to #faces
- Arbitrary topology surfaces
- Piecewise smooth surfaces
- Adaptive sampling
- Efficient GPU-based rendering/processing



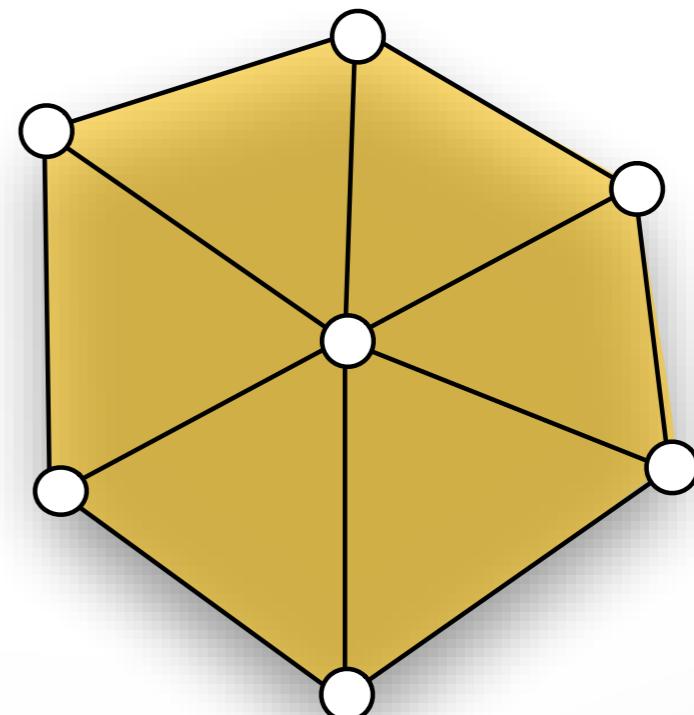
Triangle Meshes



$$\mathcal{M} = (\{\mathbf{v}_i\}, \{e_j\}, \{f_k\})$$

geometry $\mathbf{v}_i \in \mathbb{R}^3$

topology $e_i, f_i \subset \mathbb{R}^3$

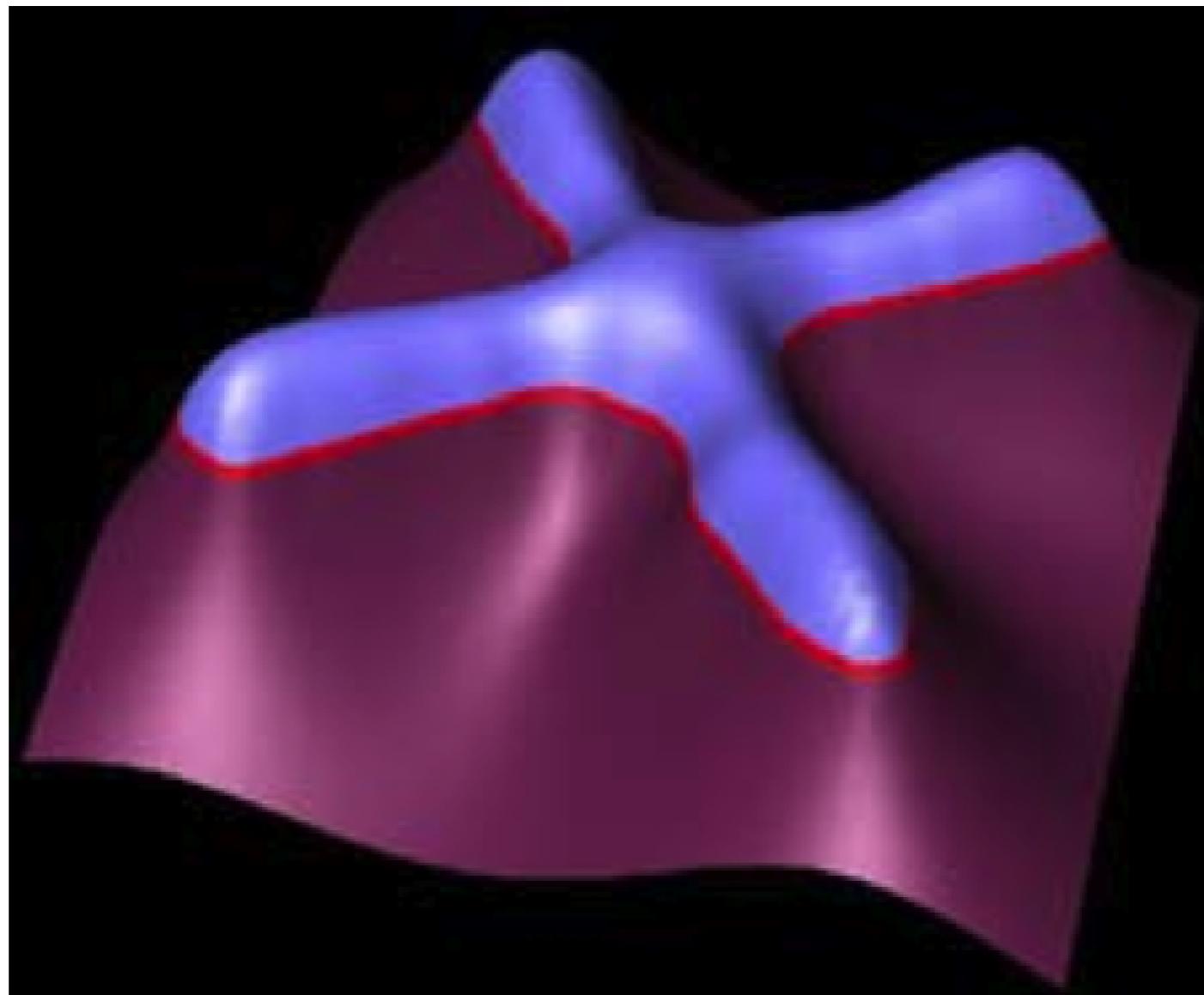


Outline

- Surface Representations
- Explicit Surfaces
- **Implicit Surfaces**
- Conversion

Implicit Representations

Level set of 2D function defines 1D curve



Implicit Representations

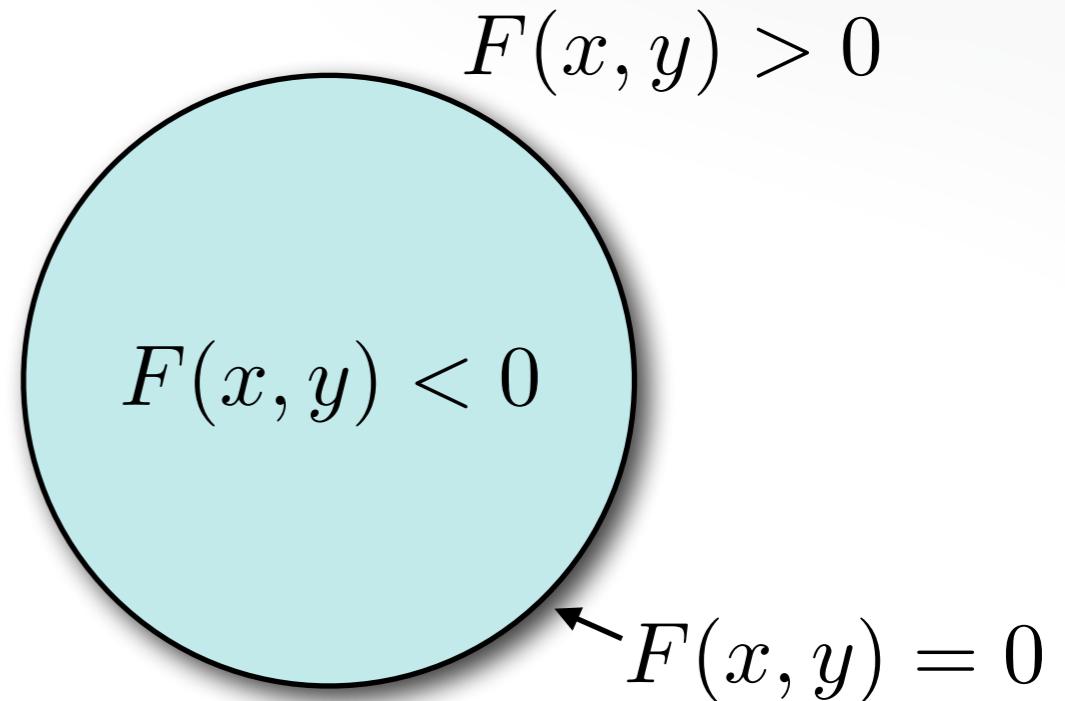
Level set of 3D function defines 2D surface



Implicit Representations

General implicit function:

- Interior: $F(x, y, z) < 0$
- Exterior: $F(x, y, z) > 0$
- Surface: $F(x, y, z) = 0$



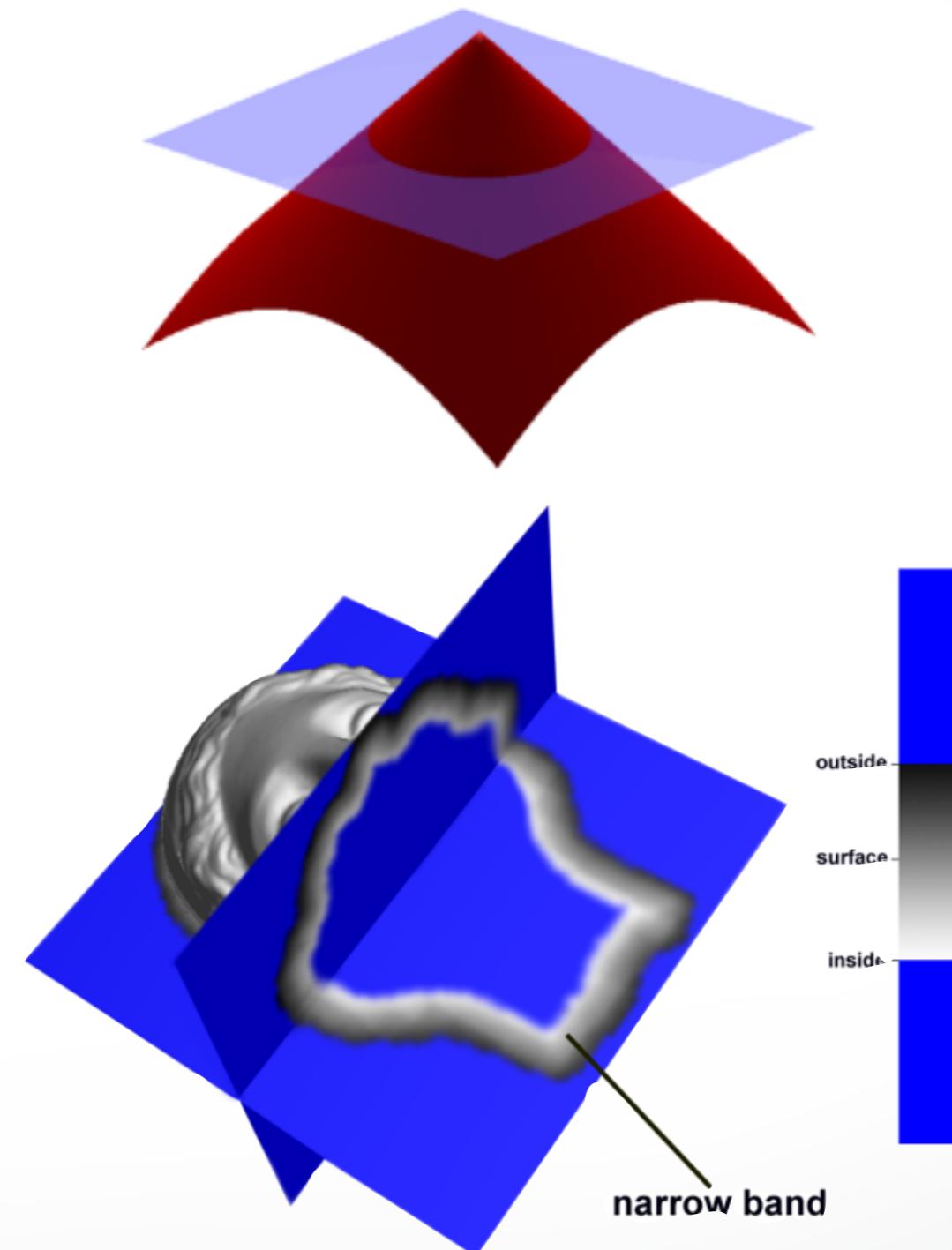
Gradient ∇F is orthogonal to level set

Special case

- Signed distance function (SDF)
- Gradient ∇F is unit surface normal 

Signed Distance Function

SDF of a circle?

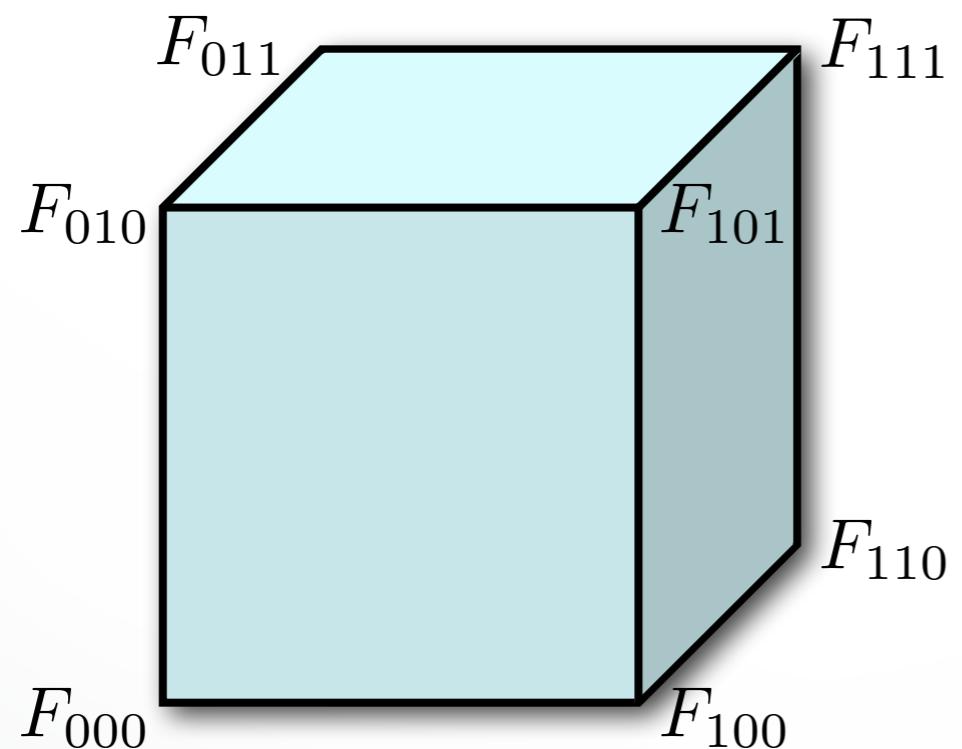


General shapes

SDF Discretization

Regular cartesian 3D grid

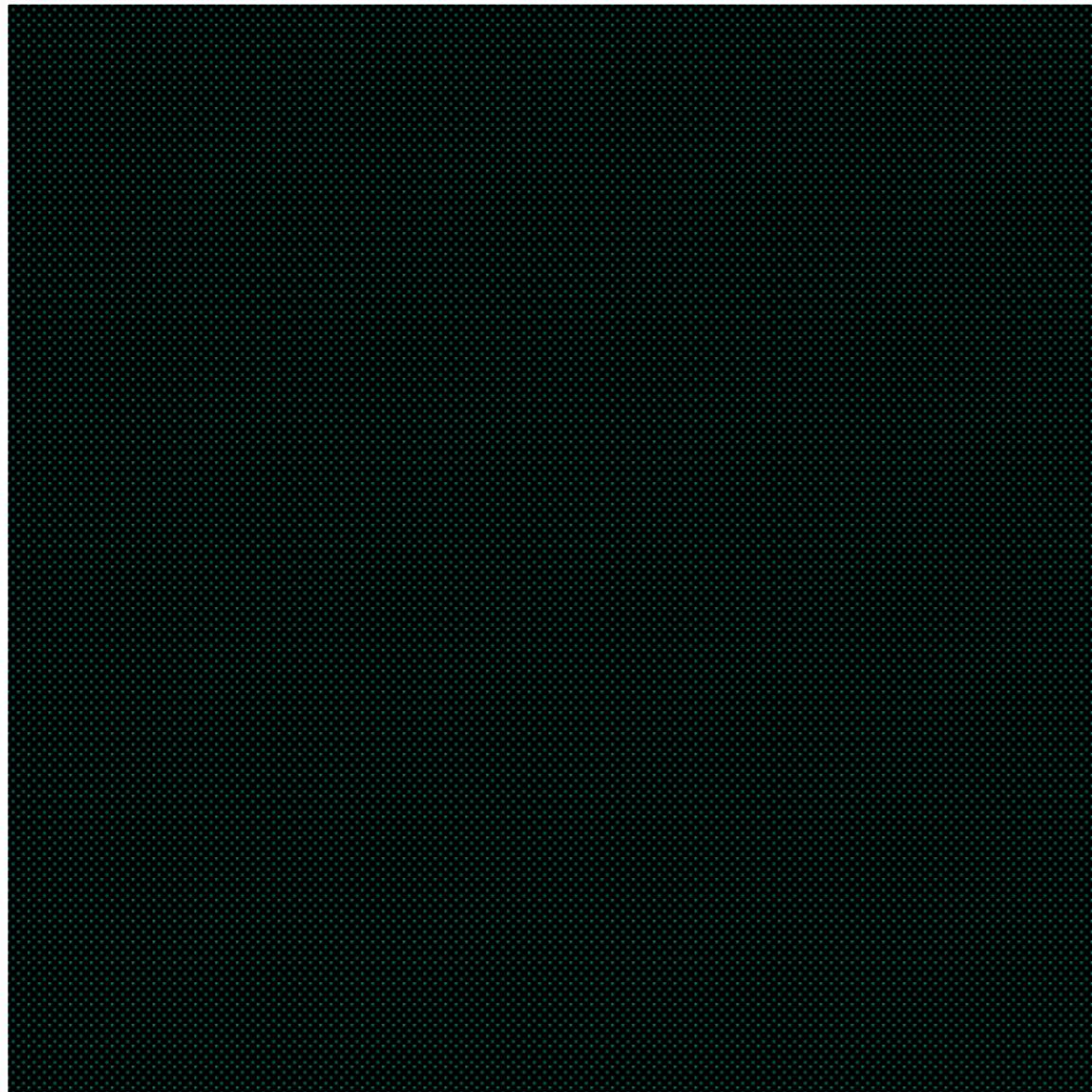
- Compute signed distance at nodes
- Tri-linear interpolation within cells



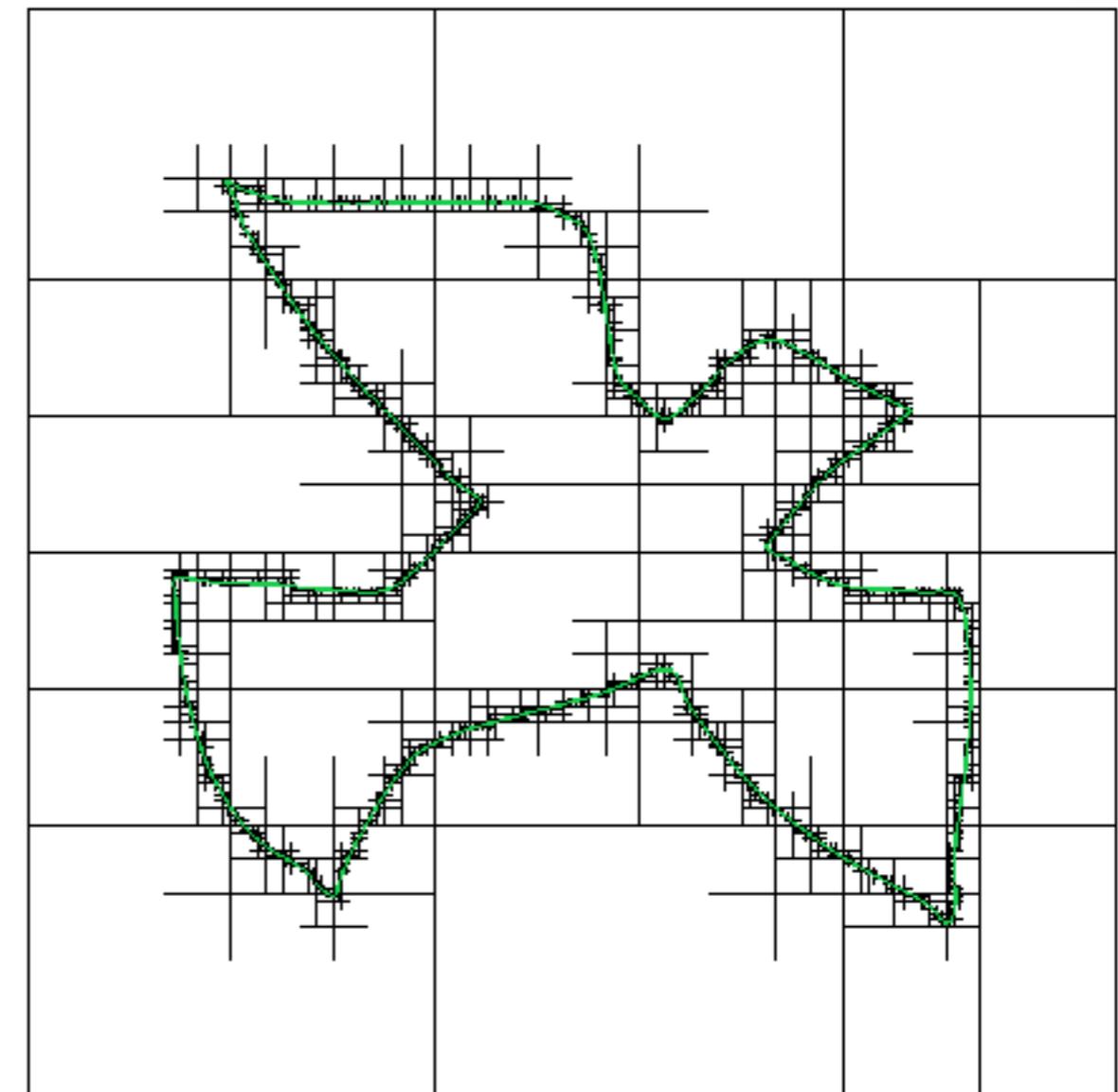
$$\begin{aligned} & F_{000} \quad (1-u) \quad (1-v) \quad (1-w) \quad + \\ & F_{100} \quad \quad u \quad (1-v) \quad (1-w) \quad + \\ & F_{010} \quad (1-u) \quad \quad v \quad (1-w) \quad + \\ & F_{001} \quad (1-u) \quad (1-v) \quad \quad w \quad + \\ & \vdots \\ & F_{111} \quad \quad u \quad \quad v \quad \quad w \end{aligned}$$

3-Color Octree

interior, exterior, boundary

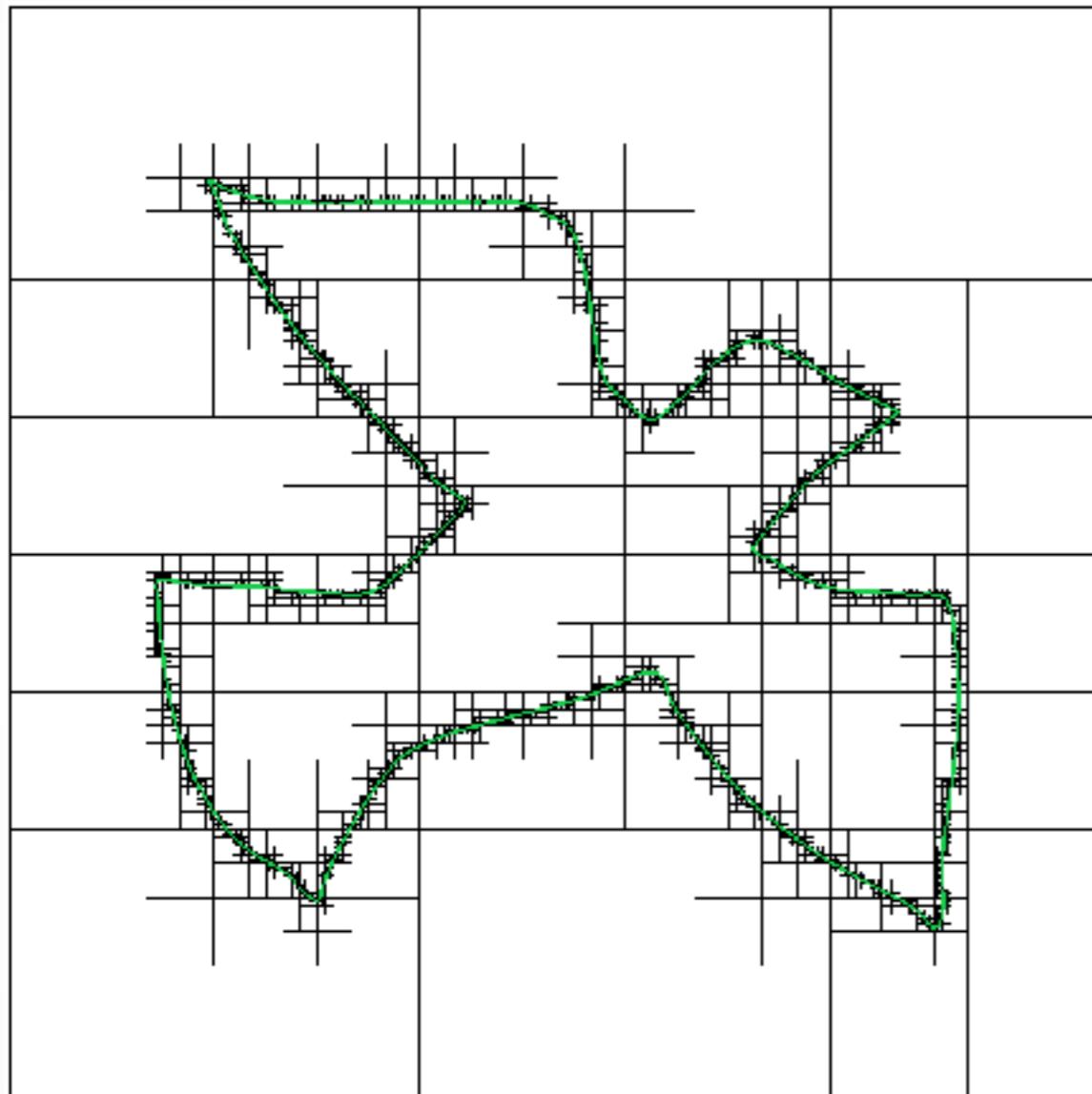


1048576 cells

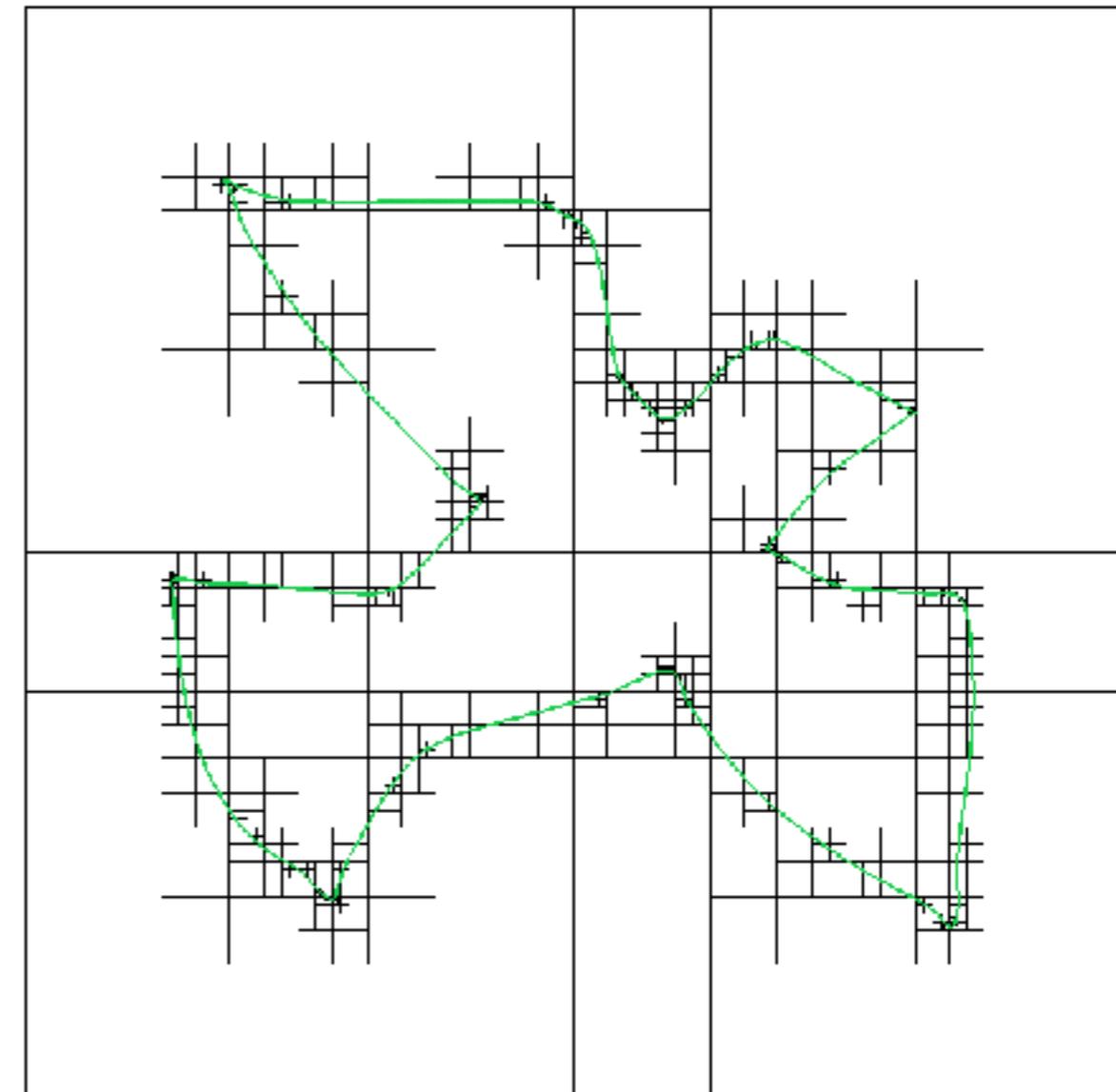


12040 cells

Adaptively Sampled Distance Fields

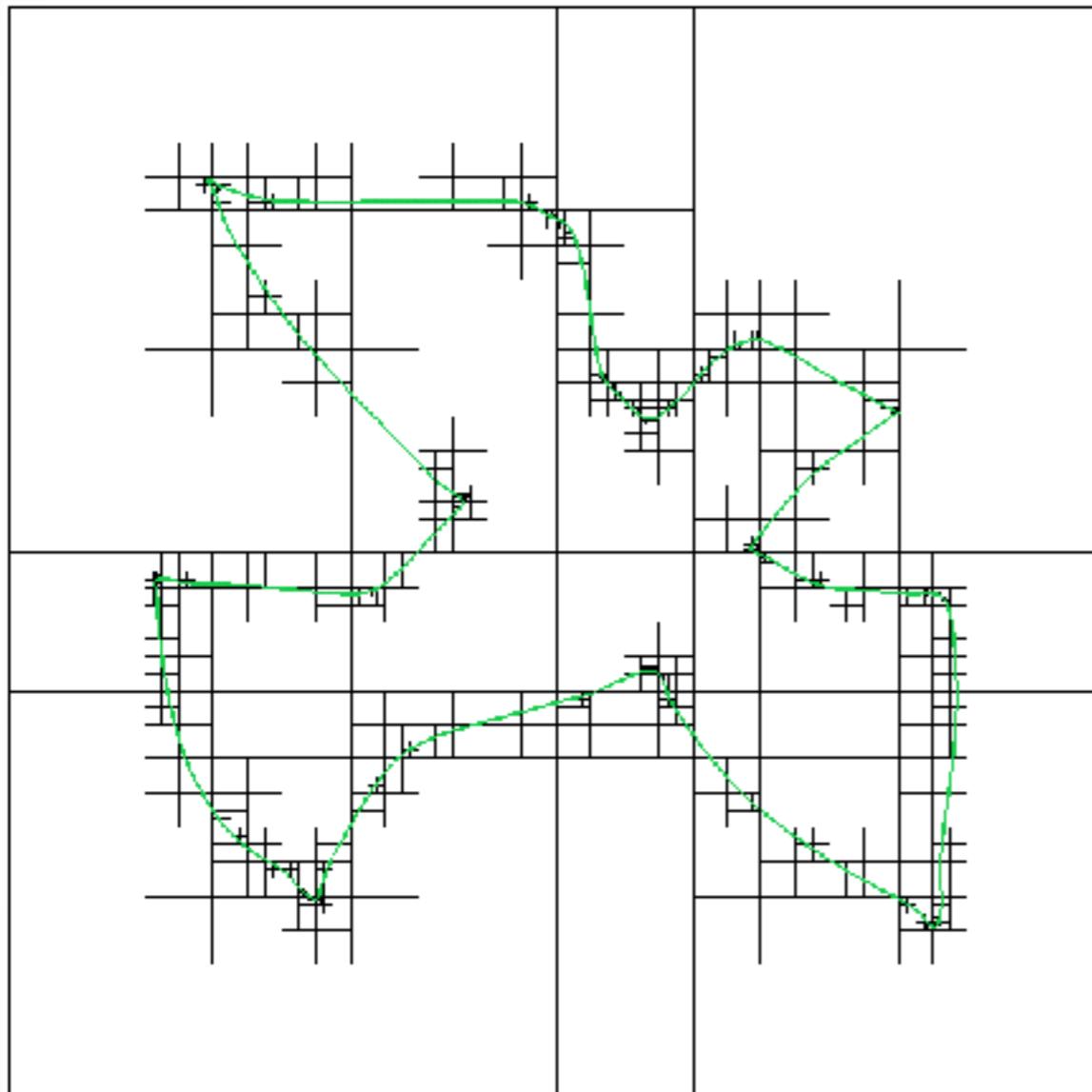


12040 cells

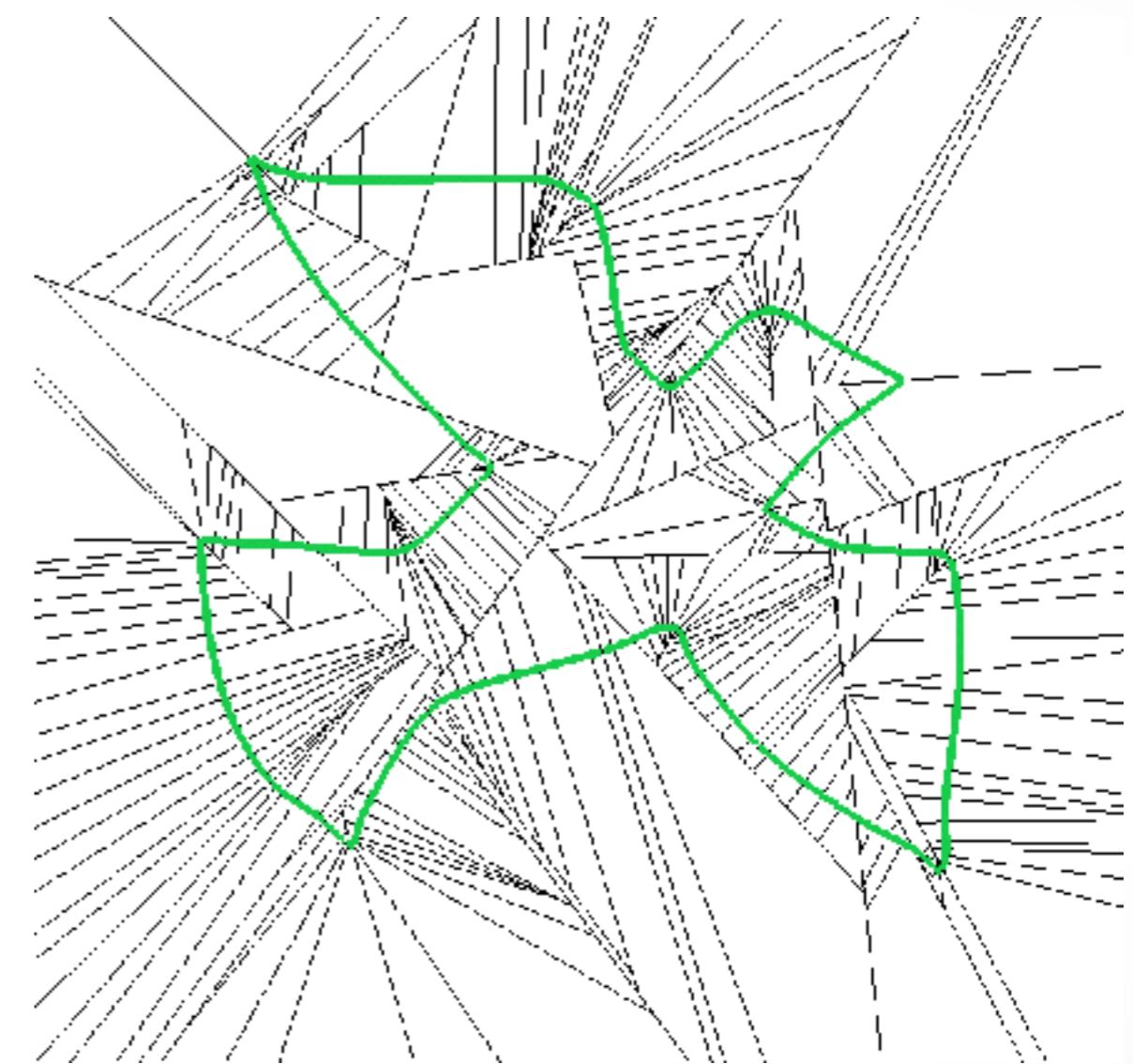


895 cells

Binary Space Partitions



895 cells



254 cells

Regularity vs. Complexity

Implicit surface discretizations

- Uniform, regular voxel grids $O(h^{-3})$
- Adaptive, 3-color octrees
 - Surface-adaptive refinement $O(h^{-2})$
 - Feature-adaptive refinement $O(h^{-1})$
- Irregular hierarchies
 - Binary space partition (BSP) $O(h^{-1})$

Literature

- Frisken et al., “Adaptively Sampled Distance Fields: A general representation of shape for computer graphics”, SIGGRAPH 2000
- Wu & Kobbelt, “Piecewise Linear Approximation of Signed Distance Fields”, VMV 2003

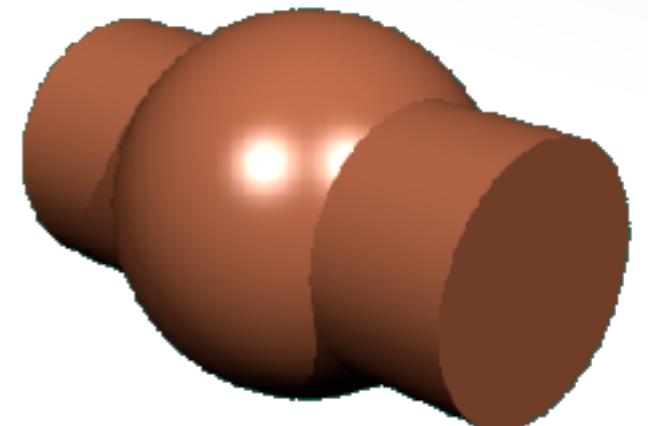
Implicit Representations

- Natural representation for **volumetric data**: CT scans, density fields, etc.
- Advantageous when modeling shapes with **complex and/or changing topology** (e.g., fluids)
- Very suitable representation for **Constructive Solid Geometry (CSG)**

CSG Example

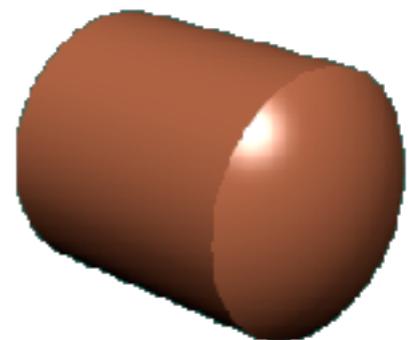
Union

$$F_{C \cup S}(\cdot) = \min \{F_C(\cdot), F_S(\cdot)\}$$



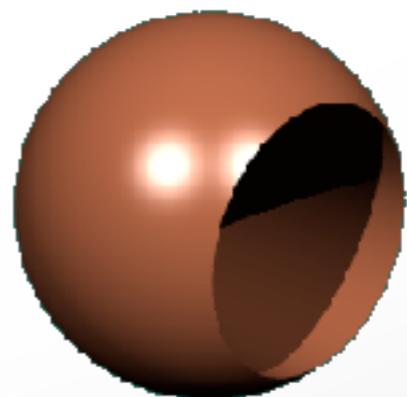
Intersection

$$F_{C \cap S}(\cdot) = \max \{F_C(\cdot), F_S(\cdot)\}$$

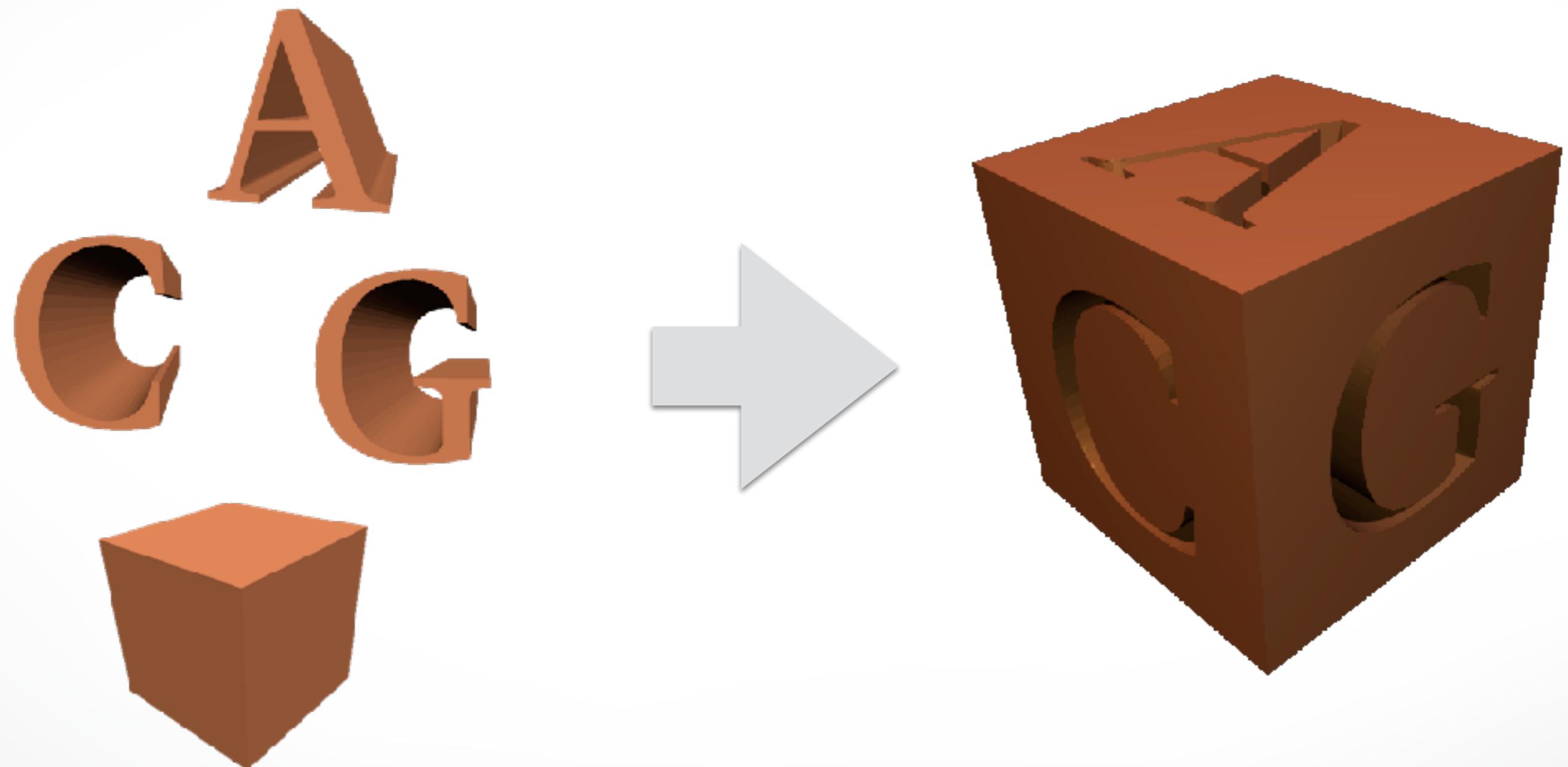


Difference

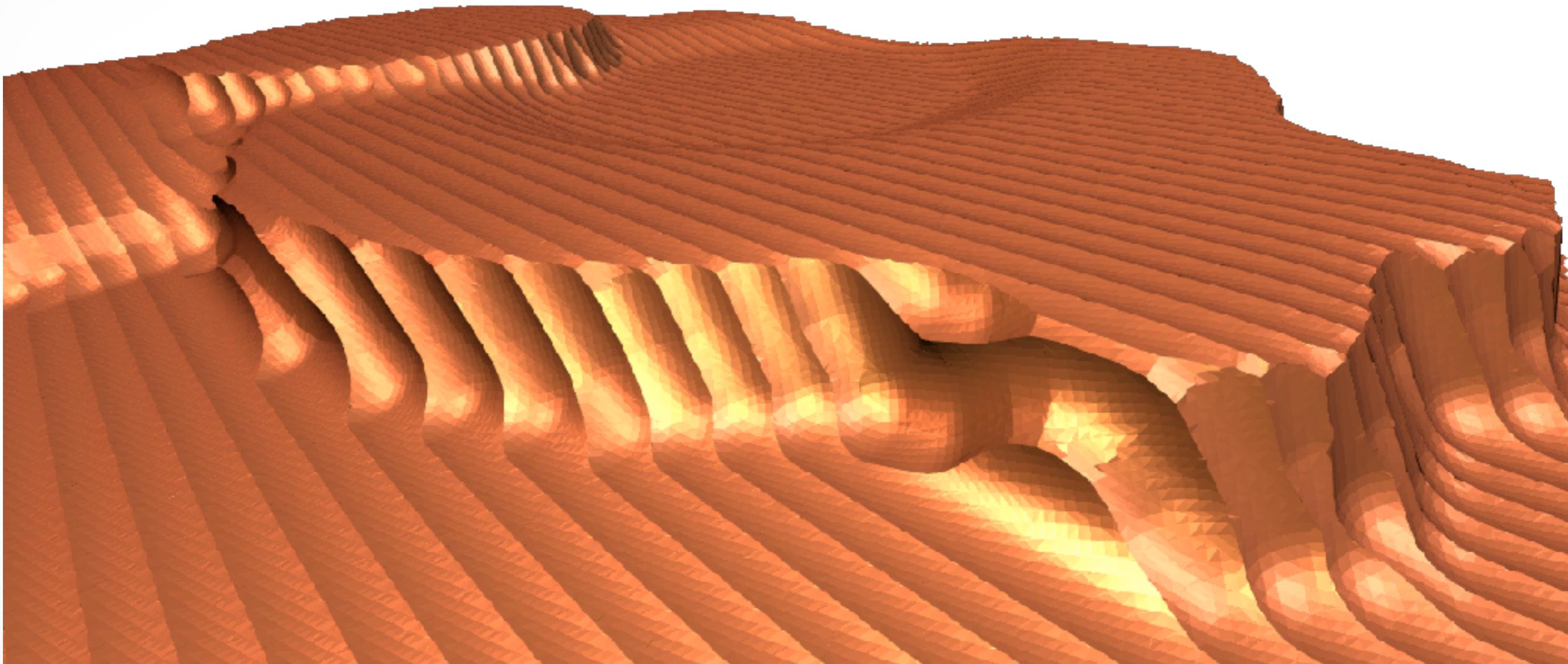
$$F_{S \setminus C}(\cdot) = \max \{-F_C(\cdot), F_S(\cdot)\}$$



CSG Example



CSG Example: Milling



Outline

- Surface Representations
- Explicit Surfaces
- Implicit Surfaces
- **Conversion**

Conversion

Explicit to Implicit

- Compute signed distance at grid points
- Compute distance point-mesh
- Fast marching

Implicit to Explicit

- Extract zero-level iso-surface $F(x, y, z) = 0$
- Other iso-surfaces $F(x, y, z) = C$
- Medical imaging, simulations, measurements, ...

Signed Distance Computation

Find closest mesh triangle

- Use spatial hierarchies (octree, BSP tree)

Distance point-triangle

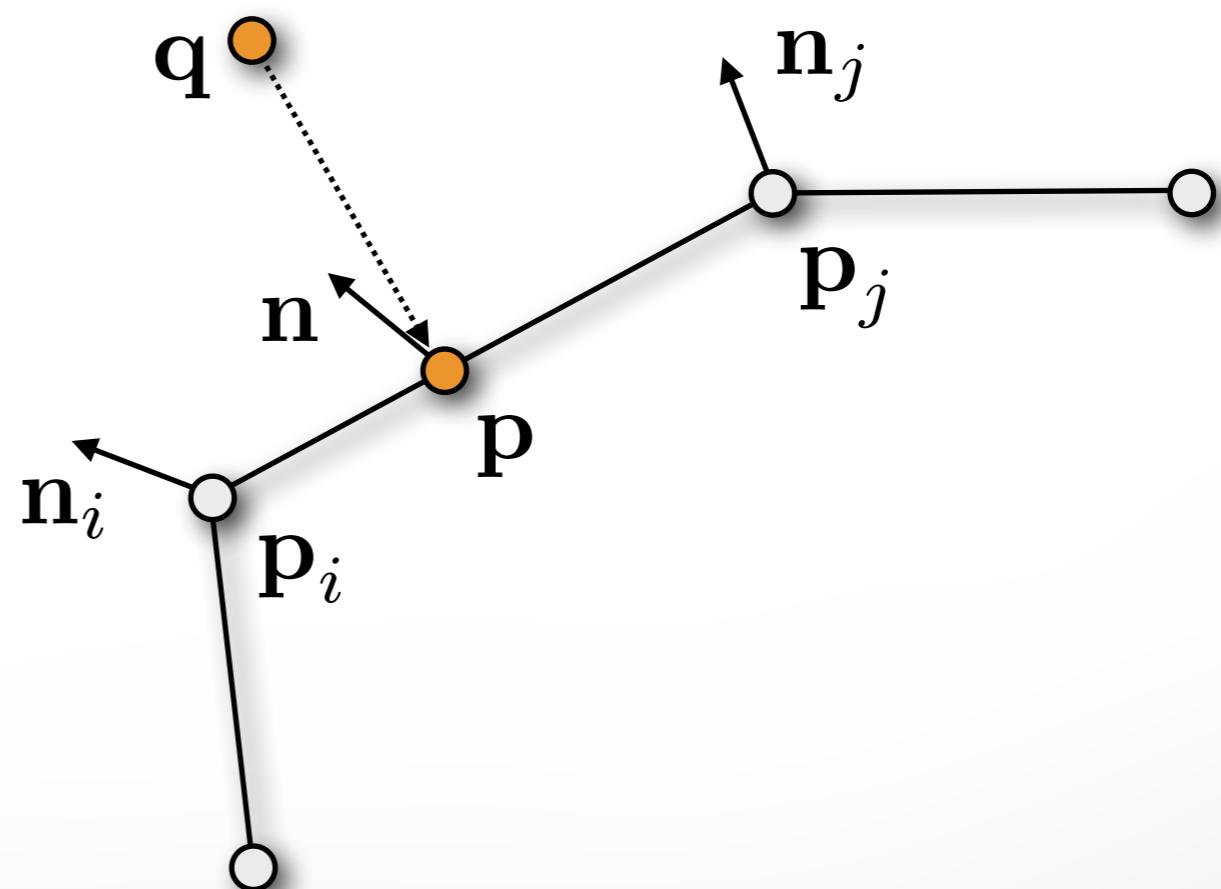
- Distance to plane, edge, or vertex
- <http://www.geometrictools.com>

Inside or outside?

- Based on interpolated surface normals

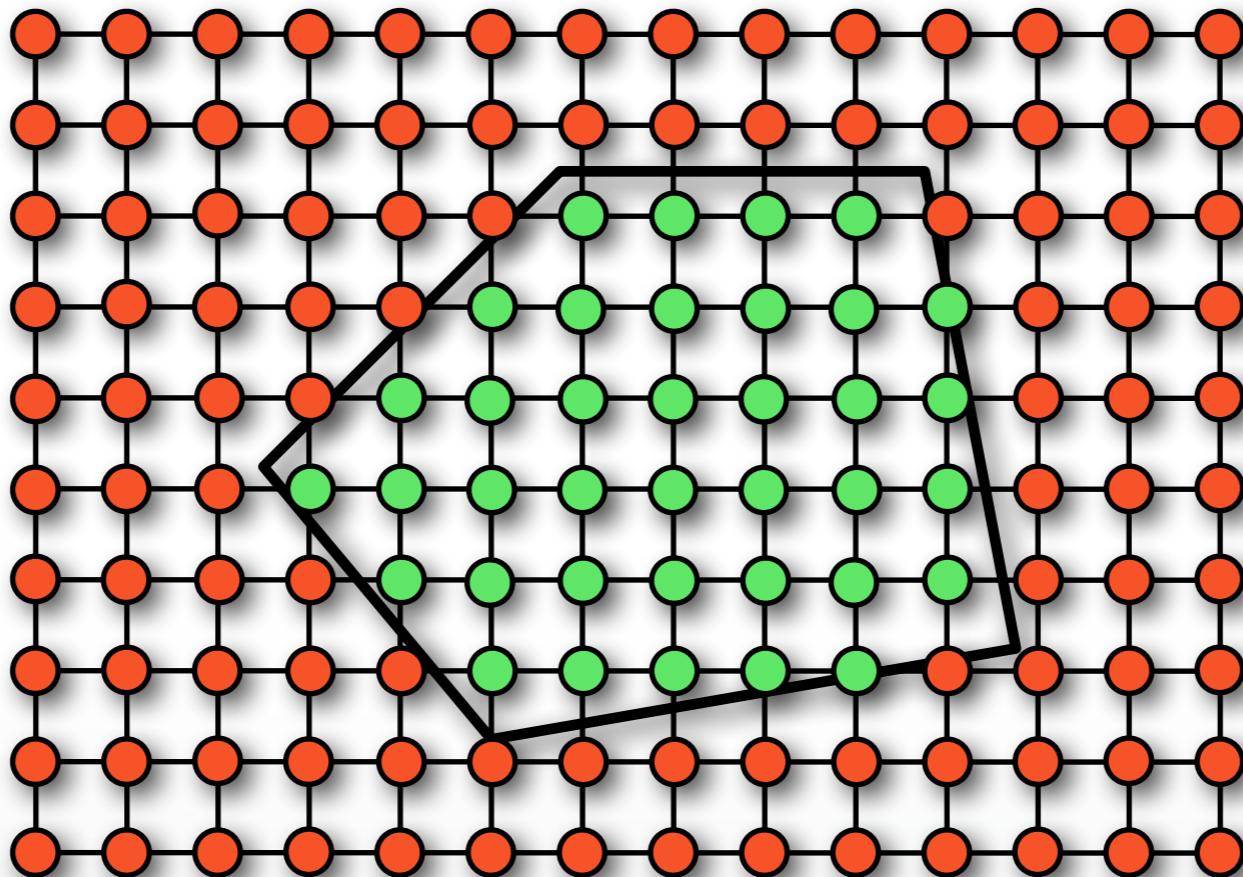
Signed Distance Computation

- Closest point $\mathbf{p} = \alpha\mathbf{p}_i + (1 - \alpha)\mathbf{p}_j$
- Interpolated normal $\mathbf{n} = \alpha\mathbf{n}_i + (1 - \alpha)\mathbf{n}_j$
- Inside if $(\mathbf{q} - \mathbf{p})^\top \mathbf{n} < 0$



Fast Marching Techniques

- Initialize with exact distance in mesh's vicinity
- Fast-march outwards
- Fast-march inwards



Literature

- Schneider, Eberly, “Geometric Tools for Computer Graphics”, Morgan Kaufmann, 2002
- Sethian, “Level Set and Fast Marching Methods”, Cambridge University Press, 1999

Conversion

Explicit to Implicit

- Compute signed distance at grid points
- Compute distance point-mesh
- Fast marching

Implicit to Explicit

- Extract zero-level iso-surface $F(x, y, z) = 0$
- Other iso-surfaces $F(x, y, z) = C$
- Medical imaging, simulations, measurements, ...

2D: Marching Square

1. Classify grid nodes as inside/outside

- Is $F(\mathbf{x}_{i,j}) > 0$ or < 0 ?

2. Classify cell: 2^4 configurations

- In/out for each corner

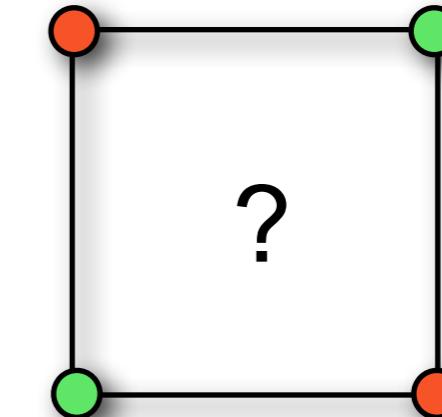
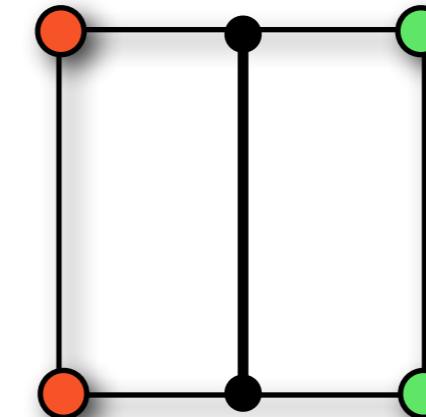
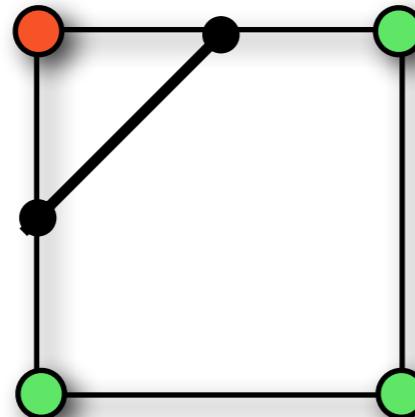
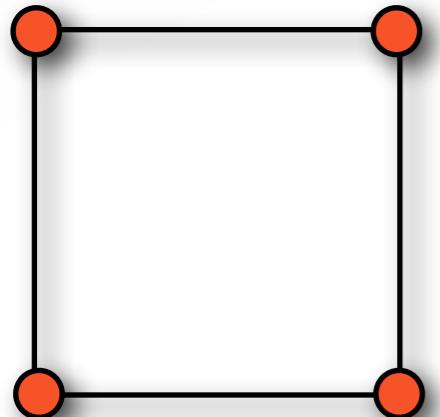
3. Compute intersection points

- Linear interpolation along edges

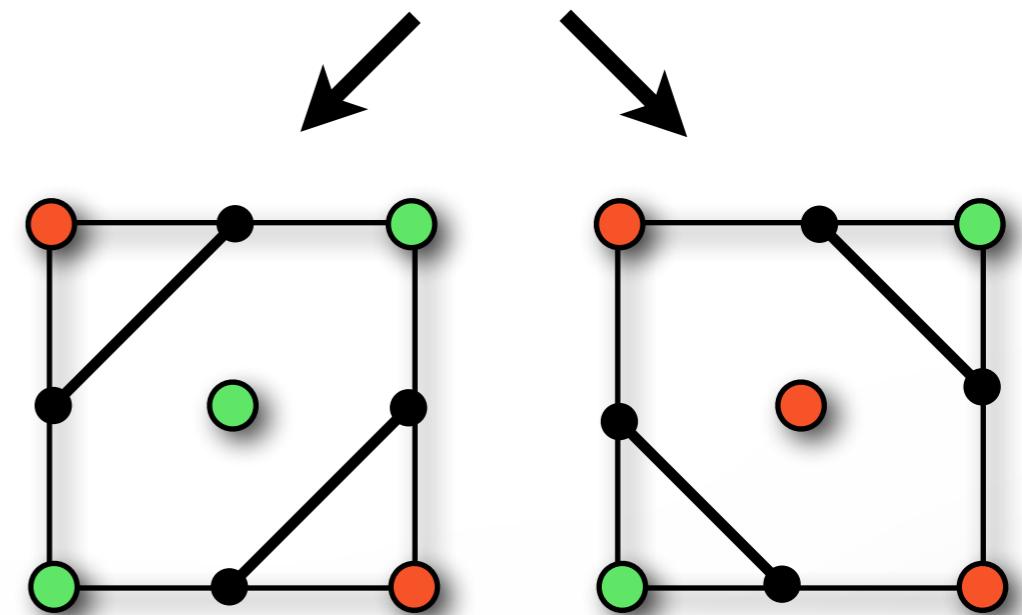
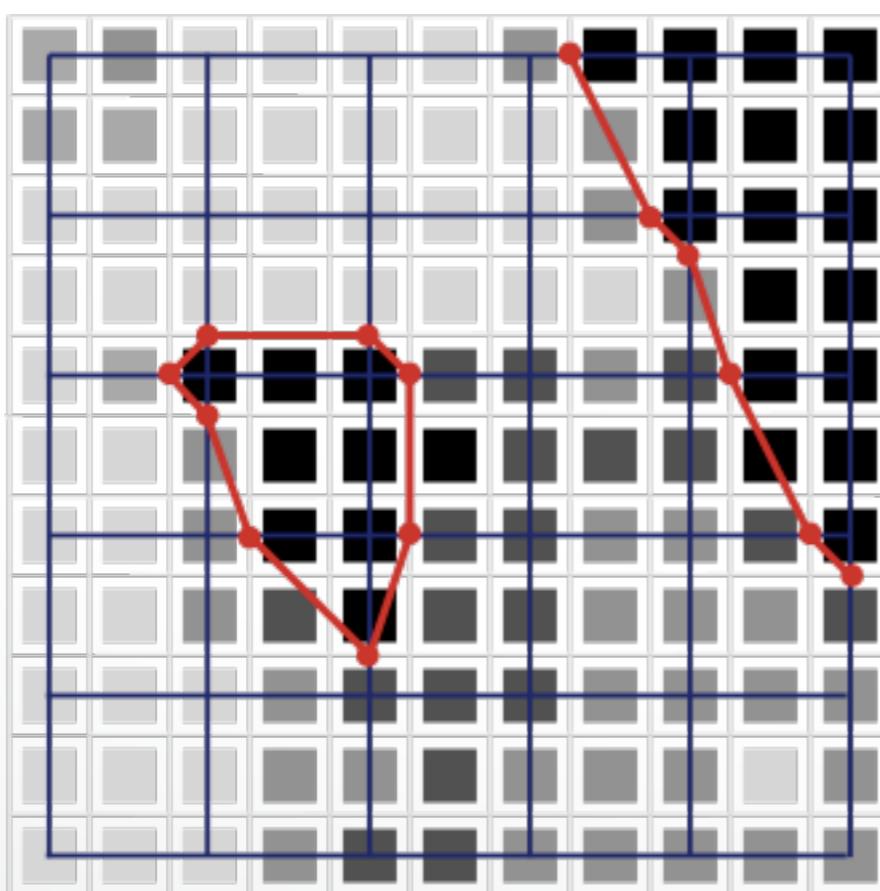
4. Connect them by edges

- Look-up table for edge configuration

2D: Marching Square



?



3D: Marching Cubes

1. Classify grid nodes as inside/outside

- Is $F(\mathbf{x}_{i,j,k}) > 0$ or < 0

2. Classify cell: 2^8 configurations

- In/out for each corner

3. Compute intersection points

- Linear interpolation along edges

4. Connect them by edges

- Look-up table for path configuration
- Disambiguation by modified table [Montani '94]

3D: Marching Cubes

Classify grid nodes $\mathbf{x}_{i,j,k}$ based on $F_{i,j,k} = F(\mathbf{x}_{i,j,k})$

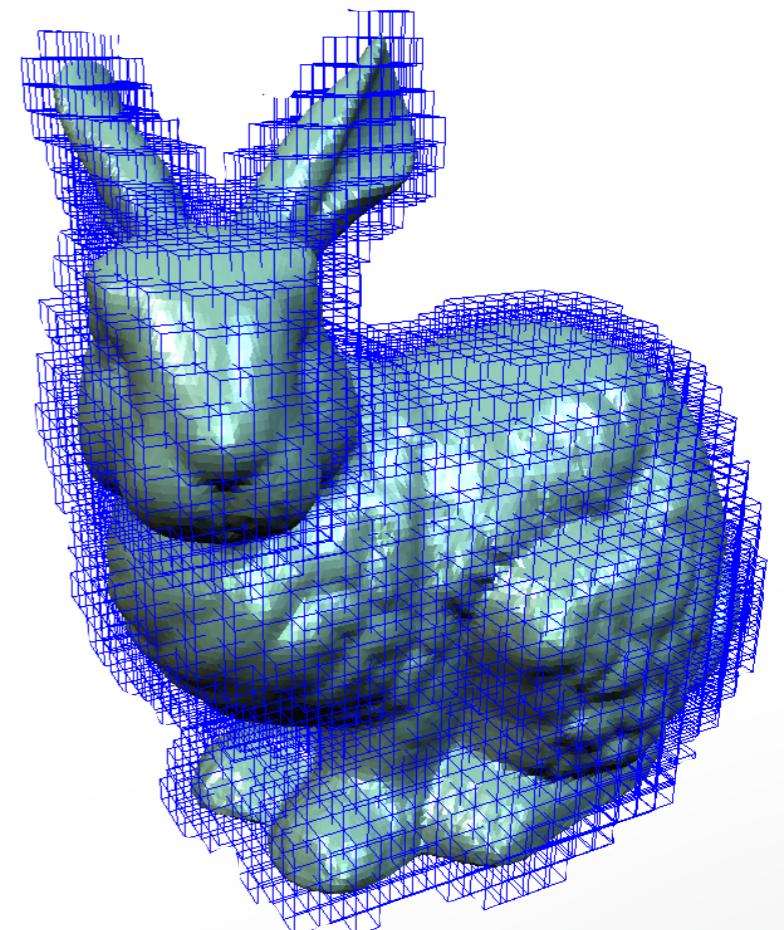
- Inside or outside

Classify all cubes based on $F_{i,j,k}$

- Inside, outside, or intersecting

Refined only intersected cells

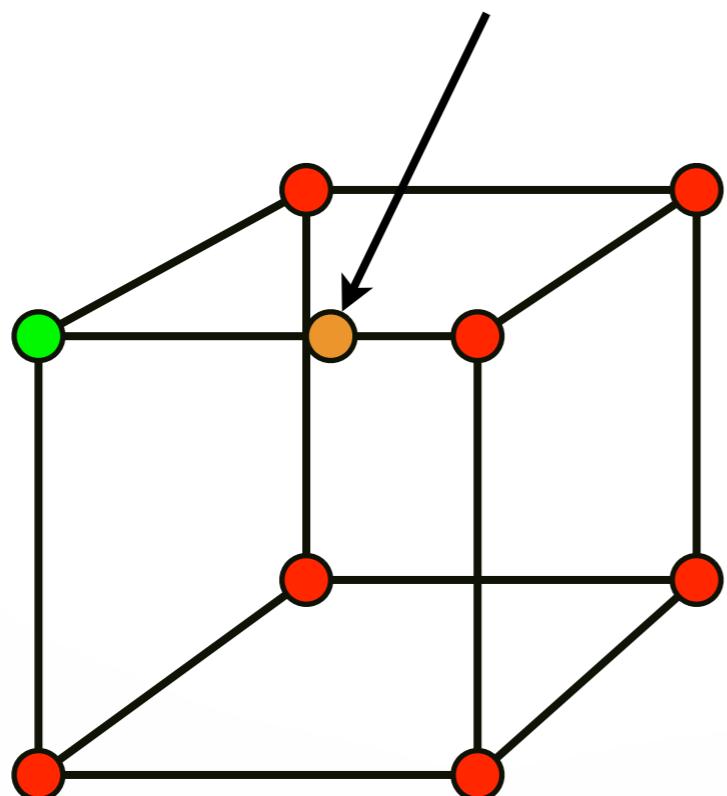
- 3-color adaptive octree
- $O(h^{-2})$ complexity 



Intersection Points

Linear interpolation along edges

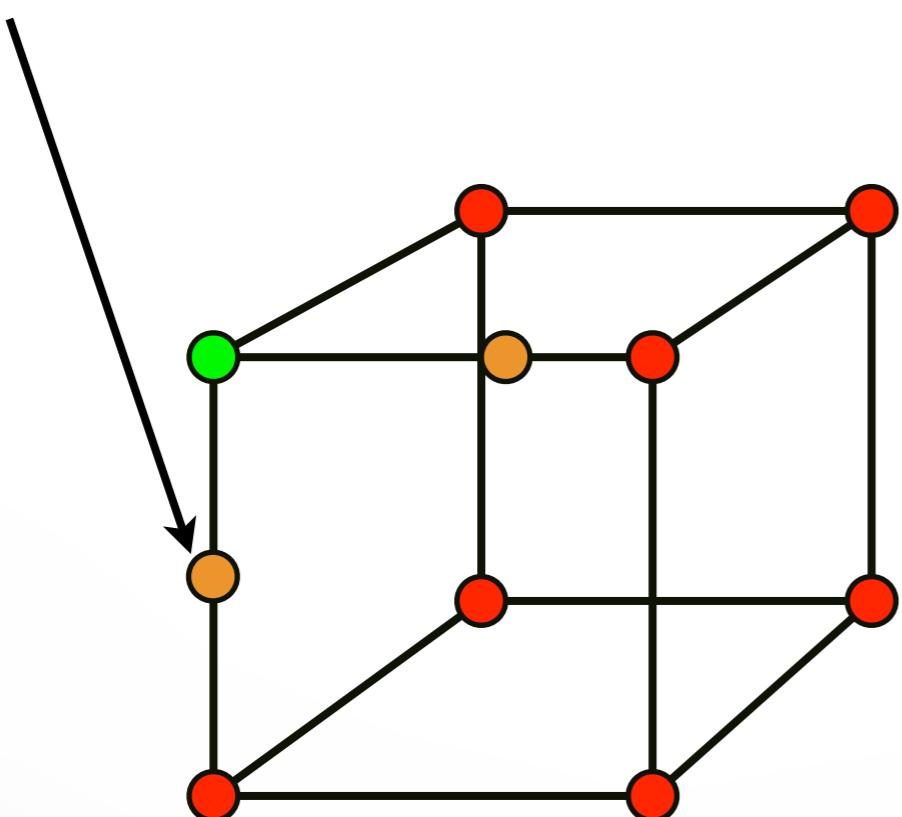
$$\frac{\mathbf{x}_{i,j,k} \cdot |F_{i+1,j,k}| + \mathbf{x}_{i+1,j,k} \cdot |F_{i,j,k}|}{|F_{i,j,k}| + |F_{i+1,j,k}|}$$



Intersection Points

Linear interpolation along edges

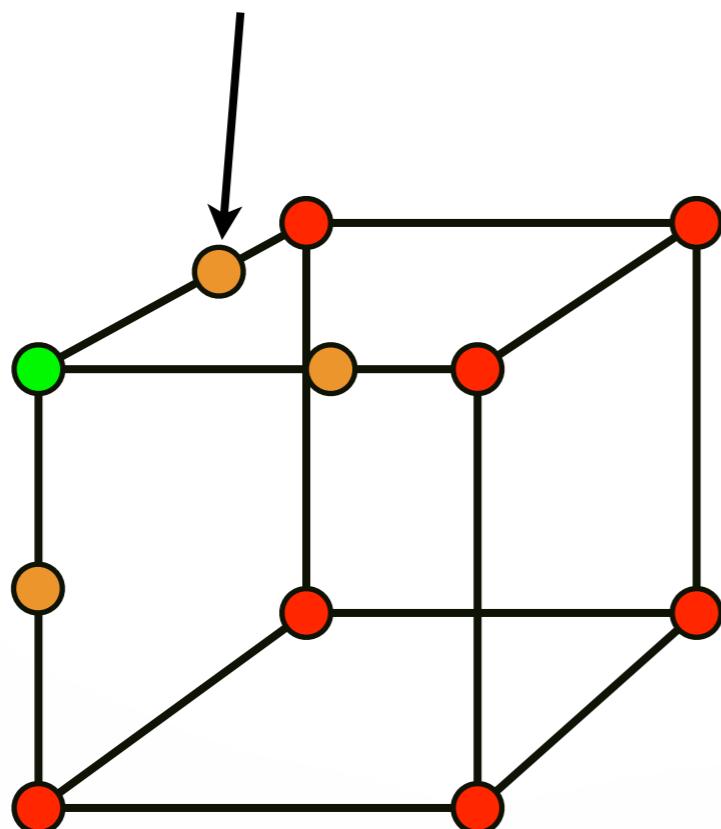
$$\frac{\mathbf{x}_{i,j,k} \cdot |F_{i,j+1,k}| + \mathbf{x}_{i,j+1,k} \cdot |F_{i,j,k}|}{|F_{i,j,k}| + |F_{i,j+1,k}|}$$



Intersection Points

Linear interpolation along edges

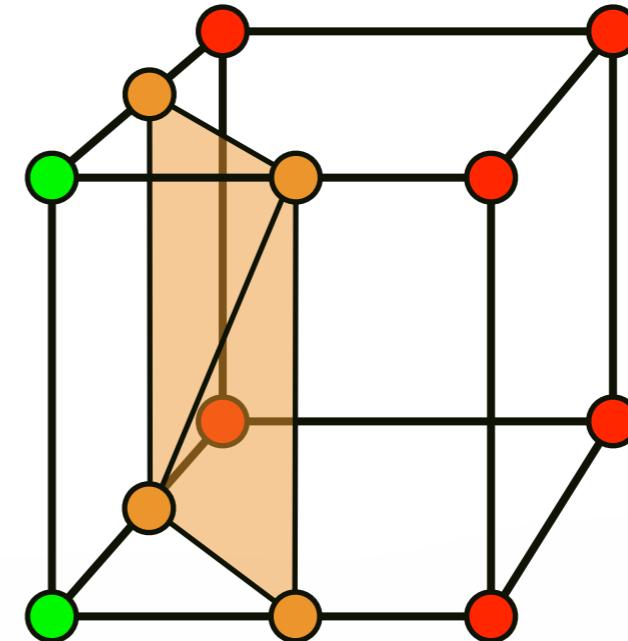
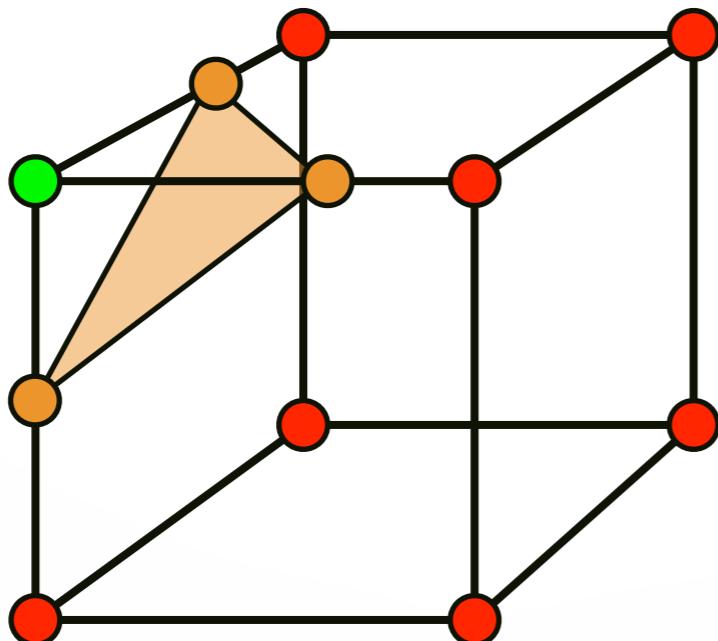
$$\frac{\mathbf{x}_{i,j,k} \cdot |F_{i,j,k+1}| + \mathbf{x}_{i,j,k+1} \cdot |F_{i,j,k}|}{|F_{i,j,k}| + |F_{i,j,k+1}|}$$



Intersection Points

Linear interpolation along edges

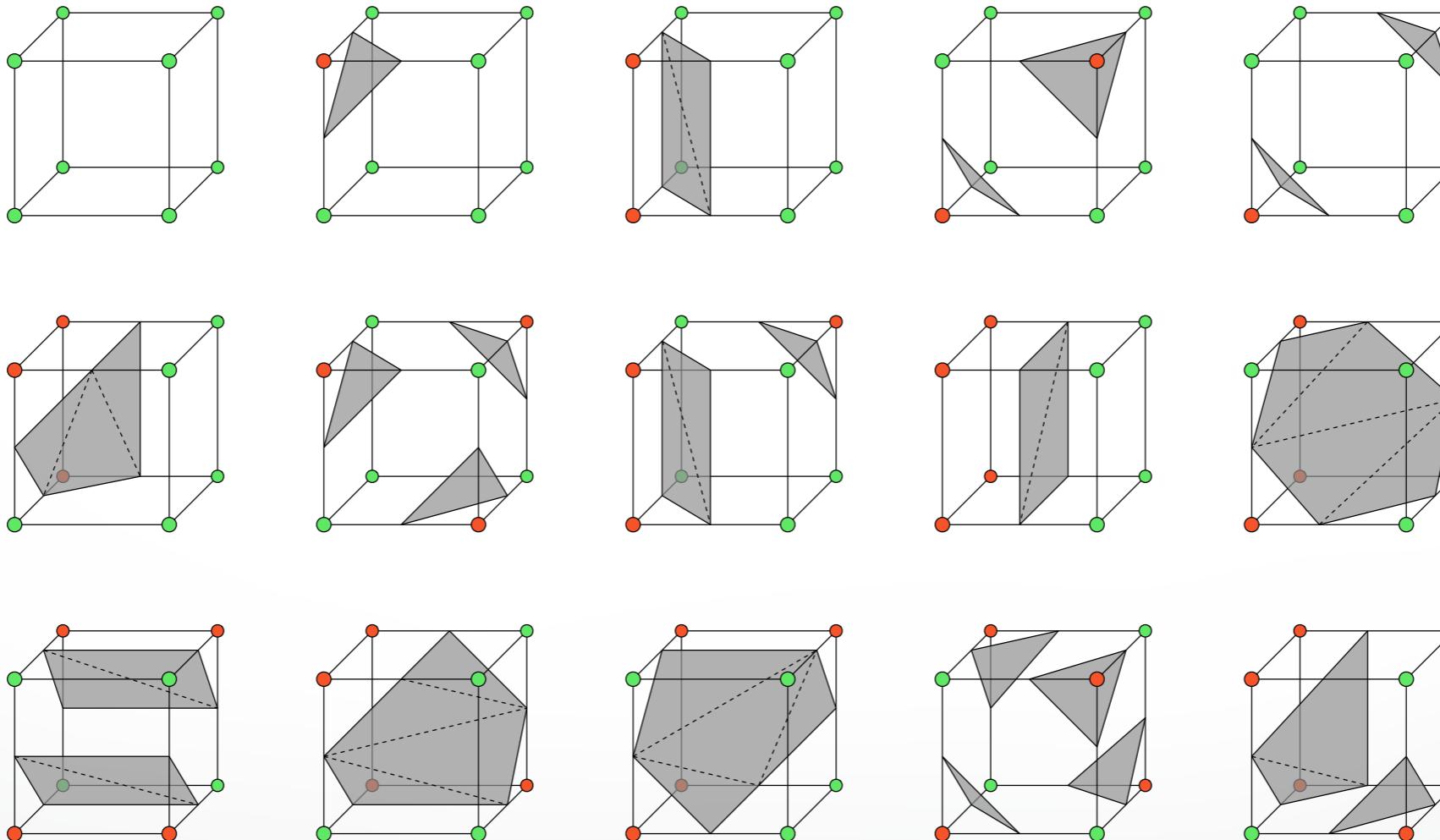
Lookup table for patch configuration



Marching Cubes

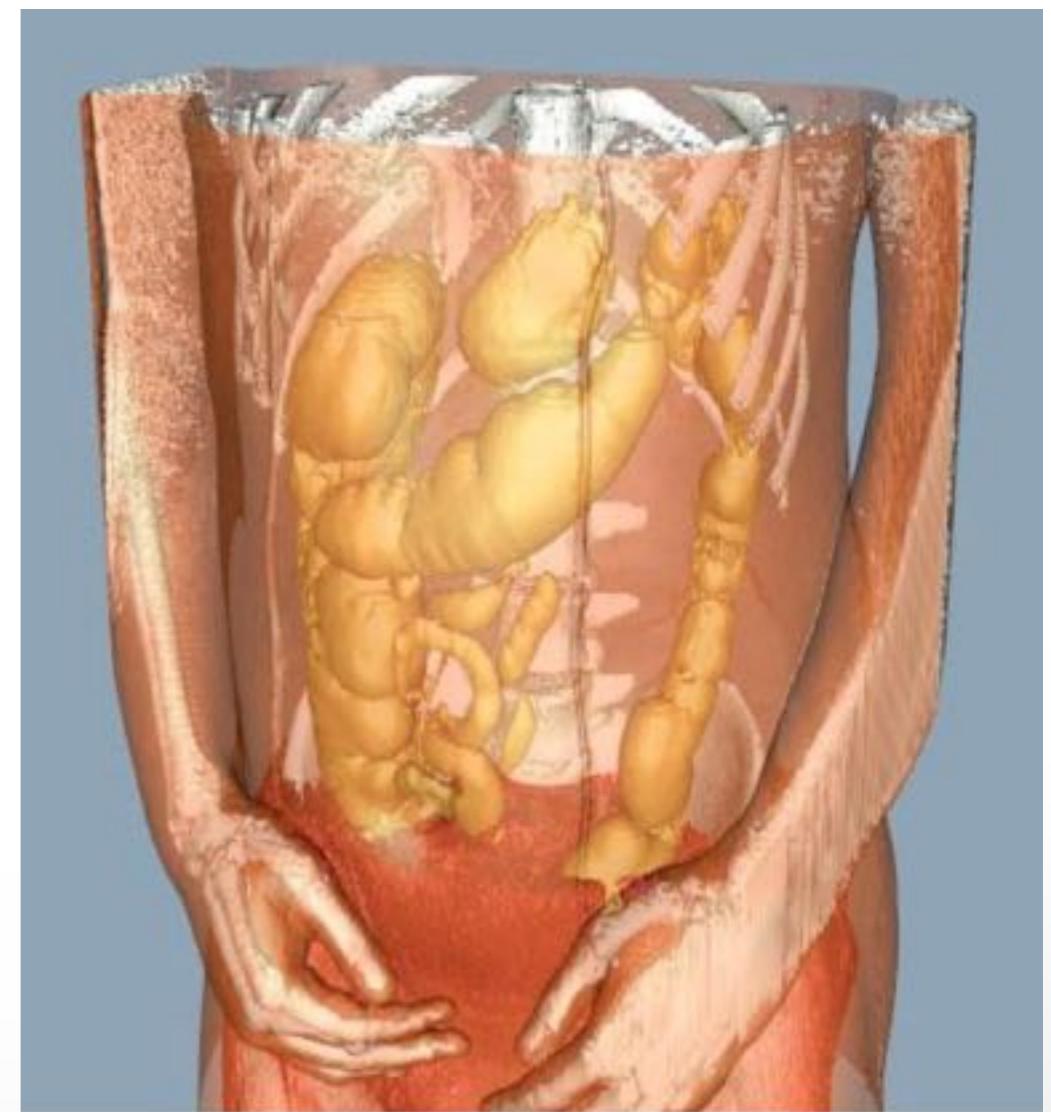
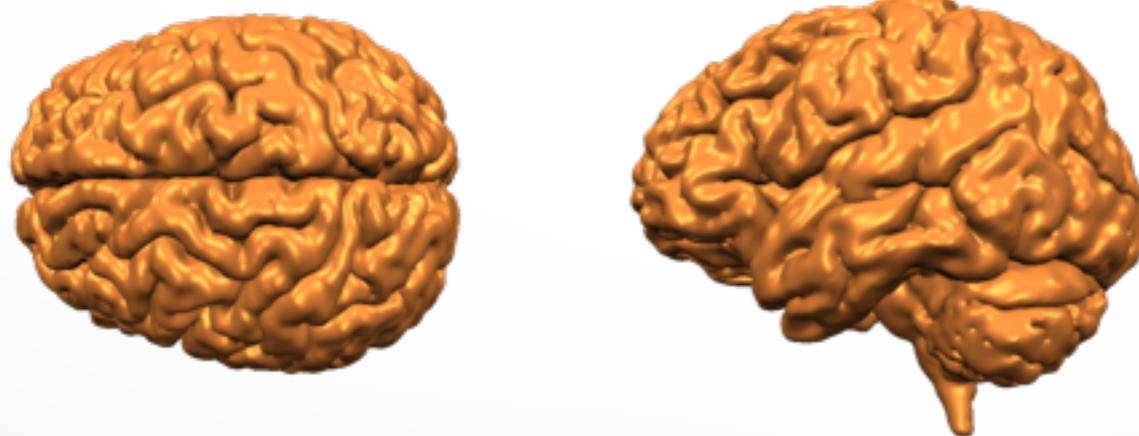
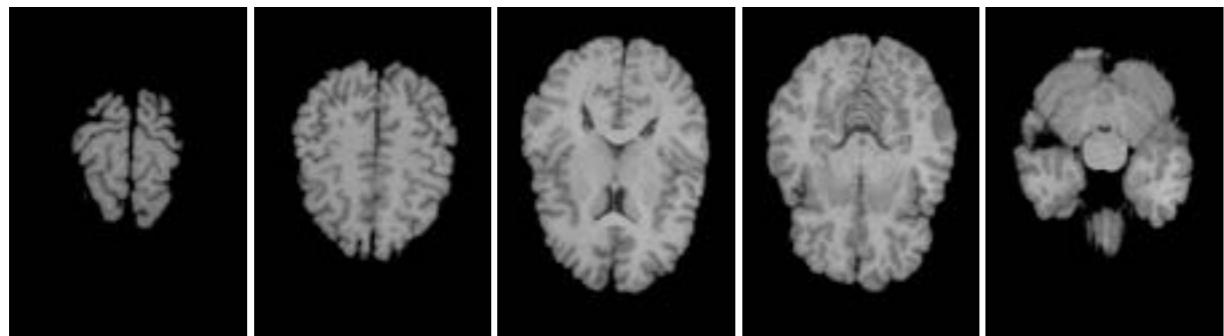
Look-up table with 2^8 entries

- 15 representative cases shown
- Others follow by symmetry



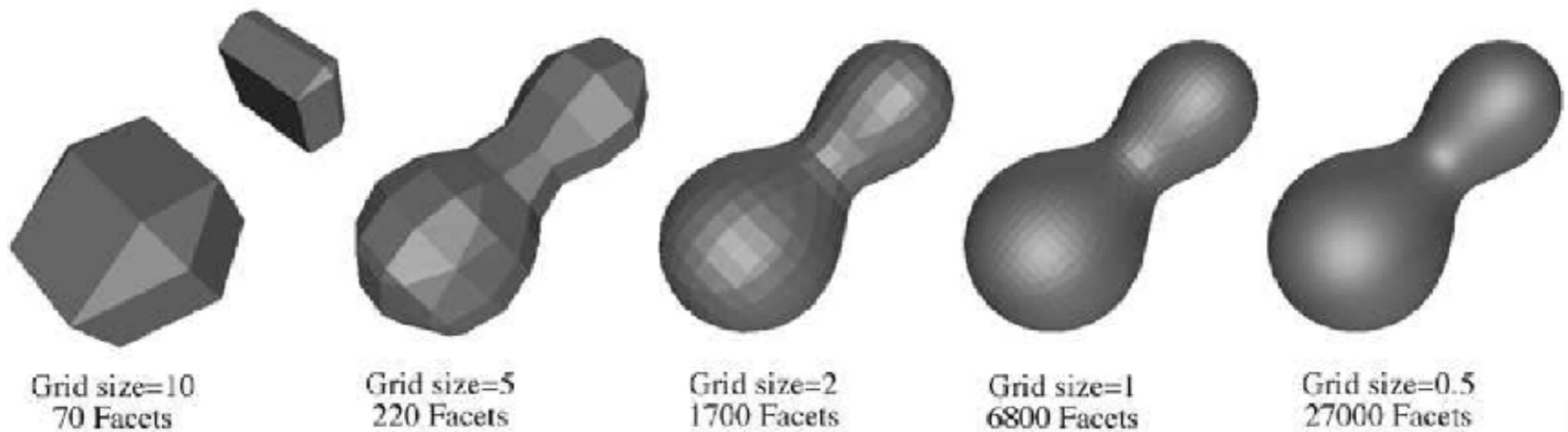
Marching Cubes

Algorithm for isosurface extraction from medical scans (CT, MRI)



Marching Cubes

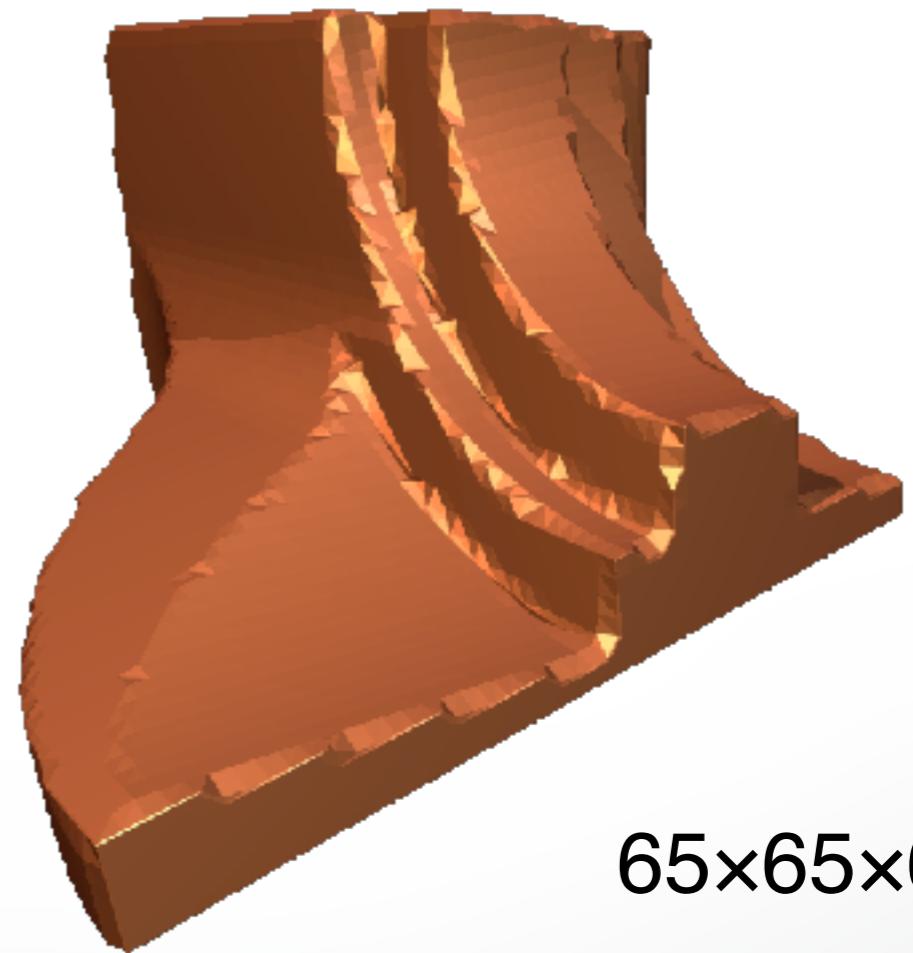
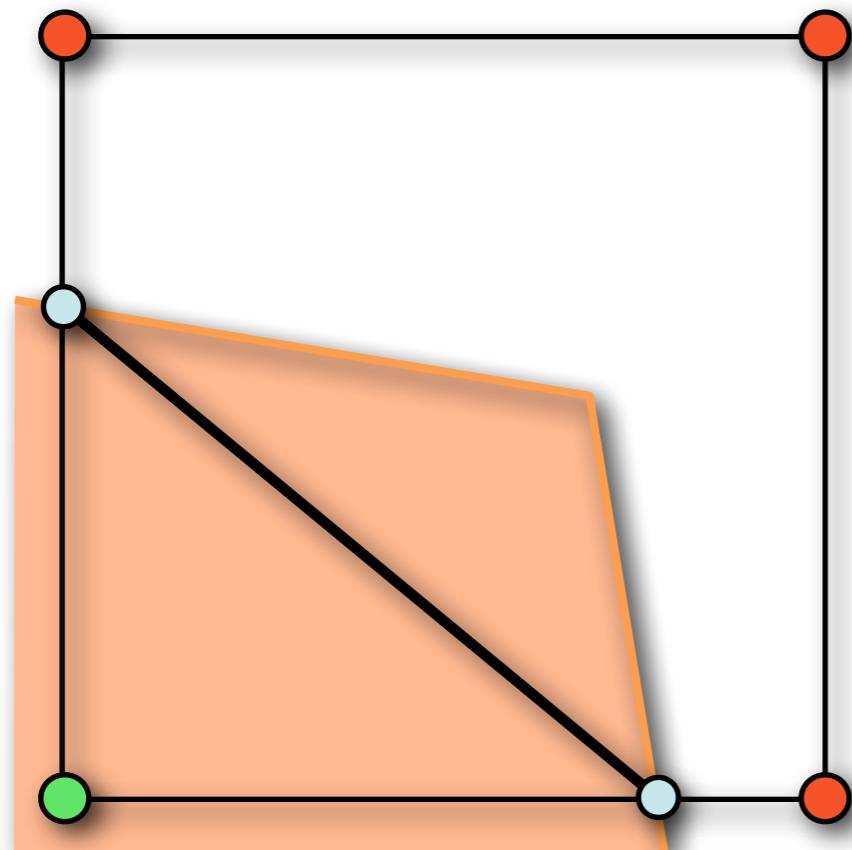
Effect of grid size



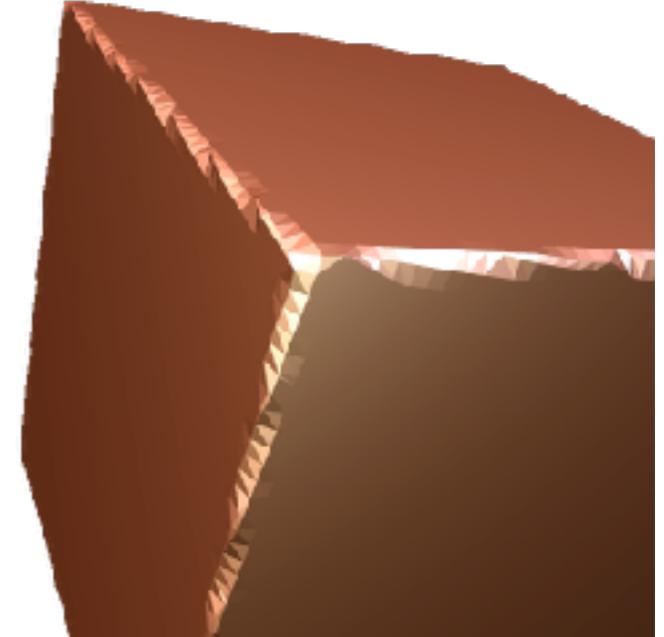
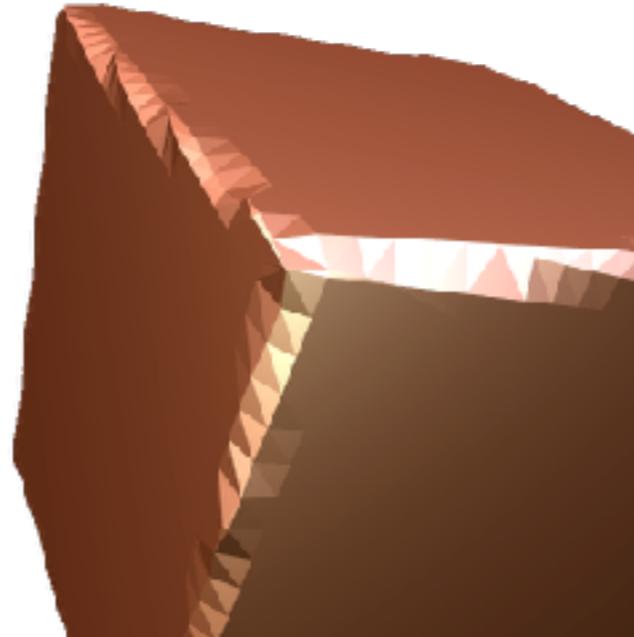
Marching Cubes

Sample points restricted to edges of regular grid

Alias artifacts at sharp features



Increasing Resolution

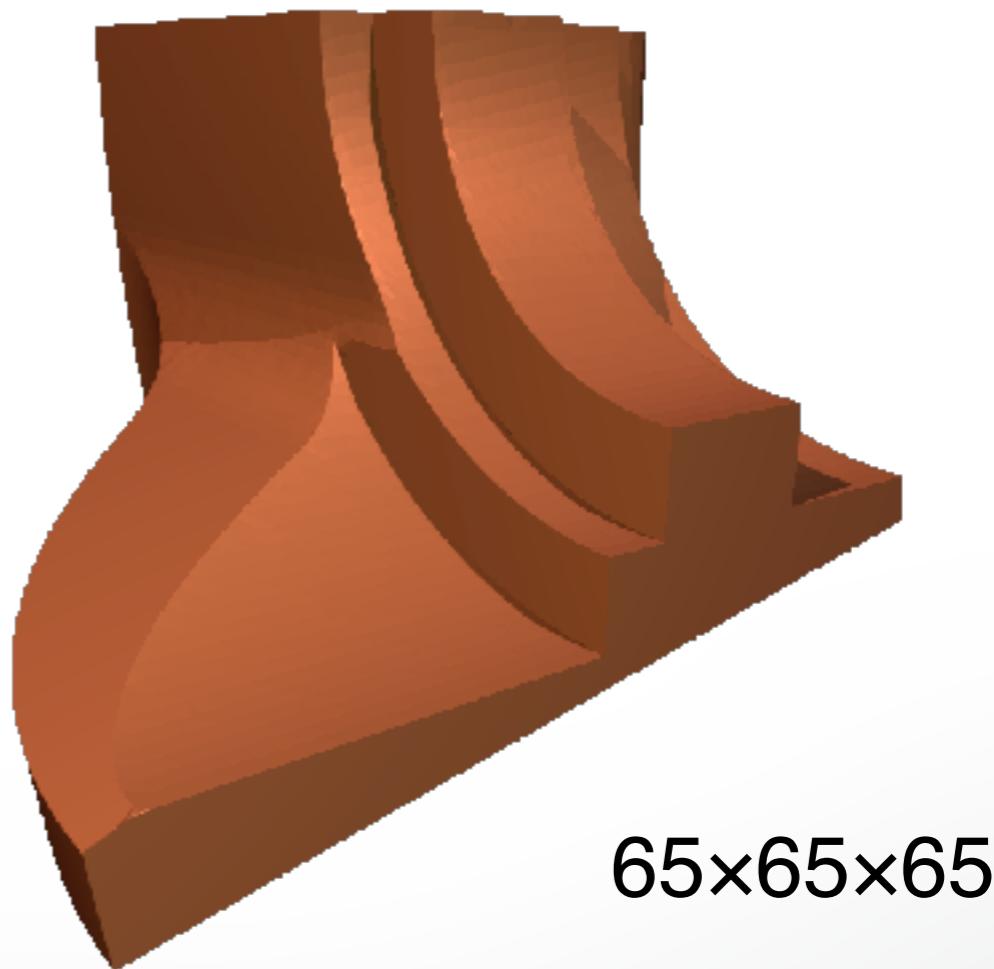
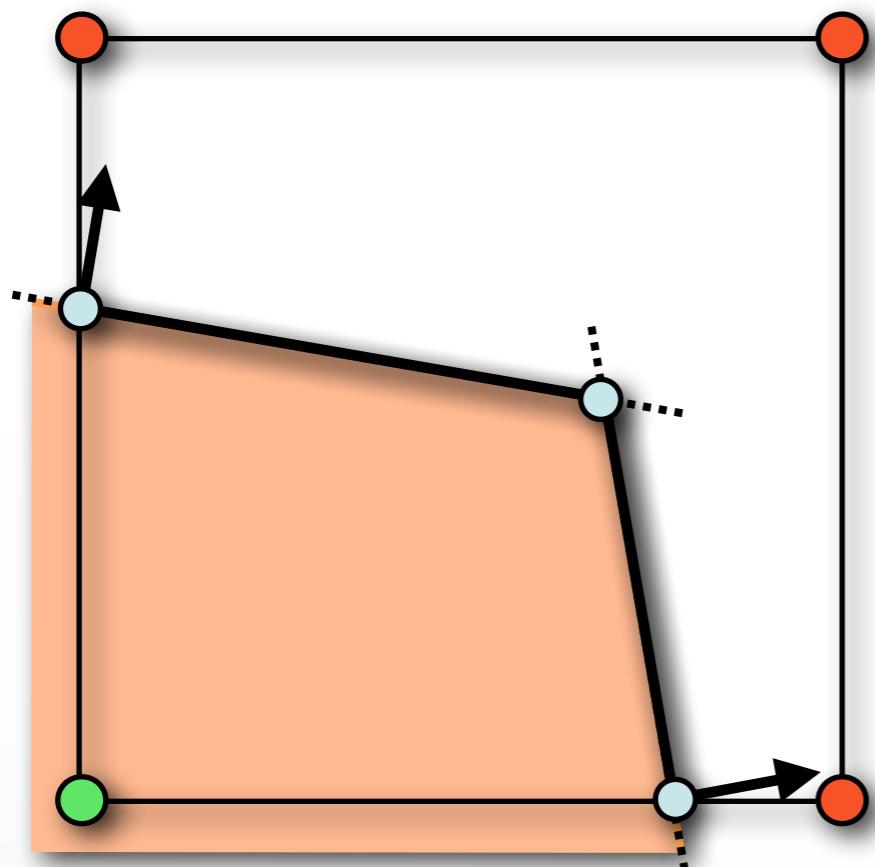


Does not remove alias problems!

Extended Marching Cubes

Locally extrapolate distance gradient

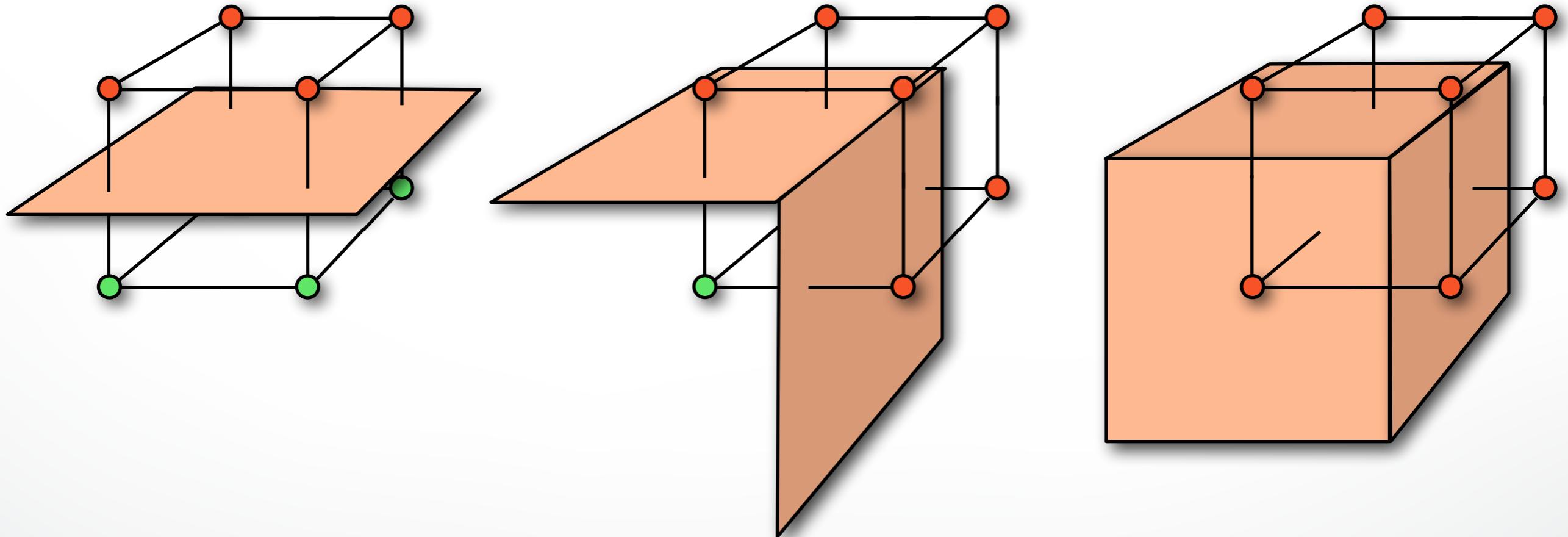
Place samples on estimated features



Extended Marching Cubes

Feature detection

- Based on angle between normals \mathbf{n}_i
- Classify into edges / corners



Extended Marching Cubes

Feature sampling

- Intersect tangent planes $(\mathbf{s}_i, \mathbf{n}_i)$

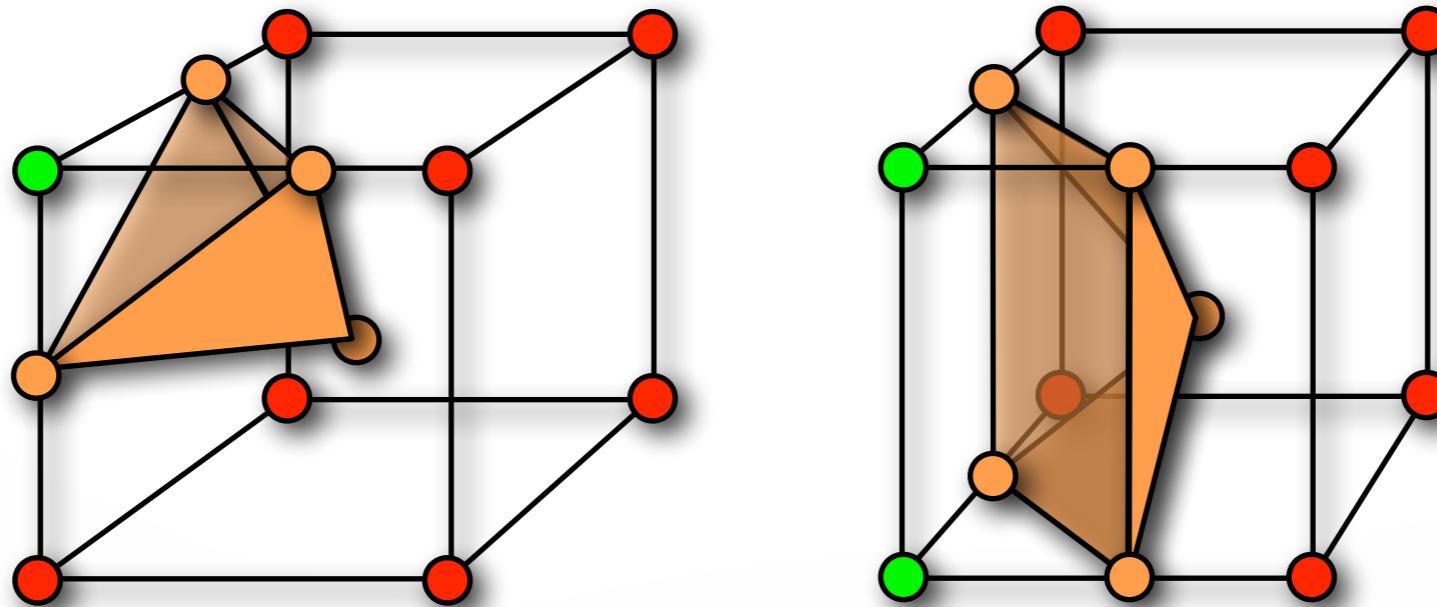
$$\begin{pmatrix} \vdots \\ \mathbf{n}_i \\ \vdots \end{pmatrix} \cdot \begin{pmatrix} x \\ y \\ z \end{pmatrix} = \begin{pmatrix} \vdots \\ \mathbf{n}_i^T \mathbf{s}_i \\ \vdots \end{pmatrix}$$

- Over- or under-determined system
- Solve by SVD pseudo-inverse

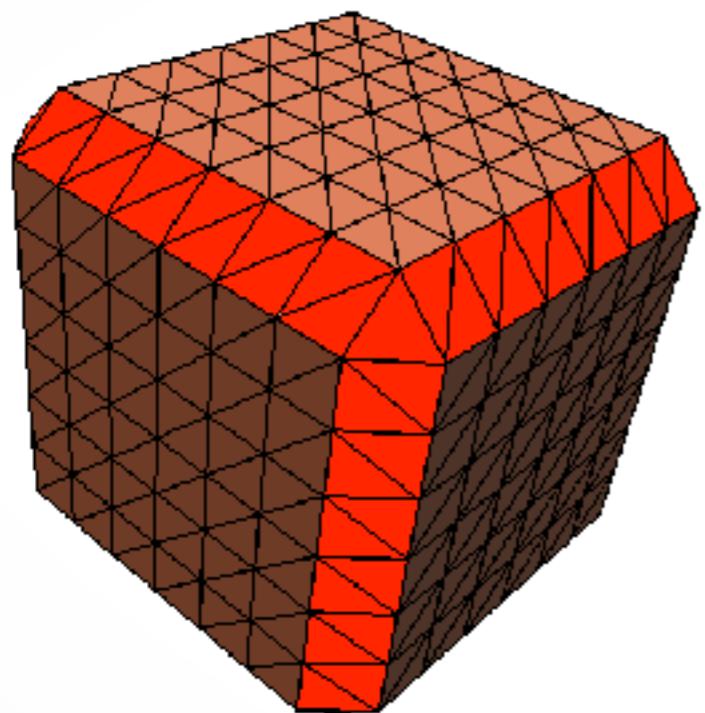
Extended Marching Cubes

Feature sampling

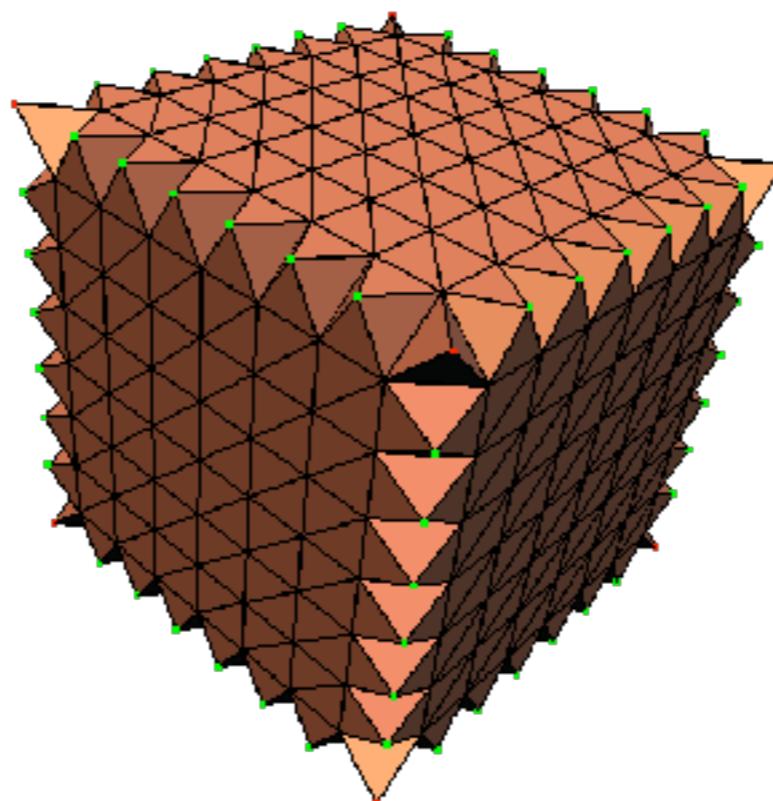
- Intersect tangent planes $(\mathbf{s}_i, \mathbf{n}_i)$
- Triangle fans centered at feature point



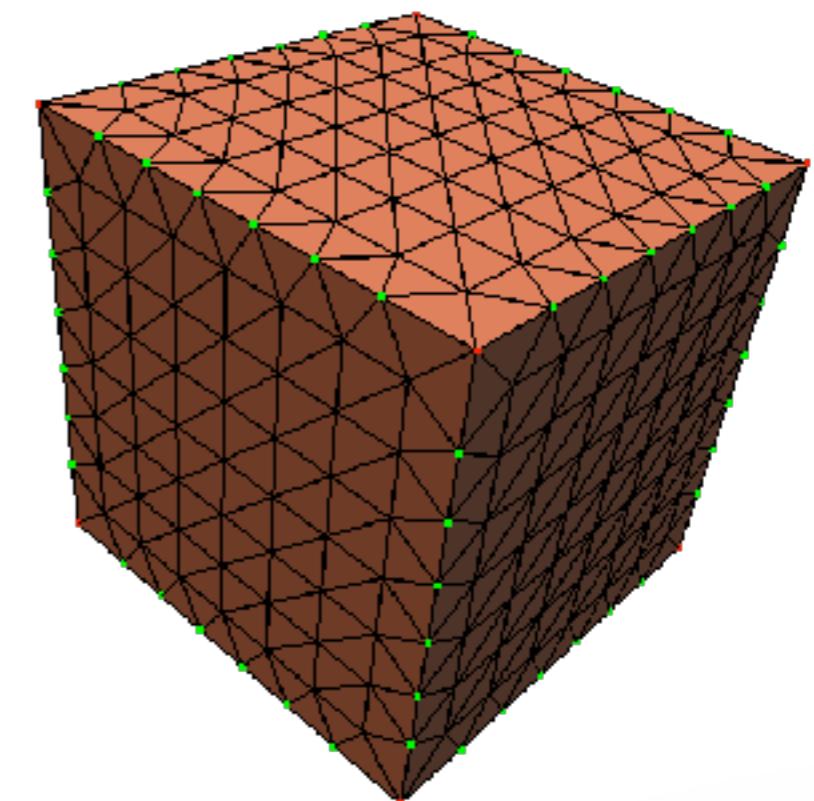
Extended Marching Cubes



**Feature
Detection**

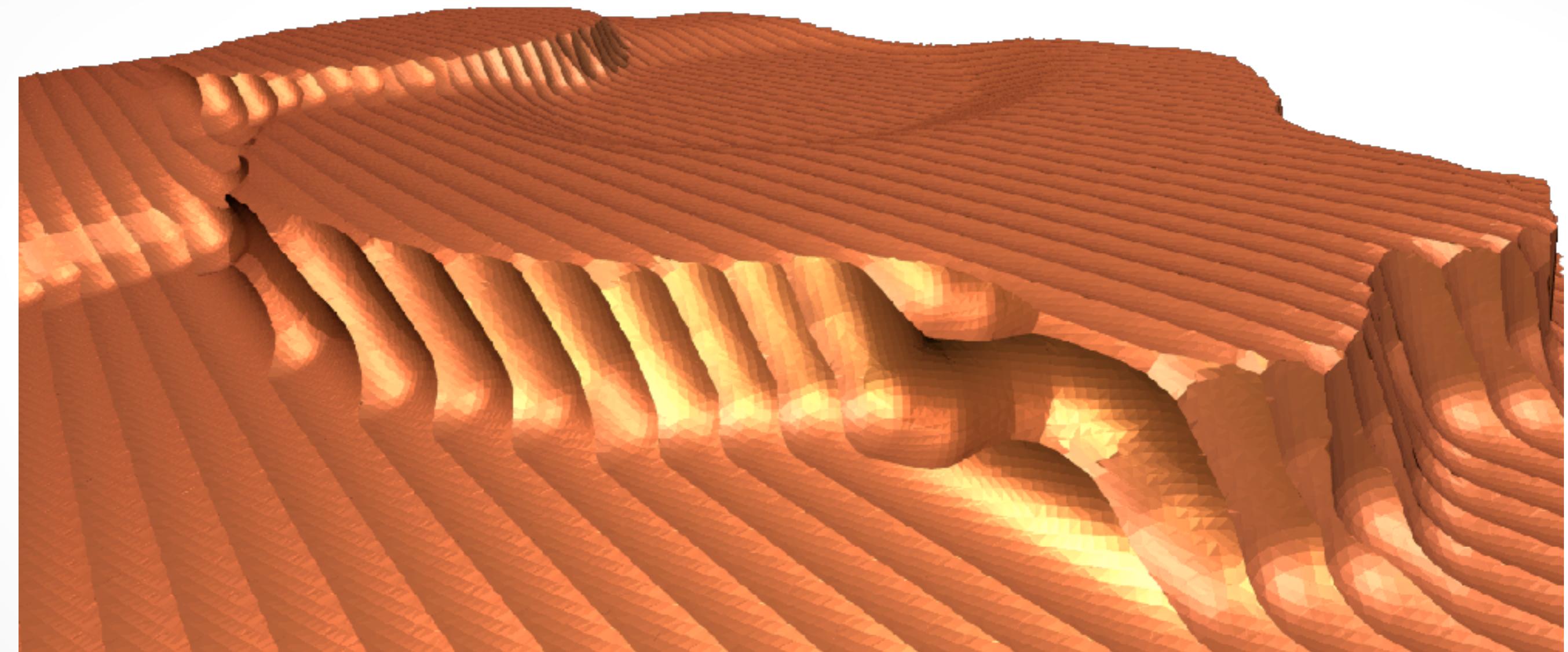


**Feature
Sampling**



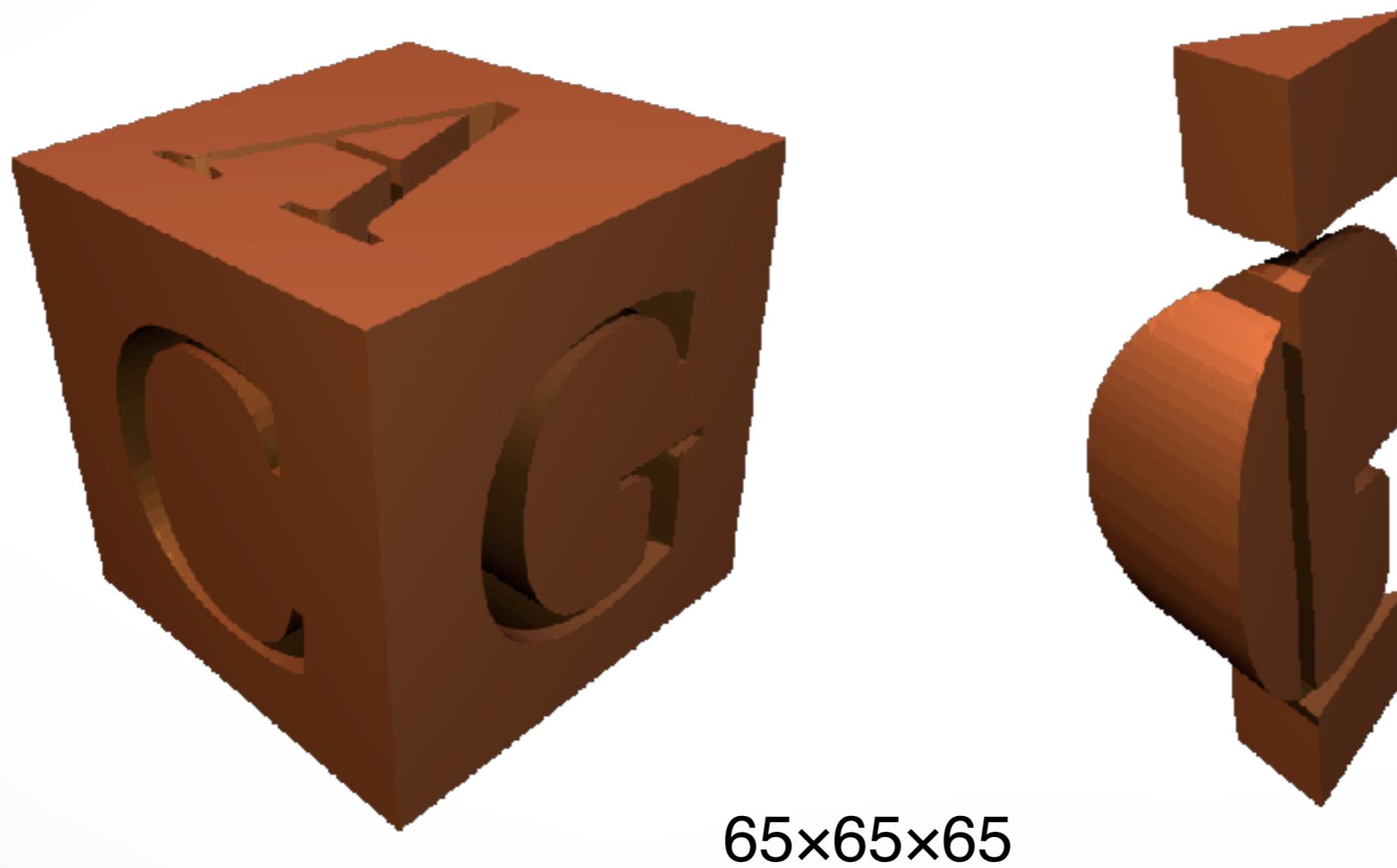
**Edge
Flipping**

Milling Simulation



257×257×257

CSG Modeling



Marching Cubes

+ Result is watertight, closed 2-manifold surface!

+ Easy to parallelize

- Uniform (over-) sampling (\rightarrow mesh decimation)

- Degenerate triangles (\rightarrow remeshing)

- MC does not preserve features

+ EMC preserves features, but...

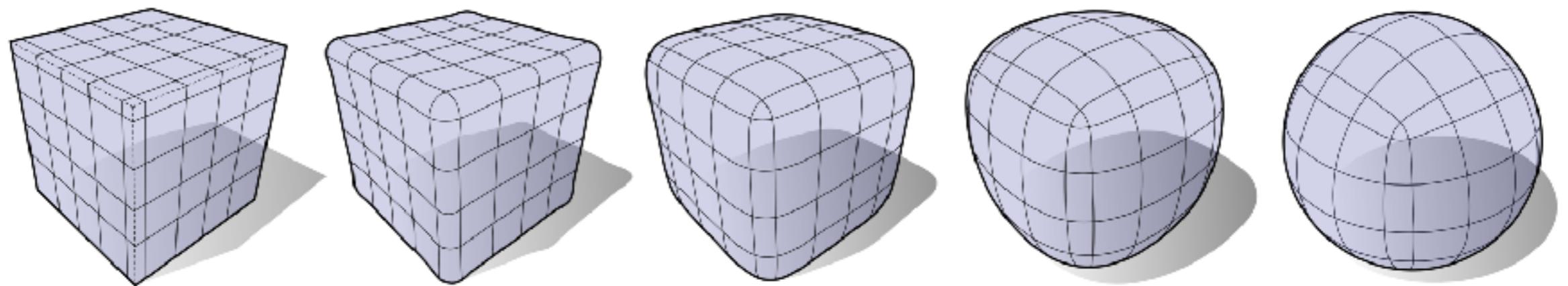
about 10% more triangles

20-40% computational overhead

Literature

- Lorensen & Cline, “Marching Cubes: A High Resolution 3D Surface Construction Algorithm”, SIGGRAPH 1987
- Montani et al., “A modified look-up table for implicit disambiguation of Marching Cubes”, Visual Computer 1994
- Kobbelt et al., “Feature Sensitive Surface Extraction from Volume Data”, SIGGRAPH 2001

Next Time



Discrete Differential Geometry

<http://cs621.hao-li.com>

Thanks!

