



# Solid Modeling

Michael Kazhdan

(601.457/657)

*A Generalization of Algebraic Surface Drawing*, Blinn 1982

*Marching Cubes*, Lorensen and Cline 1987



# Solid Modeling

So far, we have focused on representing models with (triangular) meshes that approximate the surface/boundary of the model.

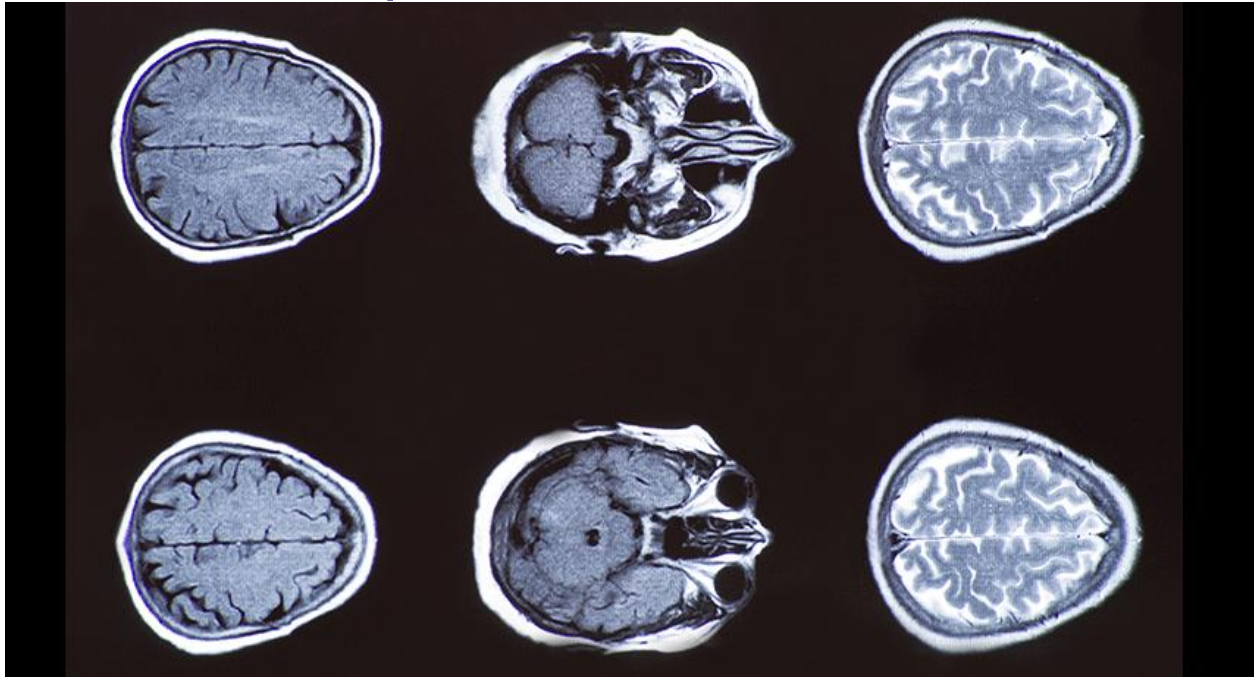
## Advantages:

- Well-suited for animation
- Easy to visualize in graphics hardware

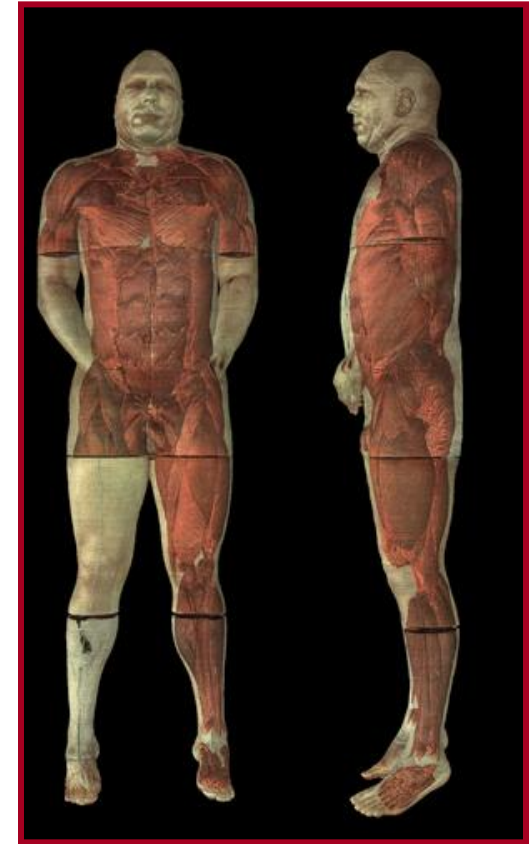


# Motivation 1

- Some acquisition methods generate solids
  - Example: Medical visualizations



<https://www.sciencenewsforstudents.org/>

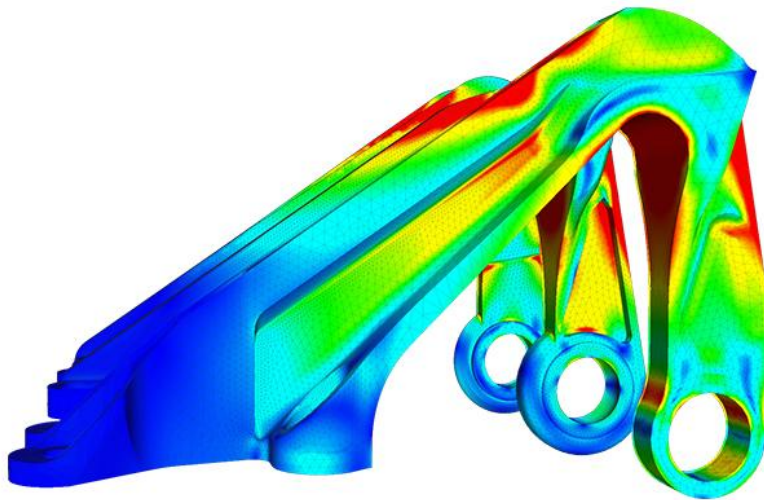


**Visible Human**  
(National Library of Medicine)



# Motivation 2

- Some representations require solids
  - Example: FEM simulations



<https://www.simscale.com/>

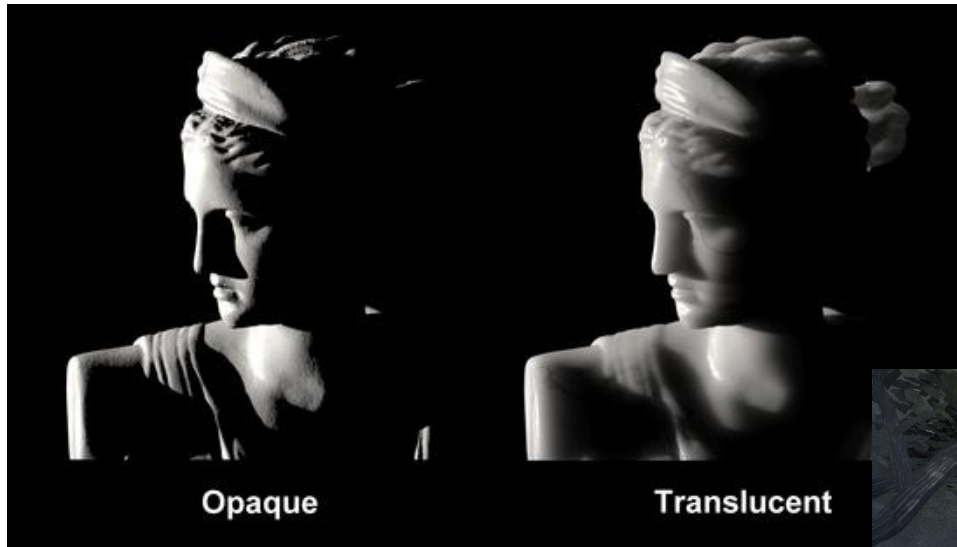


[Irving *et al.*, 2007]



# Motivation 3

- Some algorithms require solids
  - Example: ray tracing in participating media



<http://graphics.stanford.edu/>



<http://casual-effects.com/>



# Overview

- Implicit Surfaces
- Voxels
- Quadtrees and Octrees



# Implicit Surfaces

Given a real-valued function in 3D,  $F(x, y, z)$ , the implicit surface defined by  $F$  is the collection of points for which  $F(x, y, z) = 0$ .

- Example: quadric

- $F(x, y, z) = ax^2 + by^2 + cz^2 + 2dxy + 2eyz + 2fxz + 2gx + 2hy + 2jz + k$





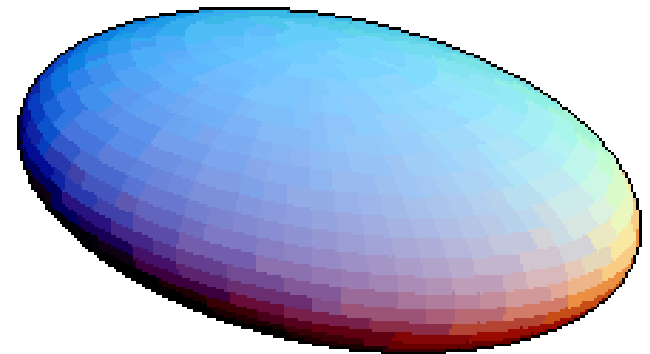
# Implicit Surfaces

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- Example: quadric

- $F(x, y, z) = ax^2 + by^2 + cz^2 + 2dxy + 2eyz + 2fzx + 2gx + 2hy + 2jz + k$

$$\left(\frac{x}{r_x}\right)^2 + \left(\frac{y}{r_y}\right)^2 + \left(\frac{z}{r_z}\right)^2 - 1 = 0$$



Ellipsoids

Image courtesy of <http://www.geom.uiuc.edu/>





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$$\left(\frac{x}{r_x}\right)^2 + \left(\frac{y}{r_y}\right)^2 - \left(\frac{z}{r_z}\right)^2 \pm 1 = 0$$

Hyperboloids

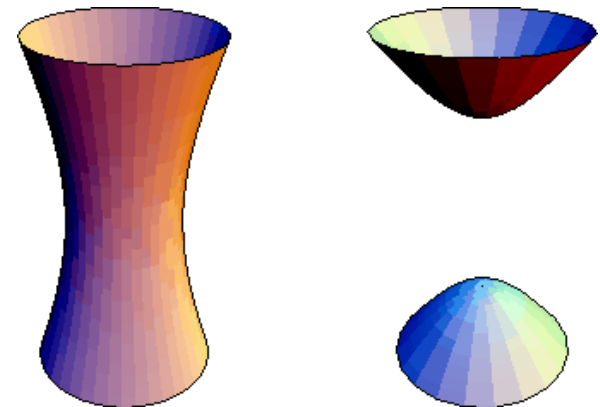


Image courtesy of <http://www.geom.uiuc.edu/>



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Given a real-valued function in 3D,  $F(x, y, z)$ , the implicit surface defined by  $F$  is the collection of points for which  $F(x, y, z) = 0$ .

- Example: quadric

- $F(x, y, z) = ax^2 + by^2 + cz^2 + 2dxy + 2eyz + 2fzx + 2gx + 2hy + 2jz + k$

$$\left(\frac{x}{r_x}\right)^2 \pm \left(\frac{y}{r_y}\right)^2 + 2z = 0$$

Paraboloids

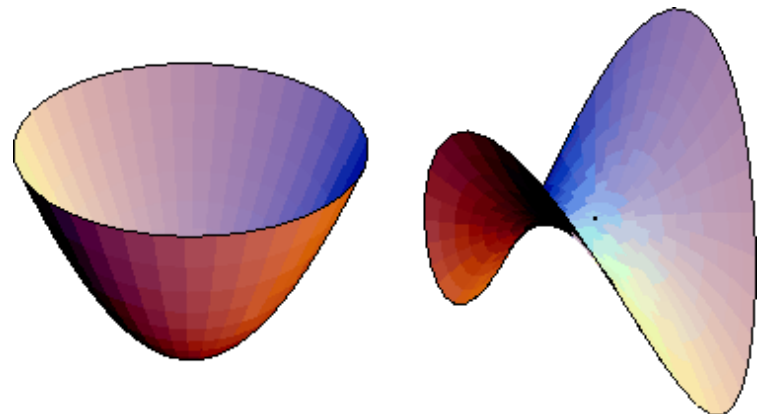


Image courtesy of <http://www.geom.uiuc.edu/>



# Implicit Surfaces

## Bloppy Models [Blinn '82]

Express the implicit surface as a sum of (signed) Gaussians:

$$F(x, y, z) = \sum_i F_i(x, y, z)$$

$$F_i(x, y, z) = \alpha_i e^{-((x-x_i)^2 + (y-y_i)^2 + (z-z_i)^2) / 2\sigma_i^2}$$

- $(x_i, y_i, z_i)$ 
  - Center of the Gaussian
- $\alpha_i$  controls the contribution of the Gaussian
  - How much the Gaussian contributes
  - Interior vs. exterior (sign)
- $\sigma_i$  controls the width of the Gaussian
  - Extent of the contribution

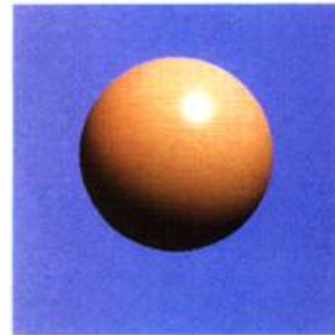


# Implicit Surfaces

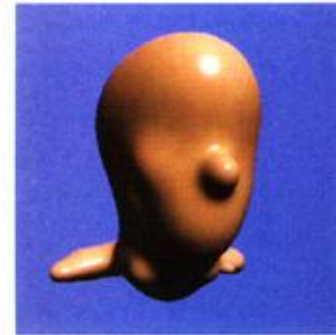
## Bloppy Models [Blinn '82]

The more functions we use, the more accurate the reconstruction.

But this also makes the function more difficult to sample.



(a)  $N = 1$



(c)  $N = 20$



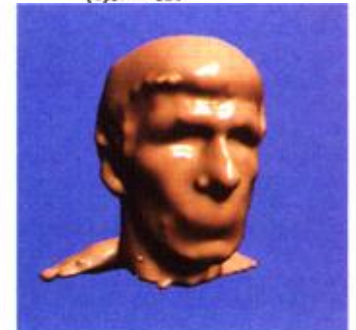
(e)  $N = 120$



(b)  $N = 2$



(d)  $N = 60$



(f)  $N = 451$



# Implicit Surfaces

$$F(x, y, z) = \sum_i F_i(x, y, z)$$

If the functions  $F_i$  are compactly supported, evaluation at a point can be done in sub-linear time.





# Implicit Surfaces

- Advantages:
  - Easy to test if a point is on the boundary of the solid
  - Easy to test if a point is inside the solid
  - Easy to intersect two solids (e.g. collision detection)
- Disadvantages:
  - Hard to describe complex shapes (concisely)
  - Hard to evaluate complex functions (efficiently)
  - Hard to enumerate points on surface

# Overview



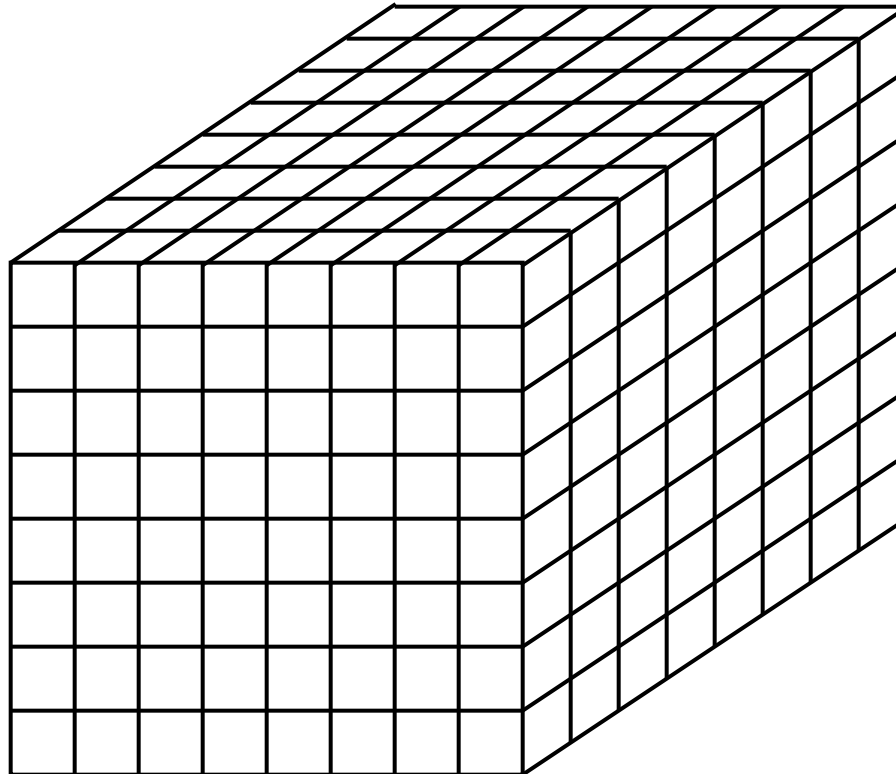
- Implicit Surfaces
- Voxels
- Quadtrees and Octrees





# Voxels

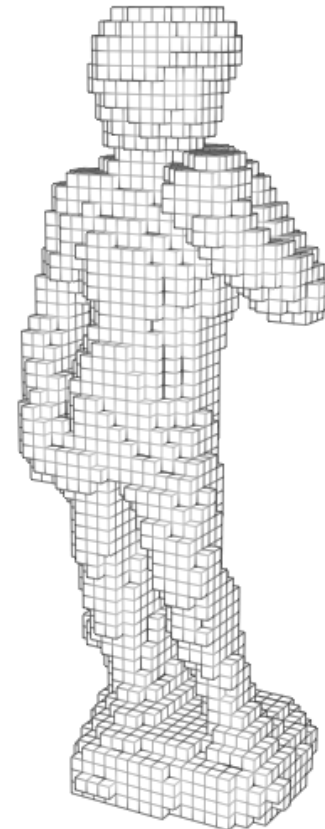
- Partition space into uniform grid
  - Grid cells are called *voxels* (volumetric elements)
- Each voxel has a value associated to it.





# Voxels

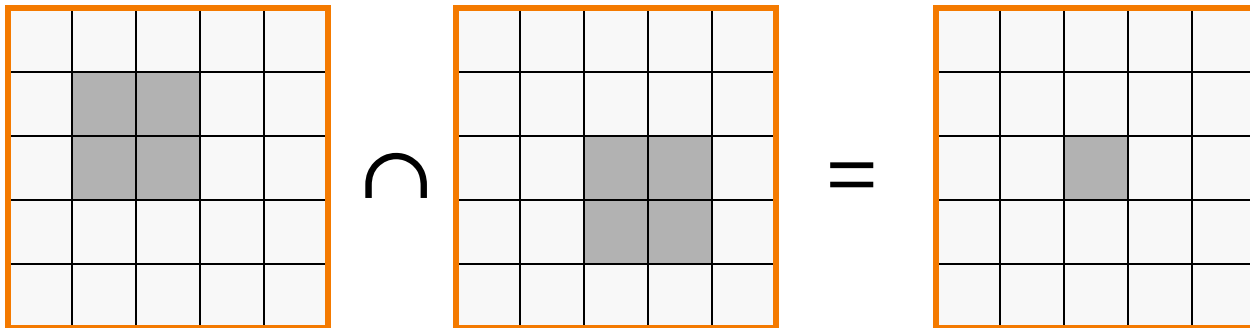
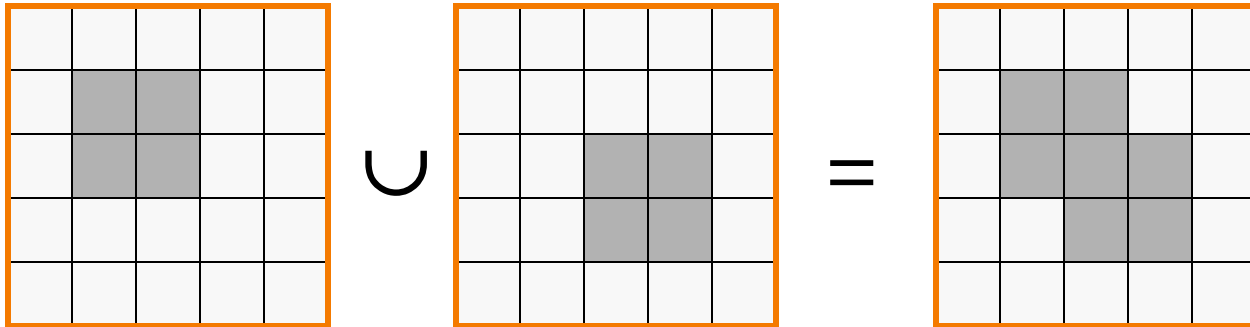
- Partition space into uniform grid
  - Grid cells are called *voxels* (volumetric elements)
- Each voxel has a value associated to it.
  - Binary Voxel Grids:
    - » Value is 0 if the voxel is outside the model
    - » Value is 1 if the voxel is inside





# Binary Voxel Boolean Operations

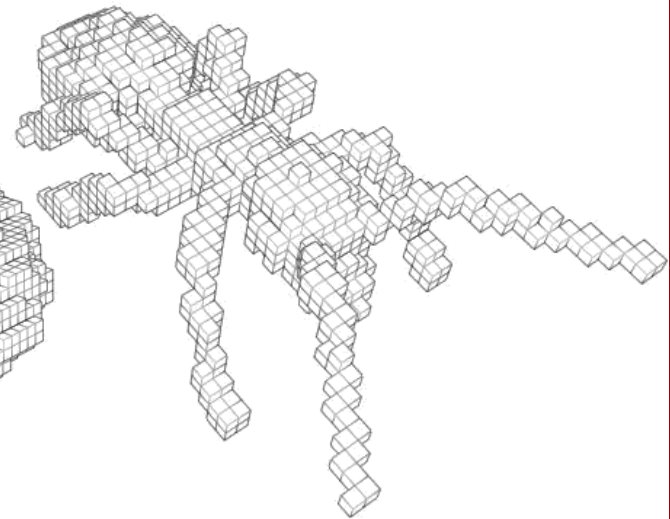
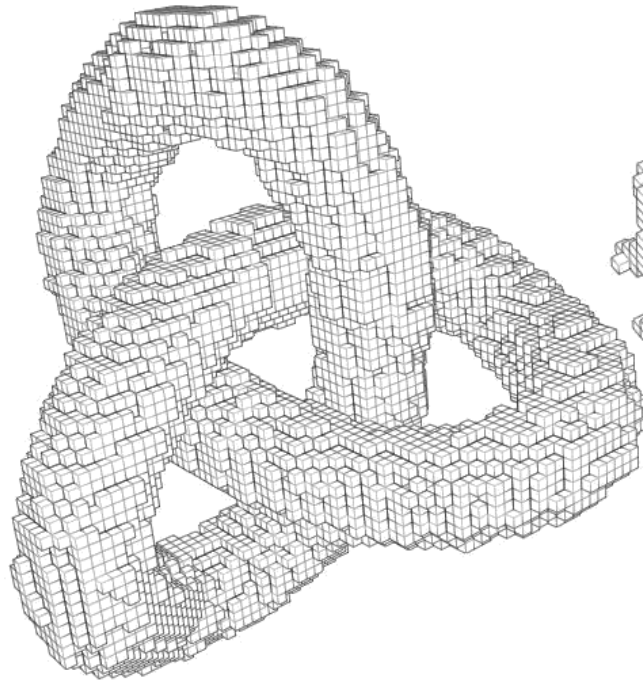
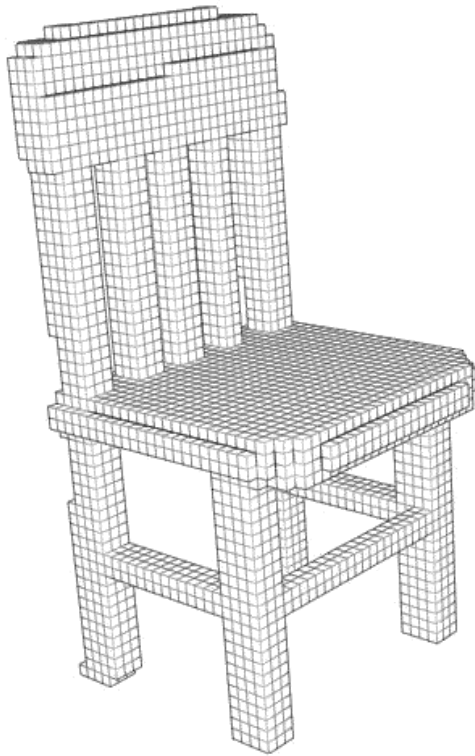
- Compare objects voxel by voxel
  - Trivial





# Binary Voxel Visualization

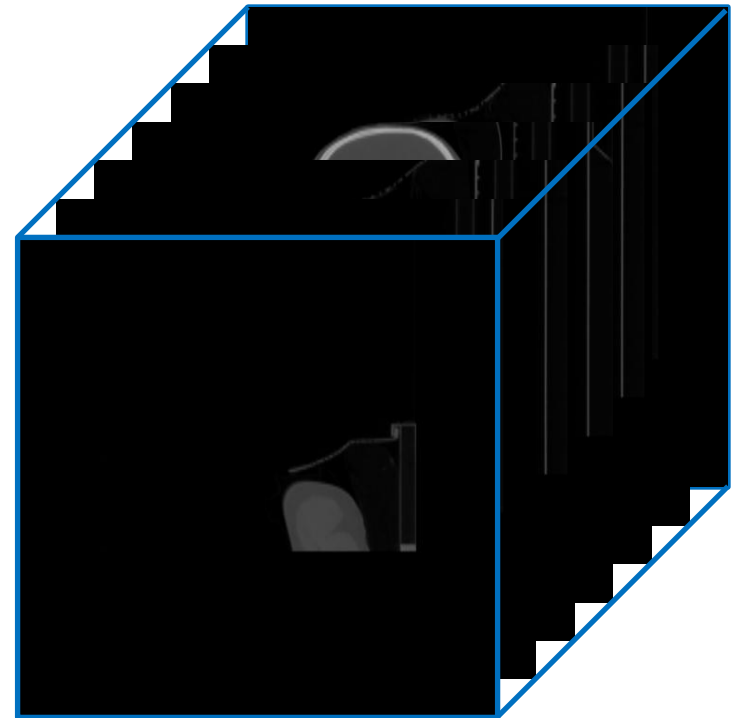
- Draw the faces between on and off voxels.





# Voxels

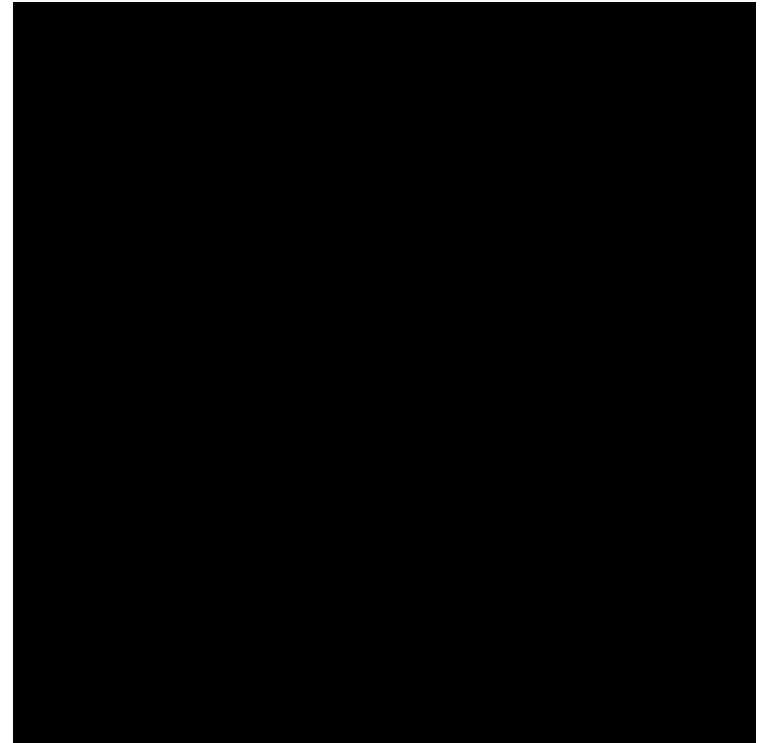
- Partition space into uniform grid
  - Grid cells are called *voxels* (volumetric elements)
- Each voxel has a value associated to it.
  - Binary Voxel Grids:
  - Continuous Voxel Grids:
    - » Each voxel stores a continuous value (e.g. density, temperature, color, etc.)





# Voxels

- Partition space into uniform grid
  - Grid cells are called *voxels* (like pixels)
- Each voxel has a value associated to it.
  - Binary Voxel Grids:
  - Continuous Voxel Grids:
    - » Each voxel stores a continuous value (e.g. density, temperature, color, etc.)



# Continuous Voxel Visualization



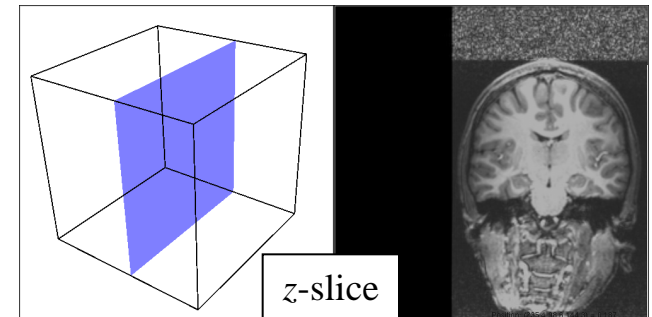
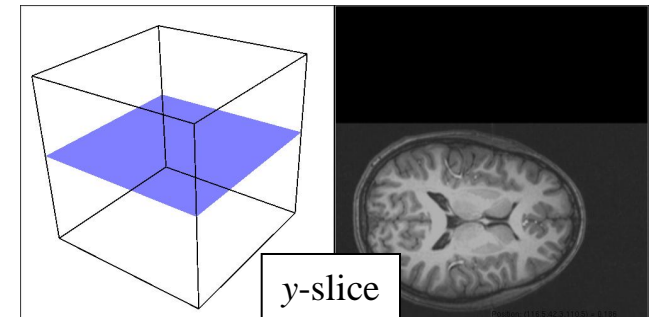
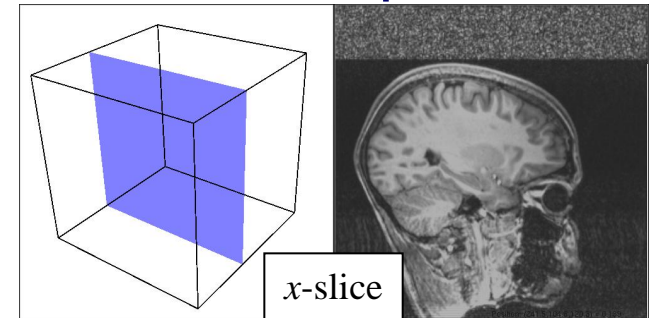
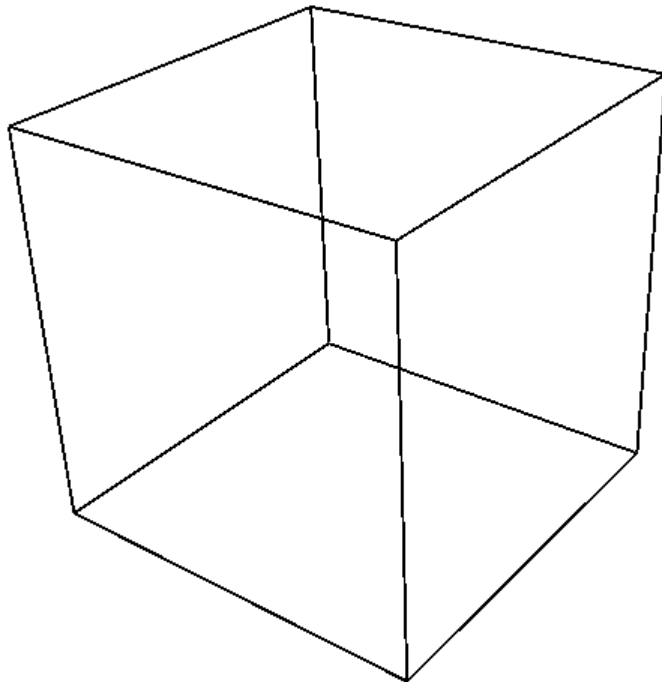
- Slicing
- Ray-Casting
- Iso-Surface Extraction





# Voxel Display

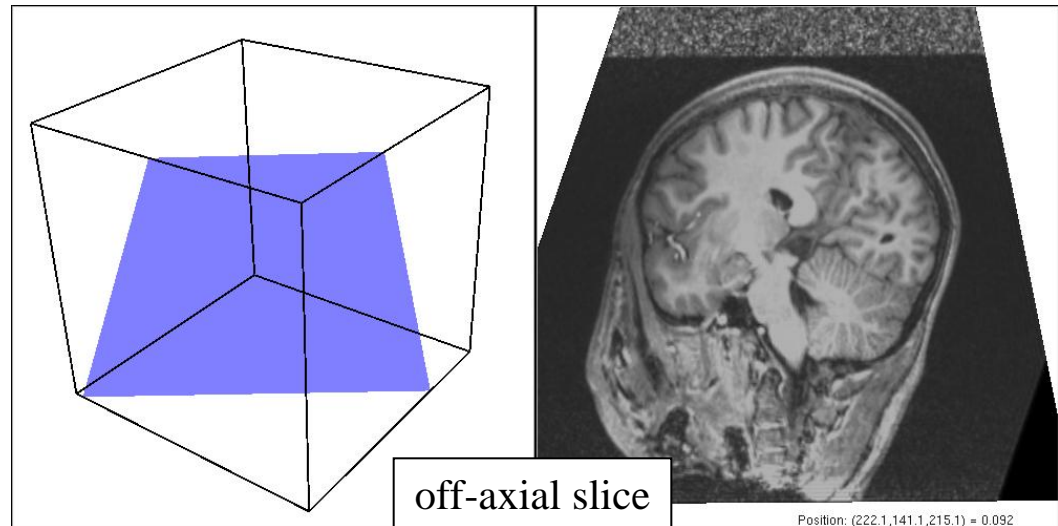
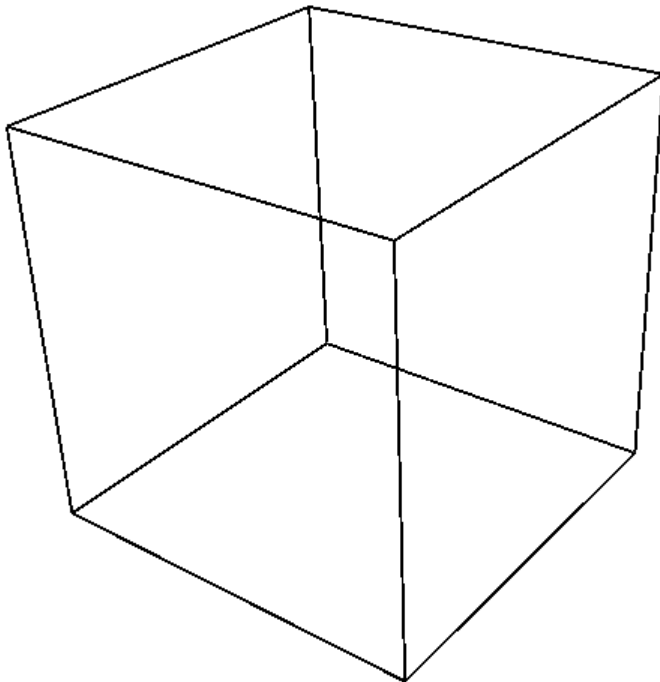
- Slicing
  - Draw 2D image by intersecting voxels with a plane
    - » Supported by 3D texturing on the GPU





# Voxel Display

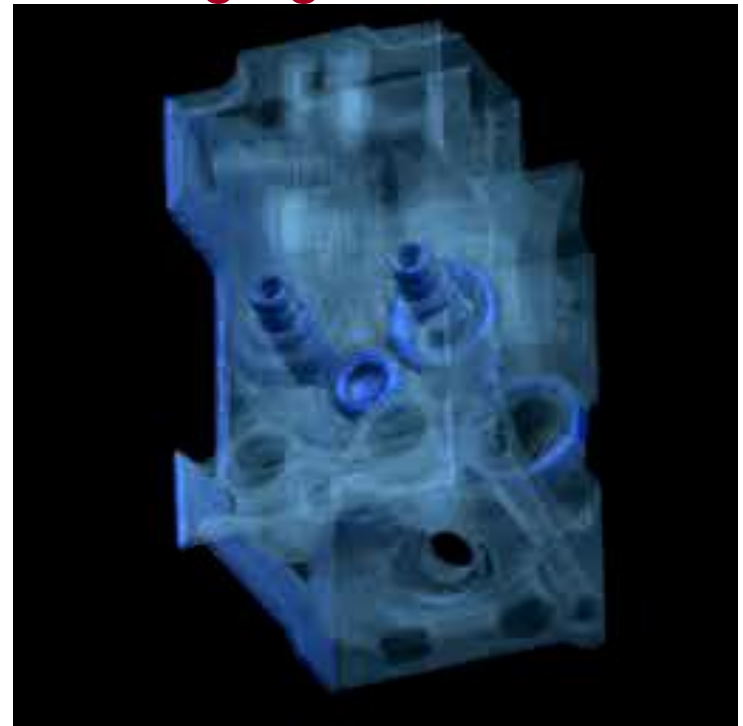
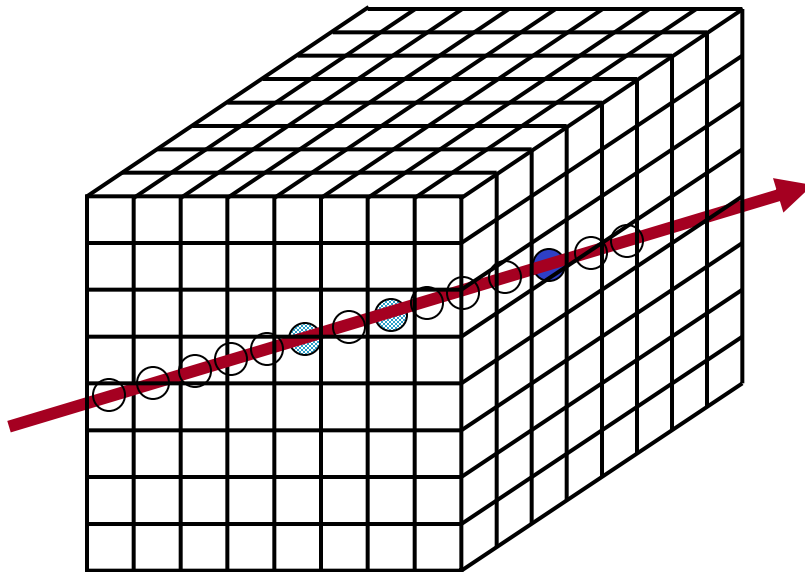
- Slicing
  - Draw 2D image by intersecting voxels with a plane
    - » Supported by 3D texturing on the GPU





# Voxel Display

- Ray casting
  - Integrate density along rays through pixels
    - » Doing this interactively is challenging

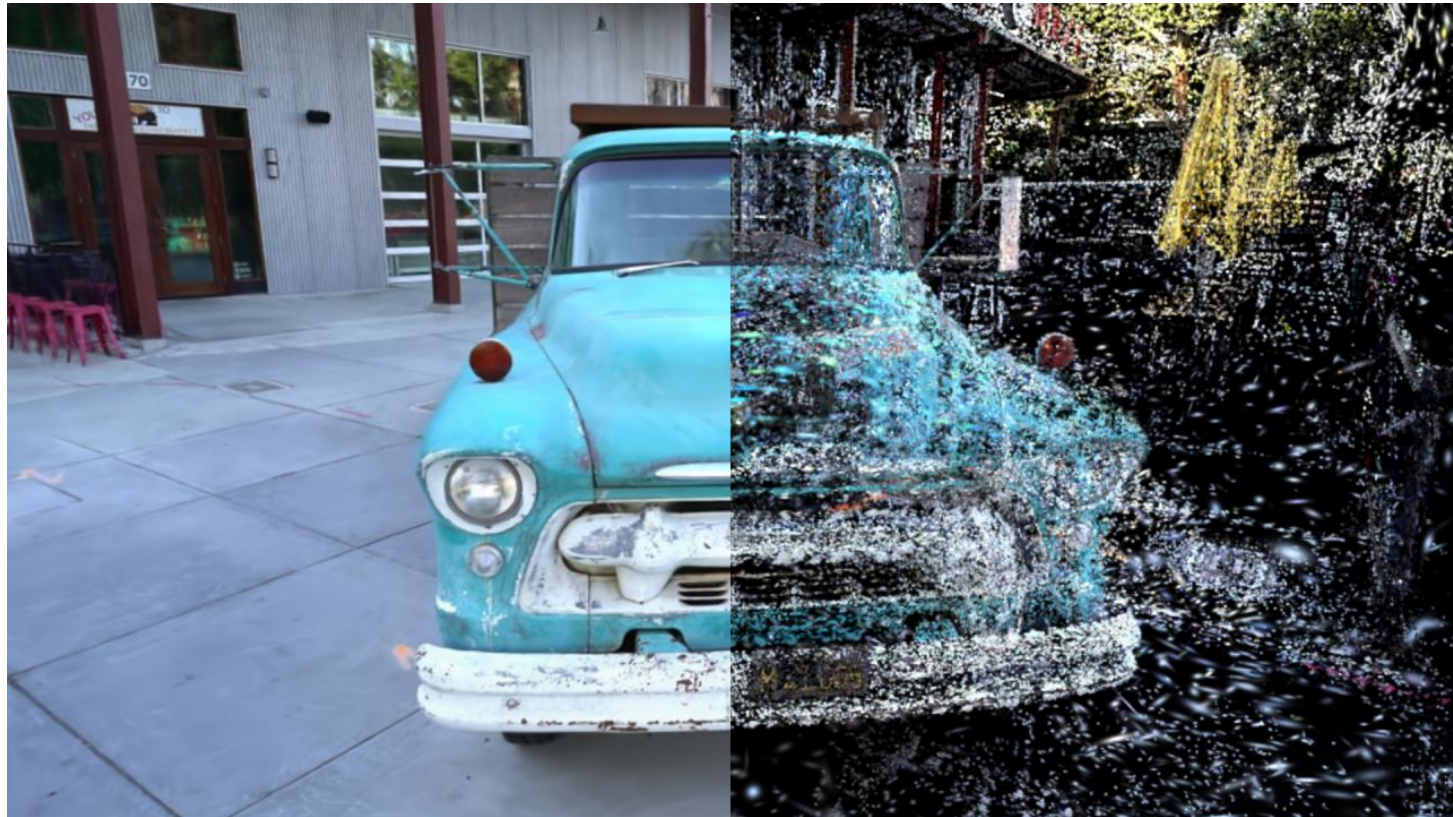


Engine Block  
Stanford University



# Voxel Display

- Ray casting
  - Integrate density along rays through pixels



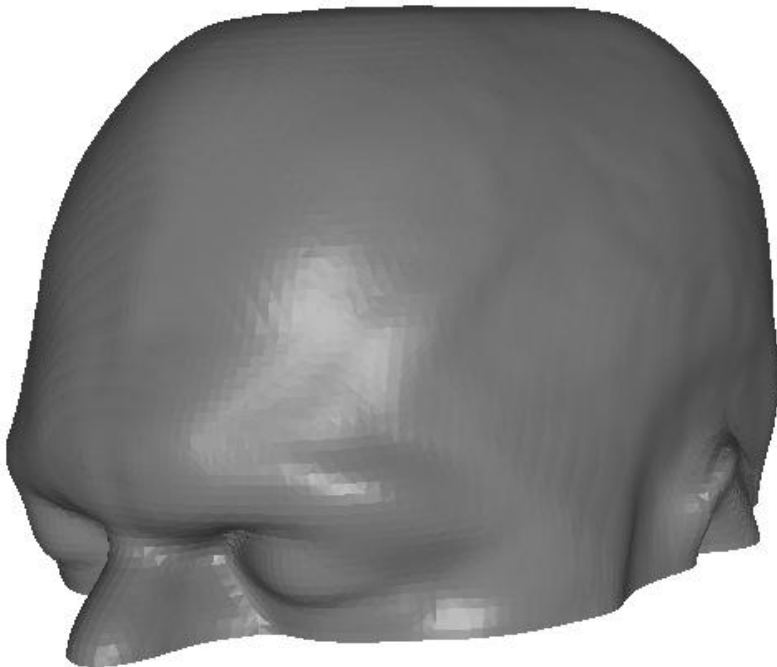
[https://innoarea.com/files/ejemplo\\_gaussian\\_splatting.png](https://innoarea.com/files/ejemplo_gaussian_splatting.png)

Similar to what's used in NeRF [Mildenhall, 2020] and Gaussian Splats [Kerbl, 2023] do.

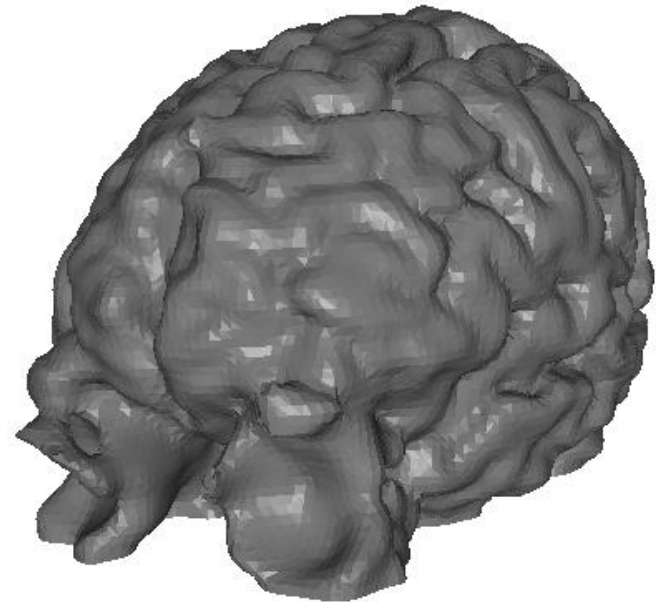


# Voxel Display

- Iso-Surface Extraction
  - Treat the voxel grid as a regular sampling of a function  $F(x, y, z)$ , and extract the iso-surface with  $F(x, y, z) = \delta$ .



Iso-Value =  $\delta_1$



Iso-Value =  $\delta_2$

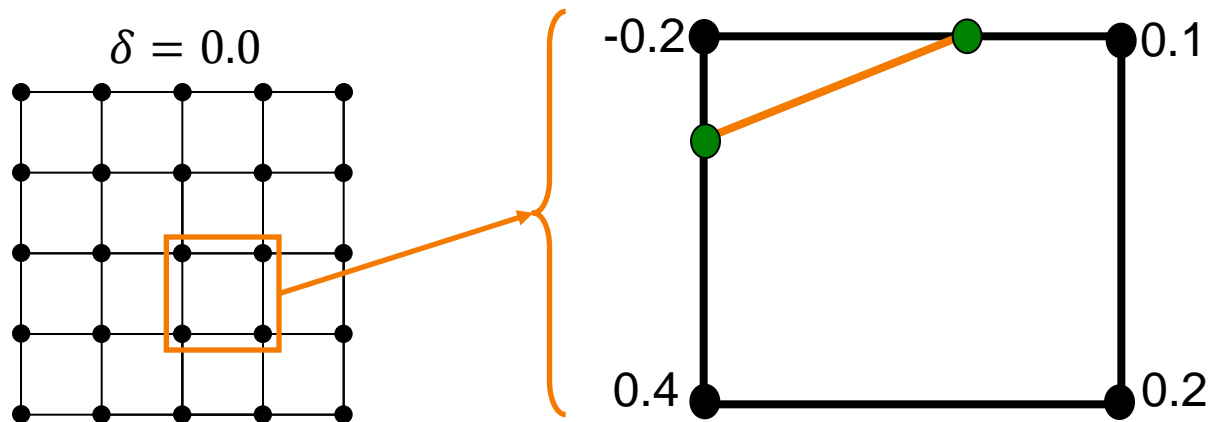


# Marching Cubes Algorithm

## [Lorensen and Cline, '87]



- Iso-Surfaces analog with 2D grid
  - Assume each grid vertex has scalar value
    - » **Iso-Vertices:** If one of the edge vertices has value larger than  $\delta$  and the other has value less than  $\delta$ , find the point on the edge whose linear interpolation equals  $\delta$ .
    - » **Iso-Edge:** Per cell, connect iso-vertices with line segments.



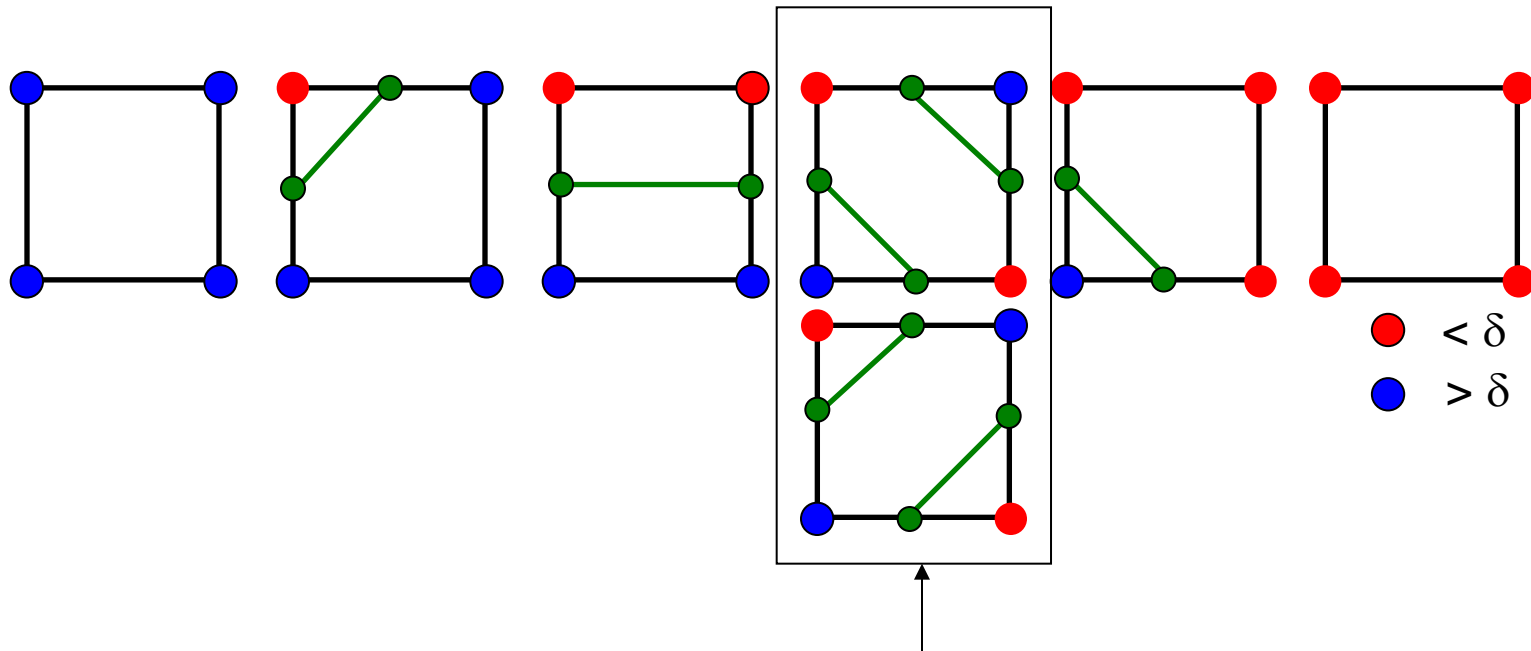
Note: The number of cell edges at which we insert vertices must be even

# Marching Cubes Algorithm

## [Lorensen and Cline, '87]



- Iso-Surfaces analog with 2D grid
  - Break up into the  $2^4 = 16$  different possible cases
  - Assign a rule for curve extraction in each case



Note that certain configurations are ambiguous.

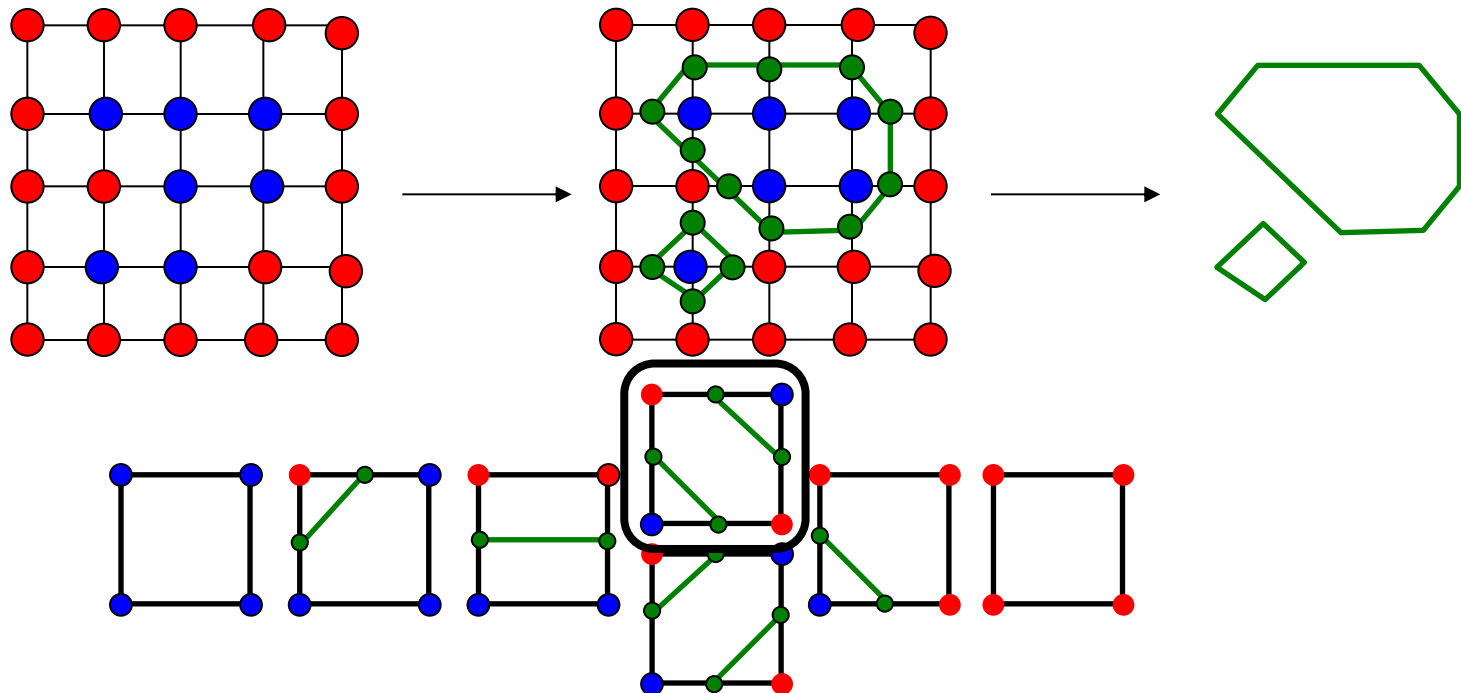


# Marching Cubes Algorithm

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  - Combine the iso-vertices from the different cells

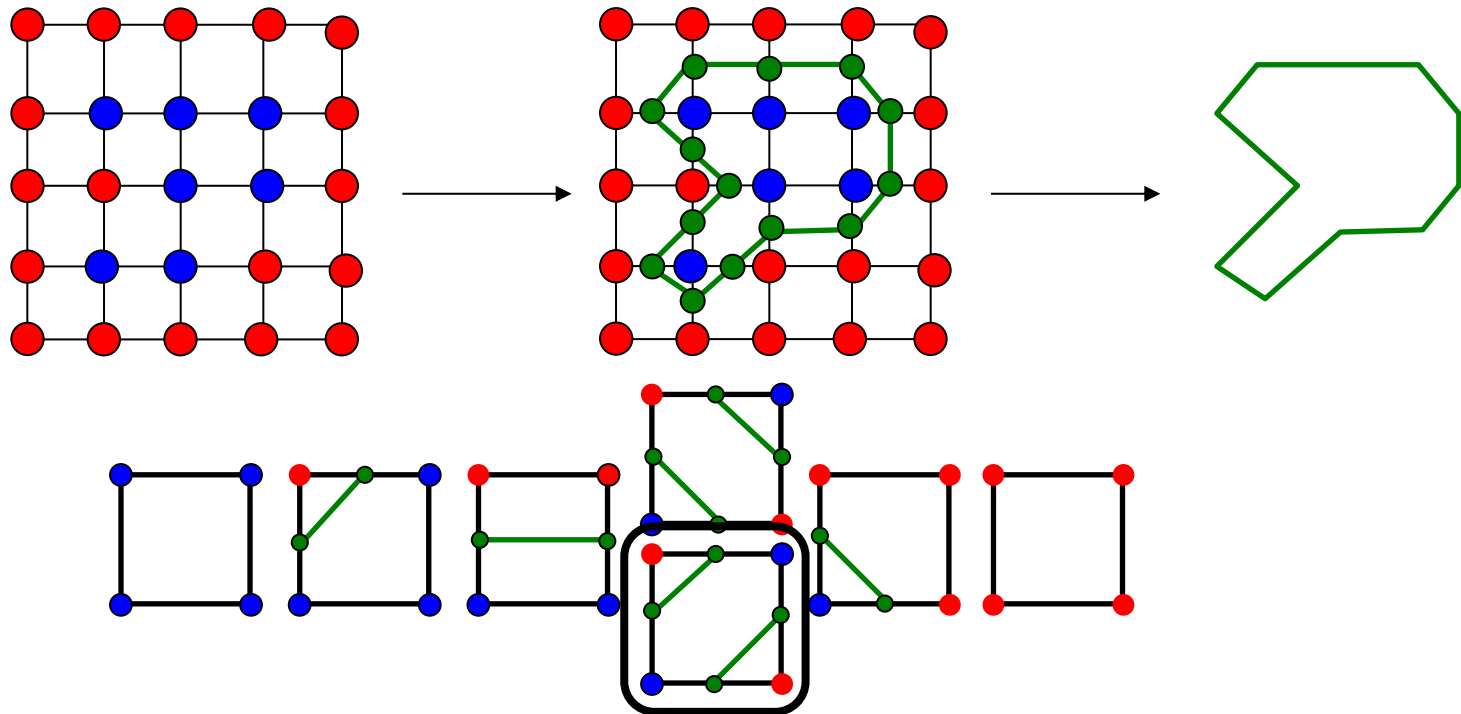


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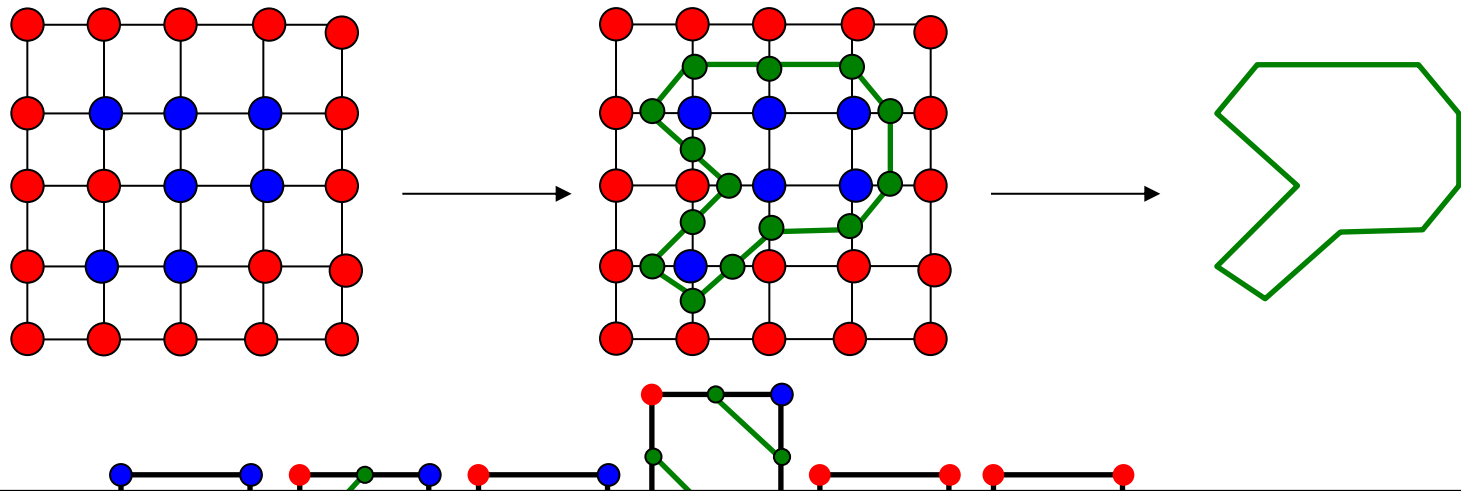


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  - Combine the iso-vertices from the different cells



As long as the geometry shared by adjacent cells (e.g. position of iso-vertices) is defined by values along the shared edge, adjacent cells will define consistent (connected) segments.

# Marching Cubes Algorithm

## [Lorensen and Cline, '87]

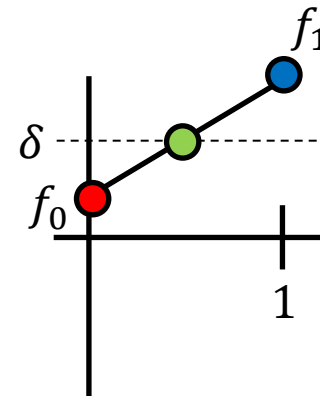
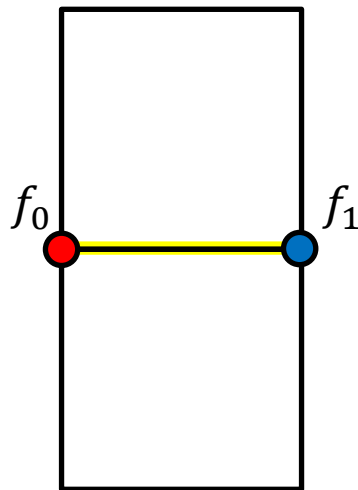


Assigning iso-vertex positions (linear):

Given values  $f_0$  and  $f_1$  at the endpoints of an edge we can fit a linear interpolant:

$$F(t) = f_0 \cdot (1 - t) + f_1 \cdot t$$

$\Rightarrow$  The function has value  $F(t) = \delta$  at  $t = \frac{\delta - f_0}{f_1 - f_0}$ .





# Marching Cubes Algorithm

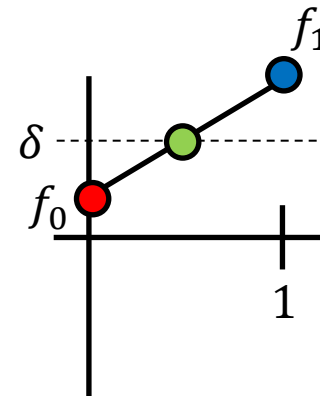
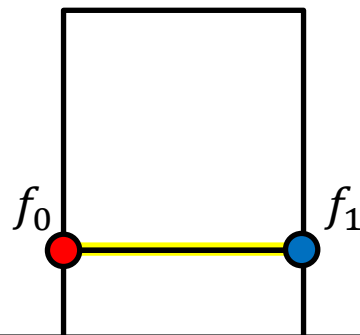
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$\Rightarrow$  The function has value  $F(t) = \delta$  at  $t = \frac{\delta - f_0}{f_1 - f_0}$ .



Note:

Since both cells see the same values along the shared edge, they both define the same iso-vertex.

# Marching Cubes Algorithm

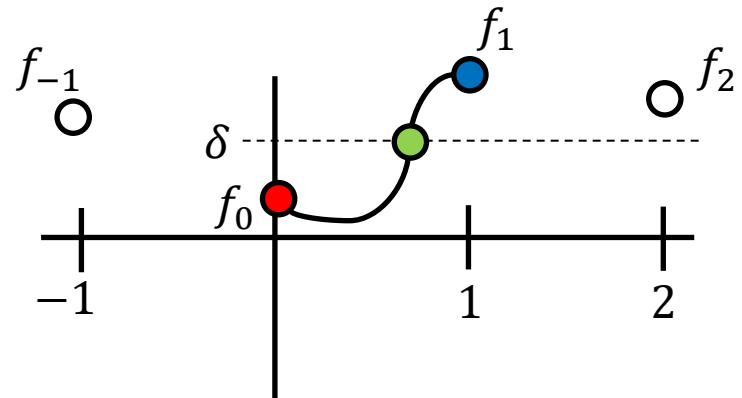
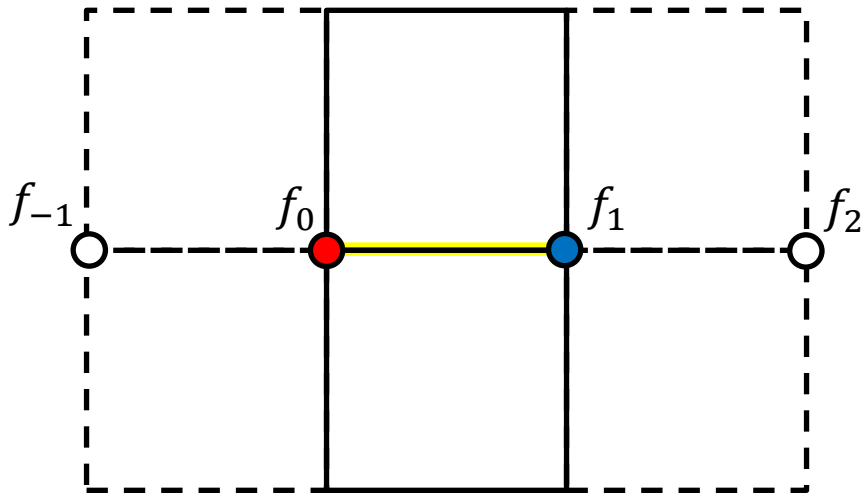
## [Lorensen and Cline, '87]



Assigning iso-vertex positions (cubic):

If we also know  $f_{-1}$  and  $f_2$  we can fit a Cardinal B-spline to the four values and find the root(s) of the cubic polynomial in the range  $[0,1]$ :

$$F(t) = f_{-1} \cdot BF_0(t) + f_0 \cdot BF_1(t) + f_1 \cdot BF_2(t) + f_2 \cdot BF_3(t)$$



# Marching Cubes Algorithm

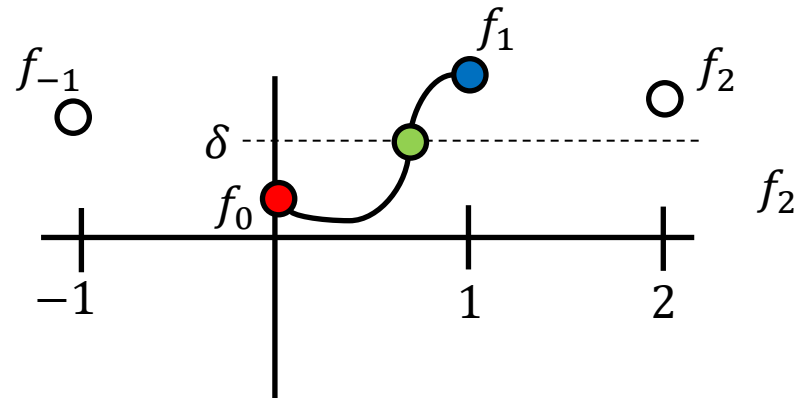
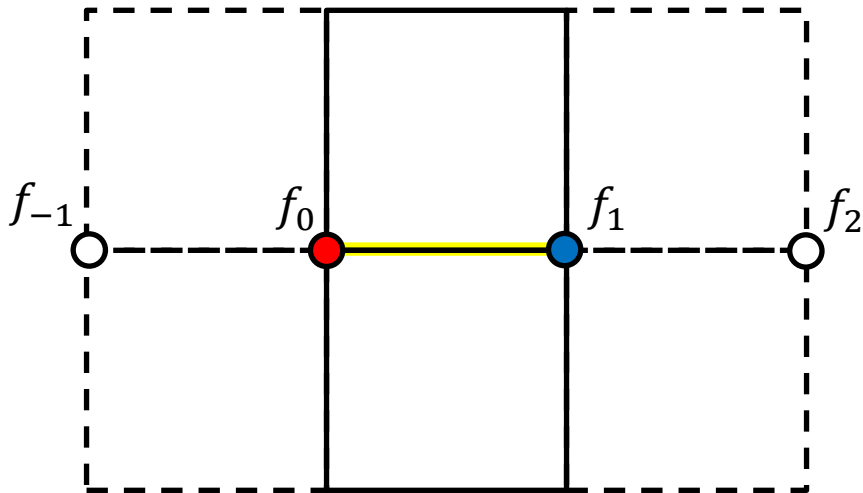
## [Lorensen and Cline, '87]



### Note:

Since the spline is interpolating, if  $f_0 < \delta$  and  $f_1 > \delta$  (or vice-versa)  $F(t)$  will have an odd number of roots in  $[0,1]$ .

- Because it is cubic,  $F(t)$  may have 3 roots in  $[0,1]$ .  
 $\Rightarrow$  We need to choose the zero-crossing consistently.
- $\Rightarrow$  Same number of iso-vertices as linear interpolation.



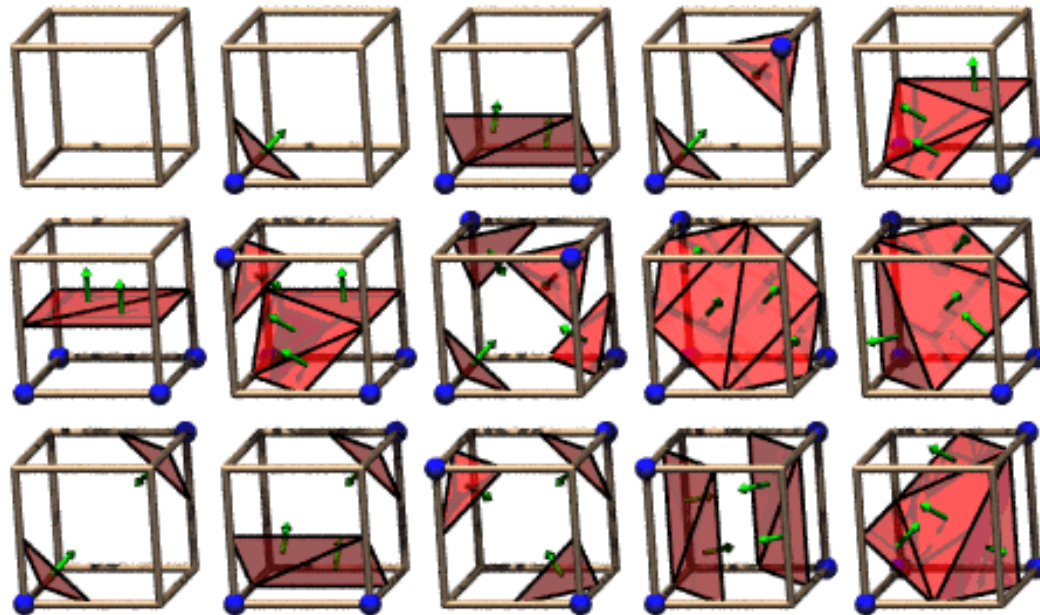


# Marching Cubes Algorithm

## [Lorensen and Cline, '87]



- Iso-Surface with 3D grid
  - Break up into the  $2^8 = 256$  different possible cases
  - Assign a rule for surface extraction in each case
  - Combine the iso-triangles from the different cells



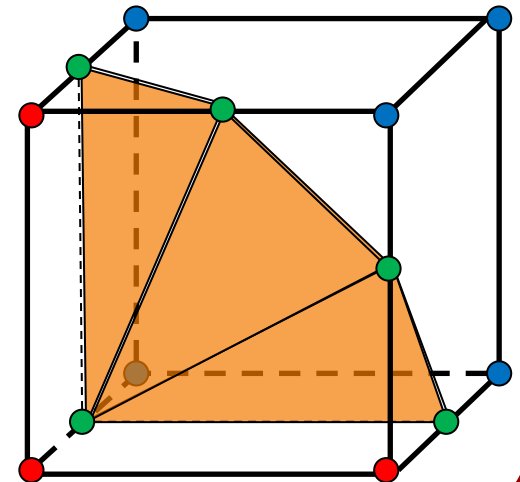
The 15 Cube Combinations

Back in the day, a table of  $2^8$  configurations was too much to store in memory. Leveraging symmetry, [Lorensen and Cline, 1987] reduced it to 15 cases.

# Marching Cubes Algorithm (Informally)



- Inductively:
  - Per edge (1D)
    - » Iso-vertices: Get edge  $\delta$ -crossings
  - Per face (2D)
    - » Iso-edges: Connect iso-vertices in each face
  - Per cell (3D)
    - » Iso-triangles: Merge iso-edges and triangulate



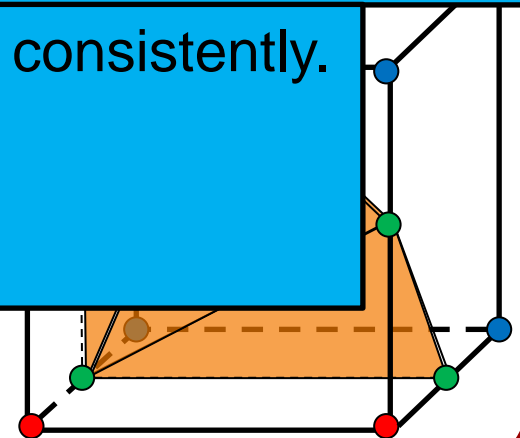
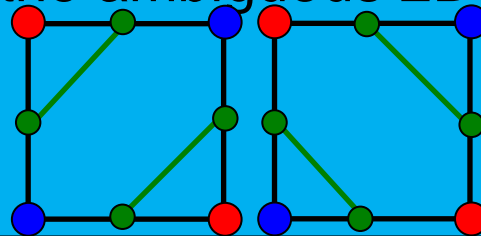
# Marching Cubes Algorithm (Informally)



- Inductively:
  - Per edge (1D)
    - » Iso-vertices: Get edge  $\delta$ -crossings
  - Per face (2D)
    - » Iso-edges: Connect iso-vertices in each face
  - Per cell (3D)

2D: Adjacent cells need to match iso-vertices across the shared edge.  
3D: Adjacent cells need to match iso-edges across the shared face.

⇒ Have to resolve the ambiguous 2D cases consistently.





# Voxels

Continuous voxel grids are 3D images. Operations that we applied to 2D images can also be applied to voxel grids:

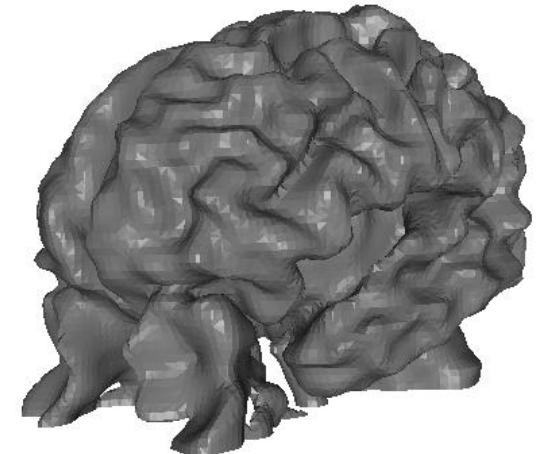
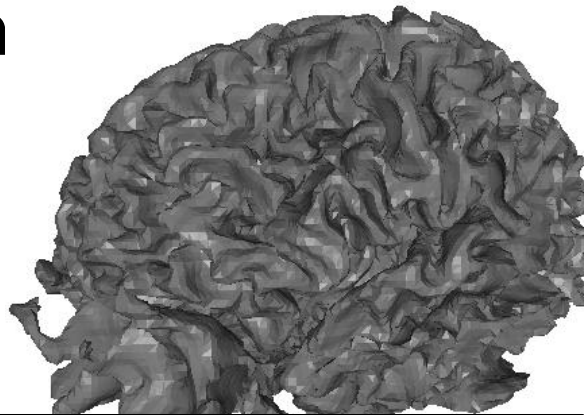
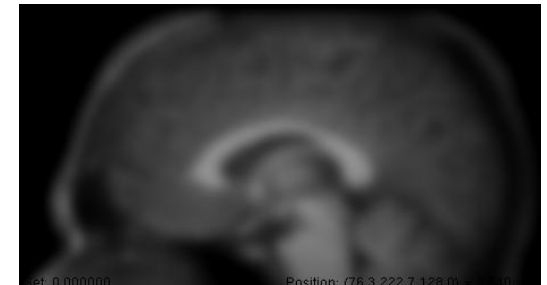
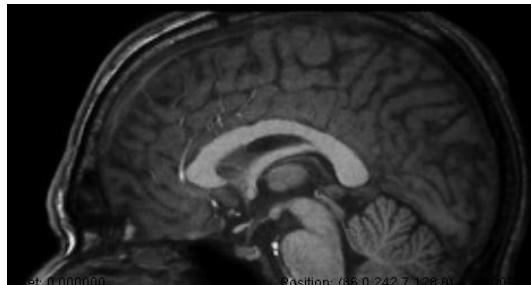
- Sampling
- Contrast
- Edge detection
- Smoothing



# Voxels

Continuous voxel grids are 3D images. Operations that we applied to 2D images can also be applied to voxel grids:

- Sampling
- Contrast
- Edge detection
- **Smoothing**



Demo



# Voxels

- Advantages
  - Simple
  - Same complexity for all objects
  - Natural acquisition for some applications
  - Trivial boolean operations
- Disadvantages
  - Approximate
  - Not affine invariant
  - Large storage requirements
  - Expensive display

# Solid Modeling Representations

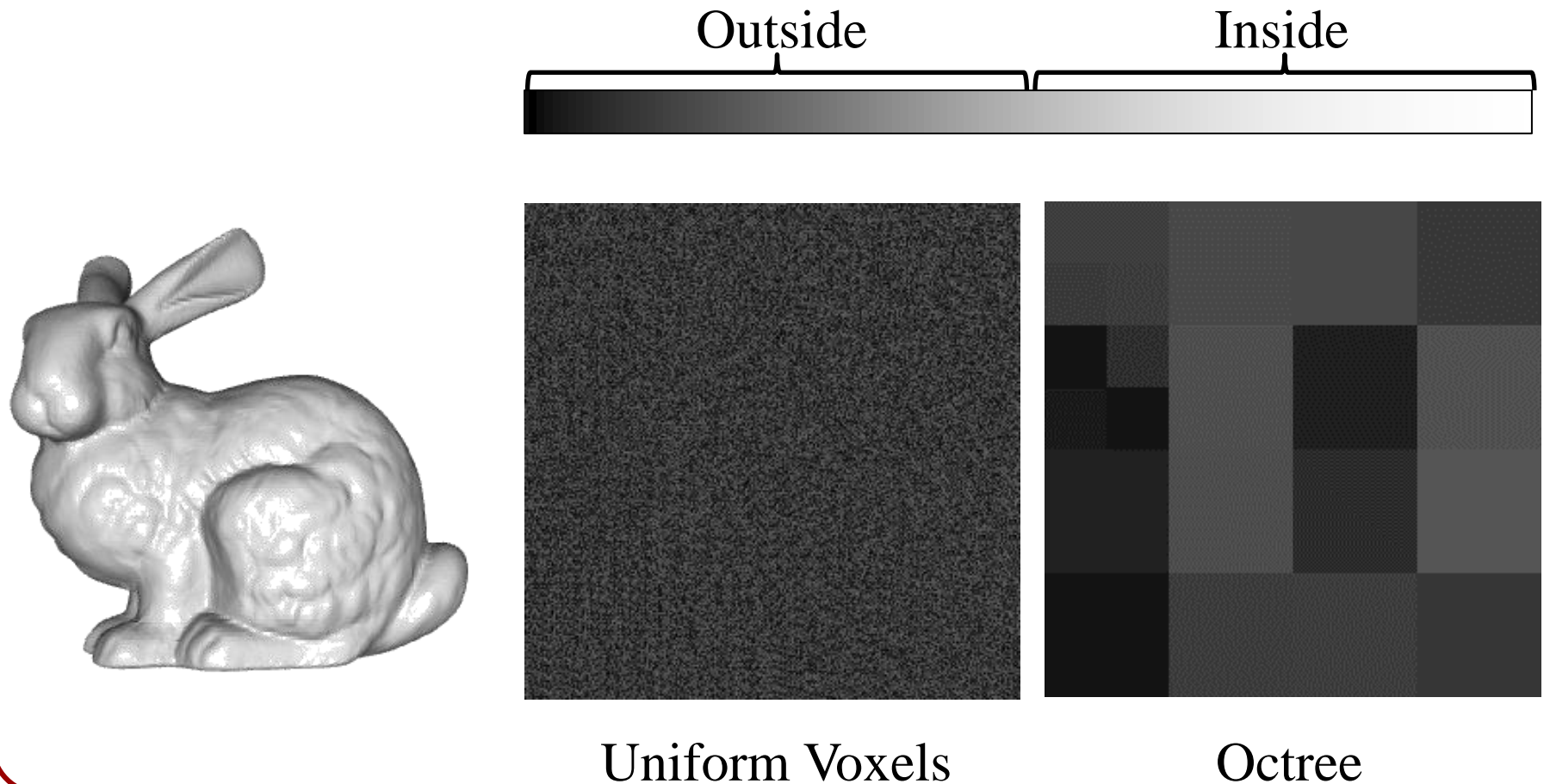


- Implicit Surfaces
- Voxels
- Quadtrees & Octrees



# Quadtrees(2D) & Octrees(3D)

- Refine resolution of voxels hierarchically





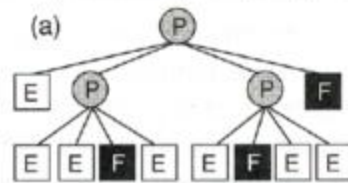
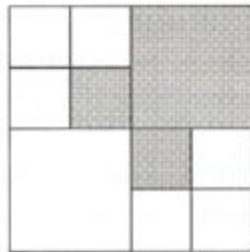


# Quadtrees(2D) and Octrees(3D)

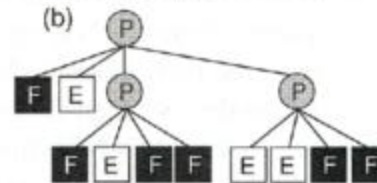
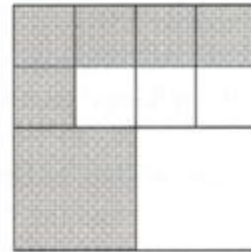
## Cell ordering:

1. bottom left
2. bottom right
3. top left
4. top right

**A**



**B**



- Expected complexity:  
number of nodes  $\cong$  to perimeter or surface area

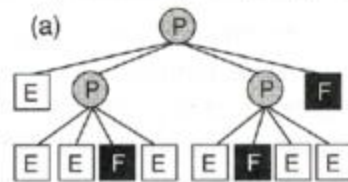
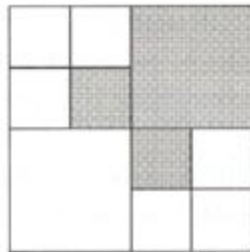


# Binary Quadtree Boolean Operations

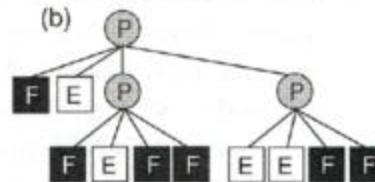
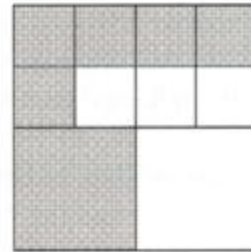
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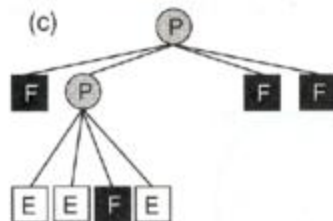
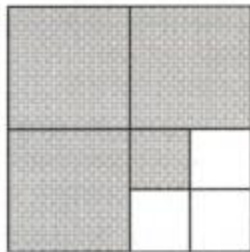
**A**



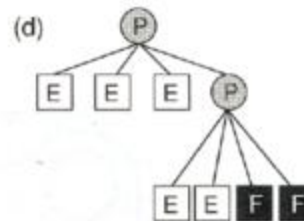
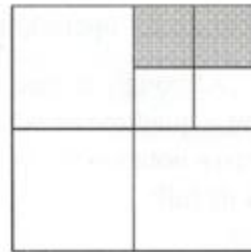
**B**



**A ∪ B**



**A ∩ B**



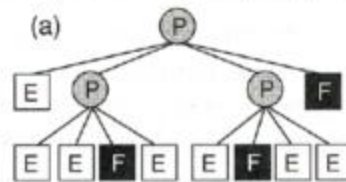
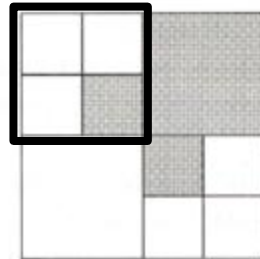


# Binary Quadtree Boolean Operations

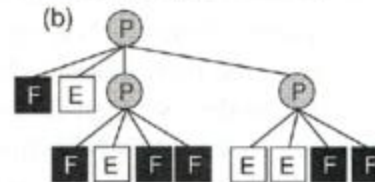
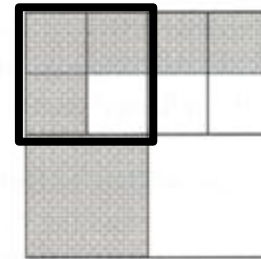
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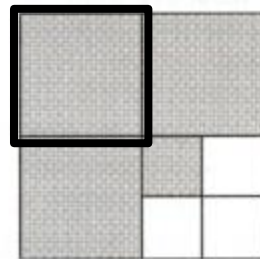
**A**



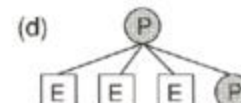
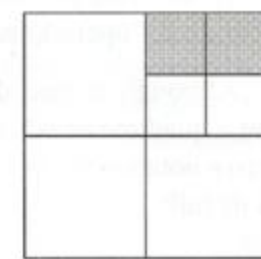
**B**



**$A \cup B$**



**$A \cap B$**



If the operation results in all child nodes being marked empty/full

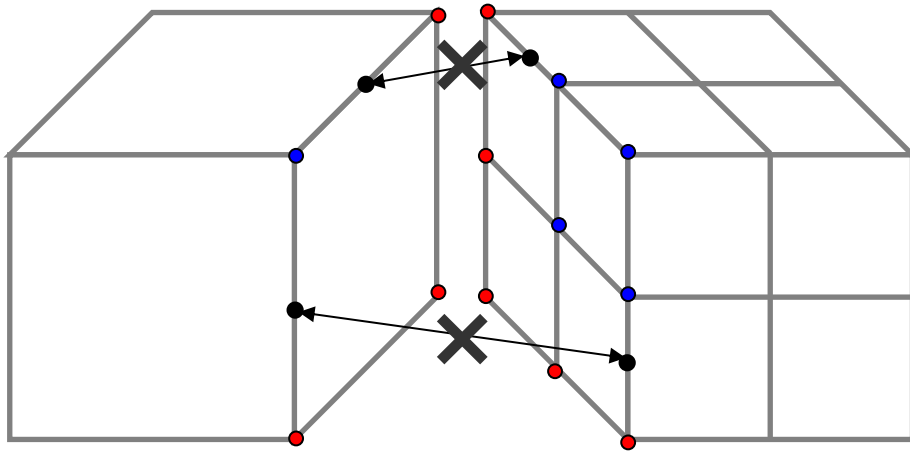


Remove the children and mark the parent



# Octree Display

- Extend voxel methods
  - Slicing
  - Ray casting
  - Iso-surface extraction

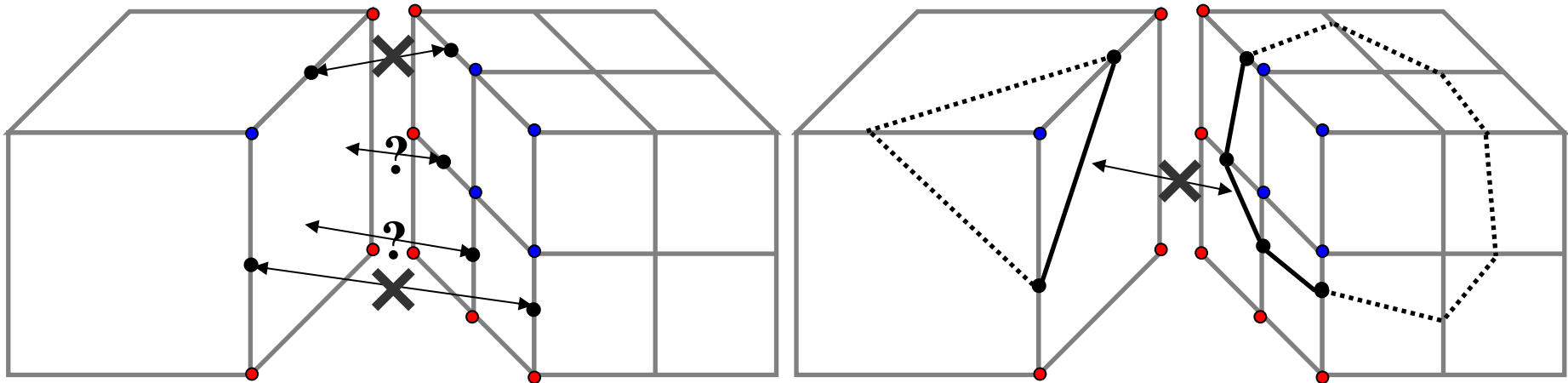


How to define positions of  $\delta$ -crossings along edges shared by cells at different resolutions?



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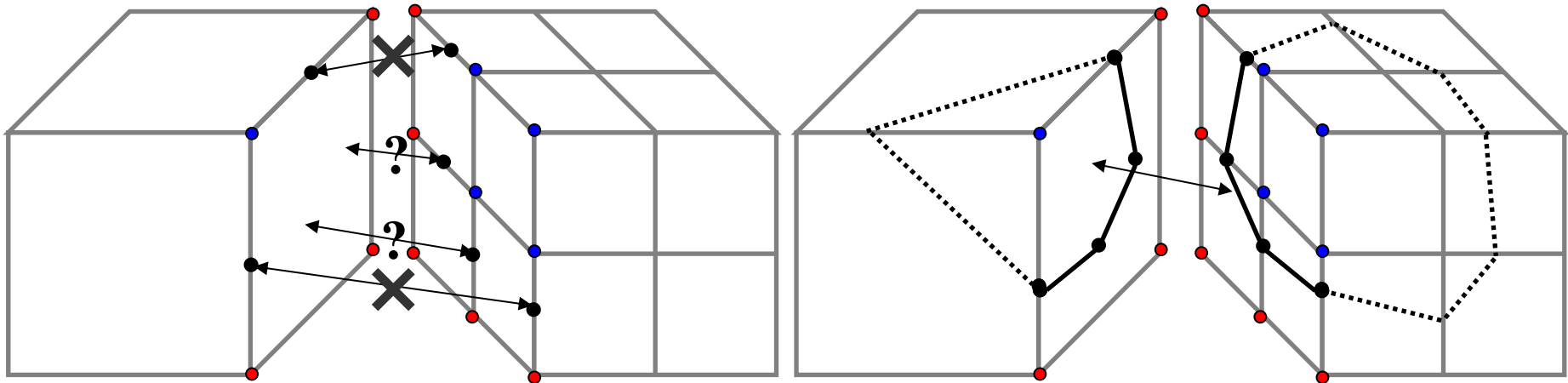


How to handle the situation when vertices on one side of a face do not exist on the other?



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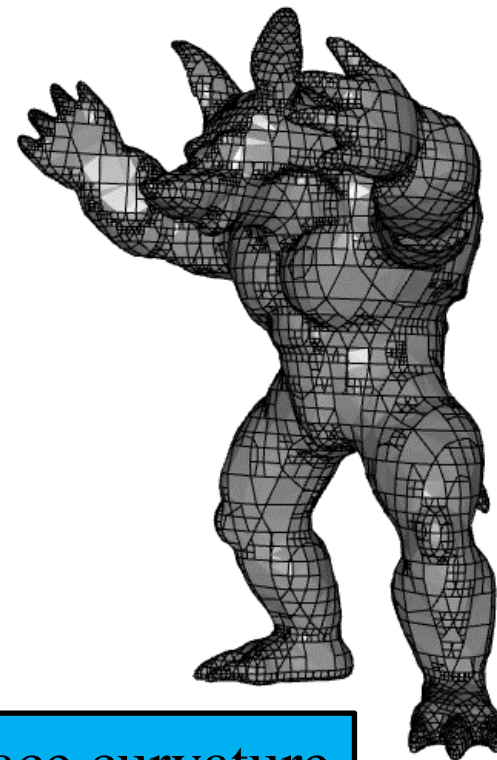
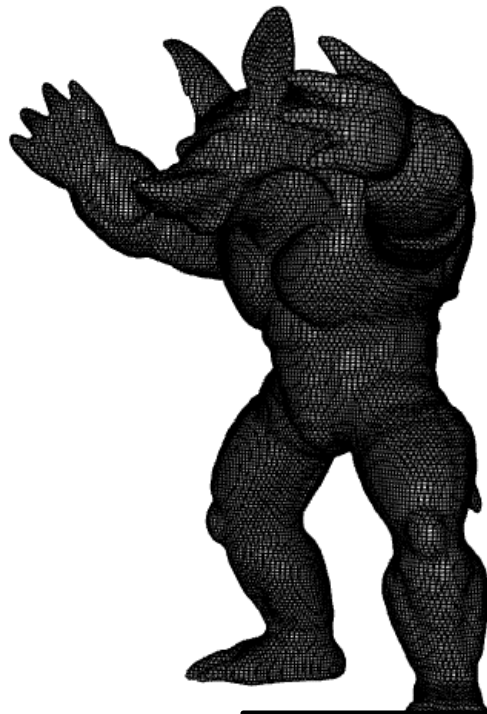
General Approach:

Copy from the finer faces to the coarser one.



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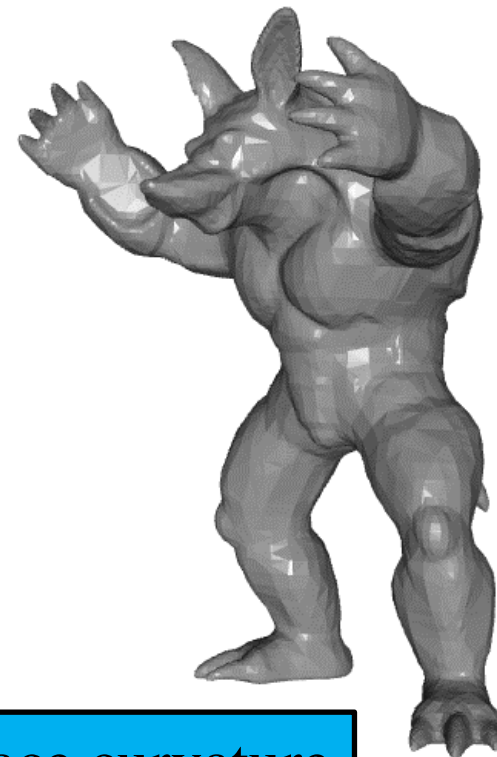
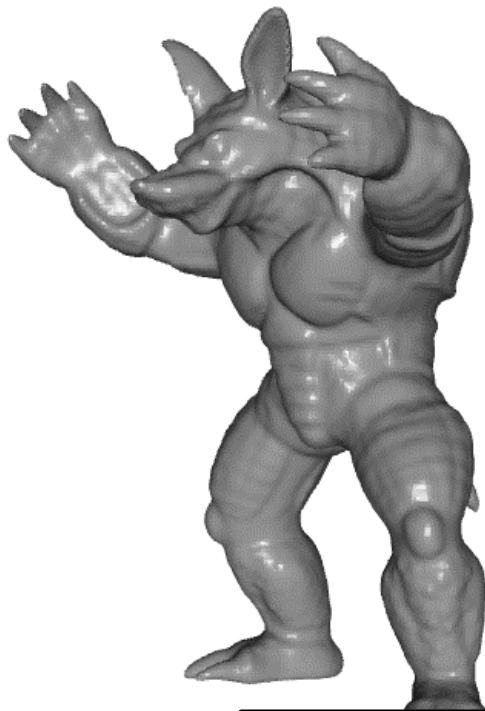


Octree adapted to surface curvature



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Octree adapted to surface curvature