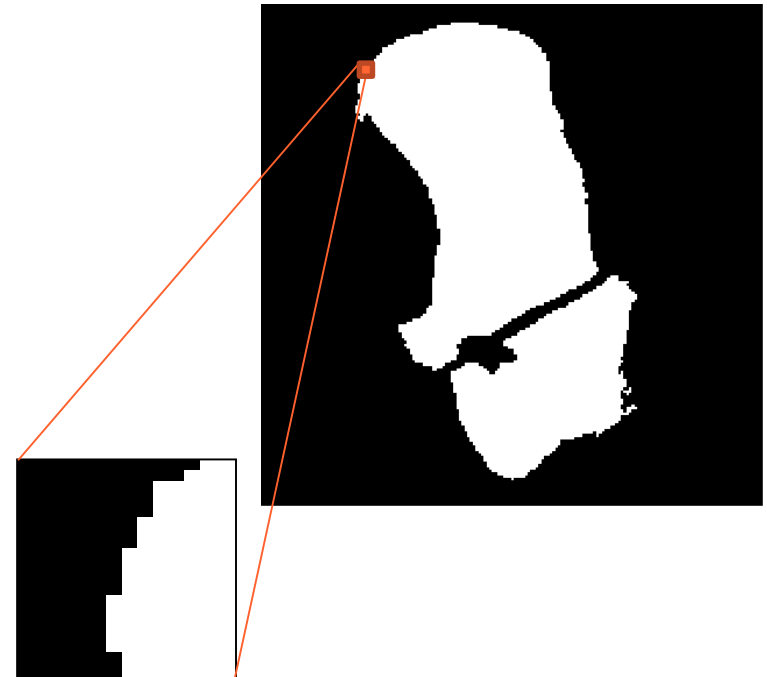


# **CSE 554**

## **Lecture 4: Contouring**

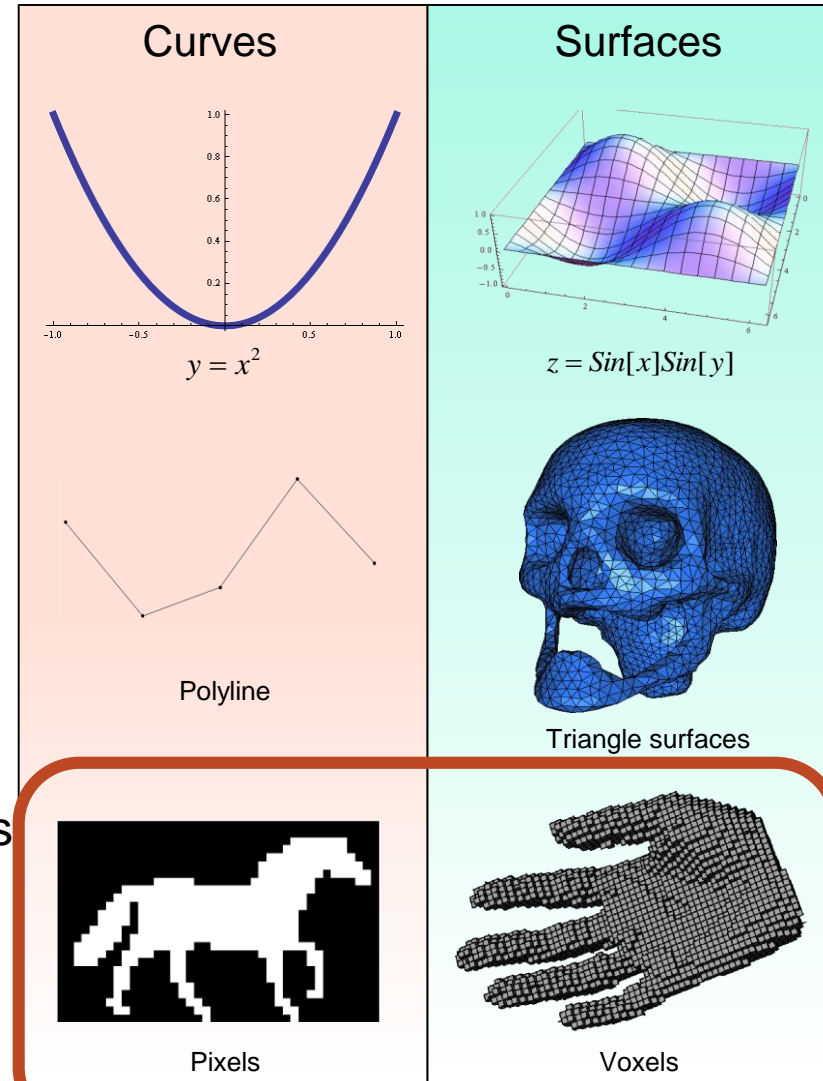
Fall 2018

- Binary pictures
  - Pros:
    - Natural geometric form for images
    - Easy to operate on
  - Cons:
    - Blocky boundary
    - Large memory footprint



# Geometric Forms

- Continuous forms
  - Defined by mathematical functions
  - E.g.: parabolas, splines, subdivision surfaces
- Discrete forms
  - Disjoint elements with connectivity relations
  - E.g.: polylines, triangle surfaces, pixels and voxels

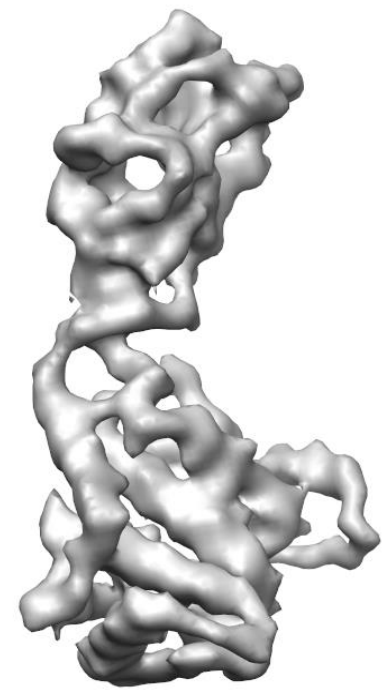


# Boundary Representations

- Polylines (2D) or meshes (3D) that tile the object boundary
  - Smoother appearance
  - Less storage (no interior elements)



Binary picture



Boundary mesh

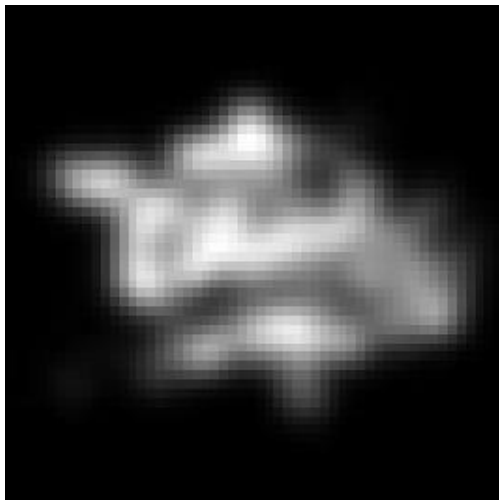
# Boundary Representations

---

- We will cover (in a sequence of lectures):
  - ➔ — Extracting a boundary from a grayscale image (volume)
  - Denoising
  - Simplification
  - Alignment
  - Deformation

# Thresholding - Revisited

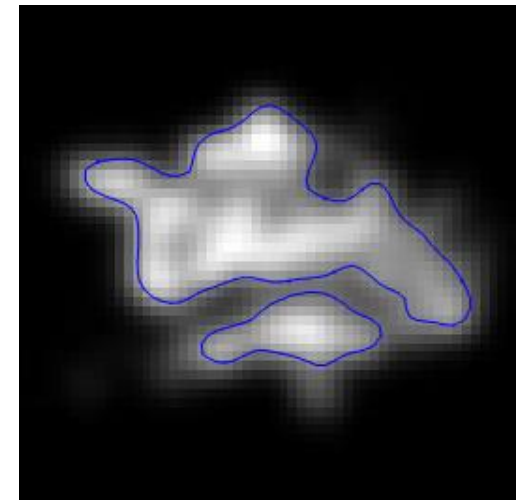
- Creates a binary picture from a grayscale image
- How to define a smooth boundary at the threshold?
  - Such boundary is known as a *contour* (or level set, iso-curve, iso-surface, etc.)



Grayscale image



Thresholded binary picture



Boundary curve

# Contours: Definition

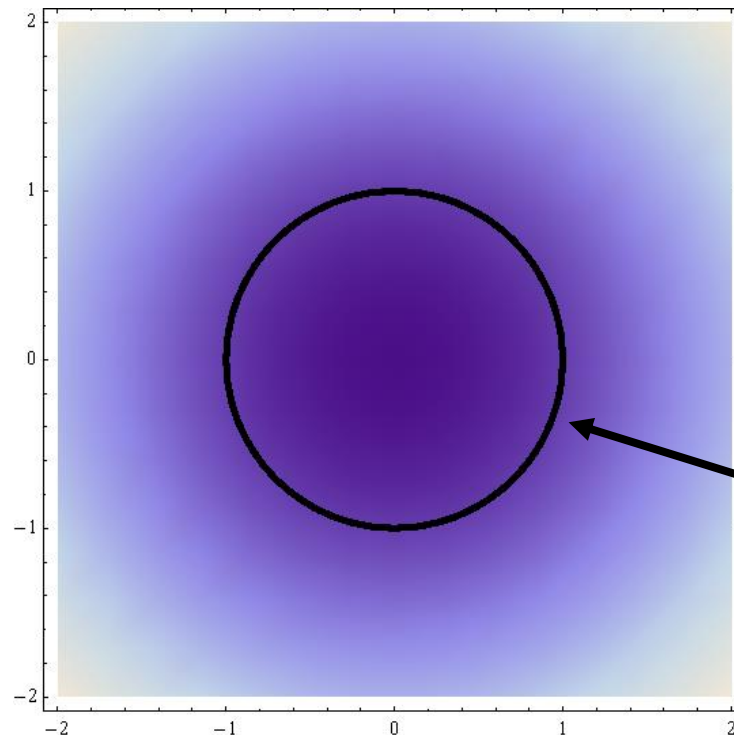
---

- Given a **continuous** function  $f$  defined over the space
  - $f$  is defined on any arbitrary point, not just at pixels/voxels
- A **contour at iso-value  $c$**  is the set of all points where  $f$  evaluates to be  $c$

# Contours: Examples

- Contours of 2D functions (iso-curves)

$$\{\{x, y\} \mid f(x, y) = c\}$$



$$f(x, y) = x^2 + y^2$$

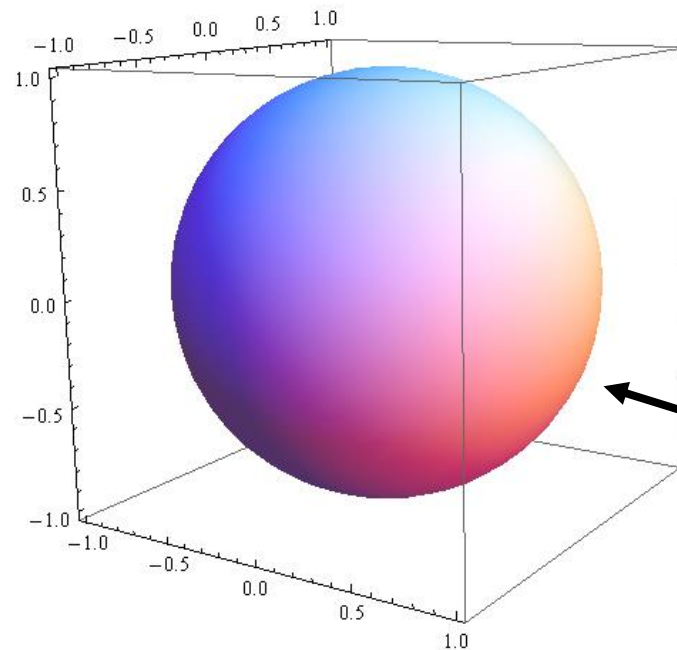
$$f(x, y) = 1$$



# Contours: Examples

- Contours of 3D functions (**iso-surfaces**)

$$\{\{x, y, z\} \mid f(x, y, z) = c\}$$

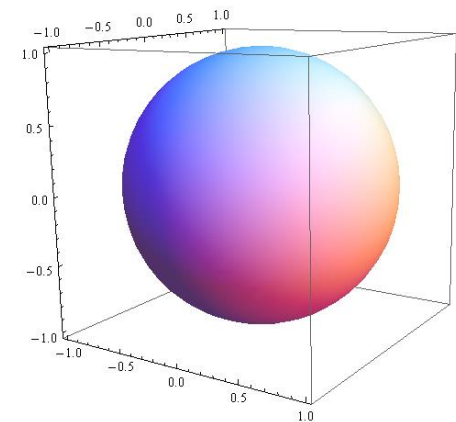
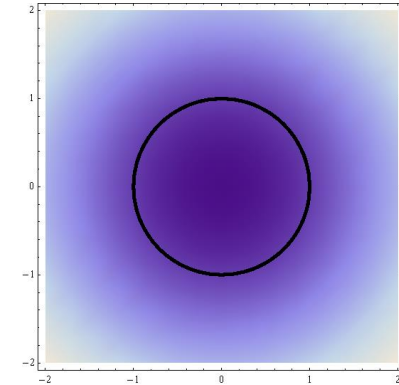


$$f(x, y, z) = x^2 + y^2 + z^2$$

$$f(x, y, z) = 1$$

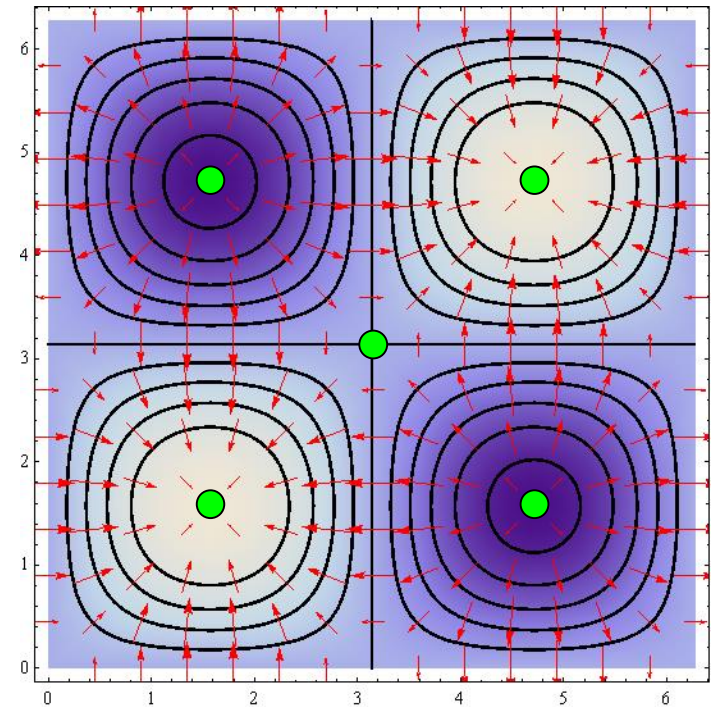
# Contours: Properties

- Closed
  - With a well-defined inside and outside
    - Separates points above/below the iso-value



# Contours: Properties

- Closed
  - With a well-defined inside and outside
    - Separates points above/below the iso-value
- In general, a manifold
  - A non-degenerate curve (surface) without branching or boundaries
    - Except at critical points (*local maxima, minima, saddle*)
- Orthogonal to gradient directions
  - Critical points: where gradient is zero



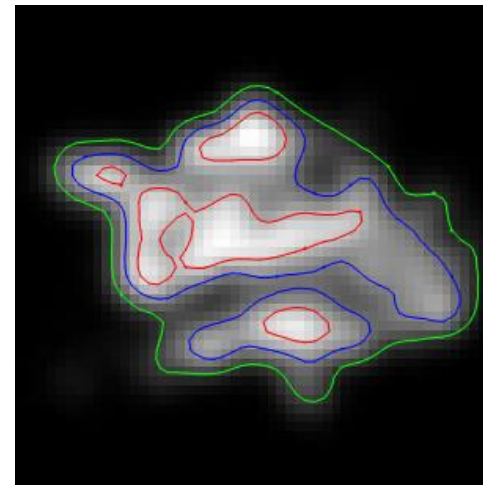
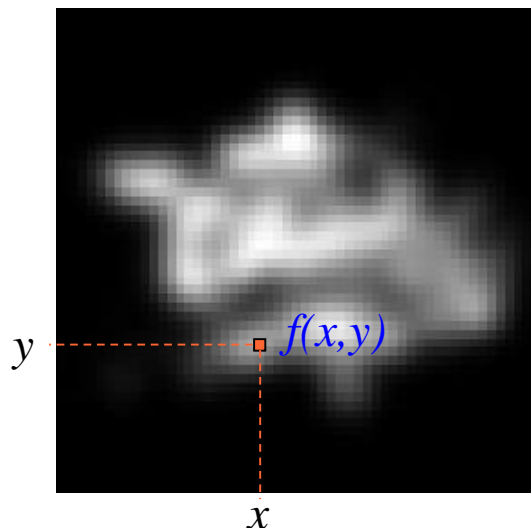
Black curves: contours at multiple iso-values

Green dots: critical points

Red arrows: gradient directions

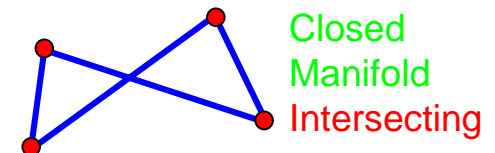
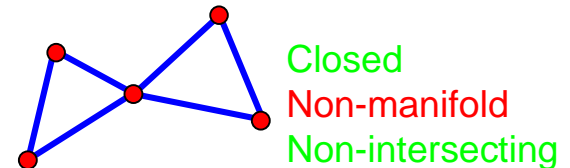
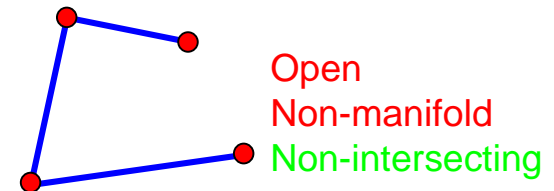
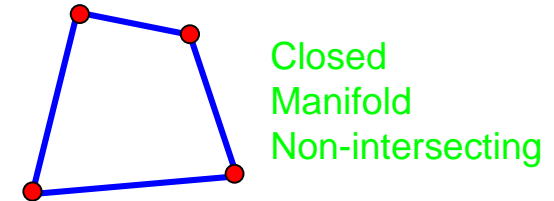
# Discrete Contours

- Image as a sampling of some continuous function  $f$ 
  - Values only known at pixels
- Compute discrete **approximations** of contours of  $f$ 
  - As polylines (2D) or meshes (3D)



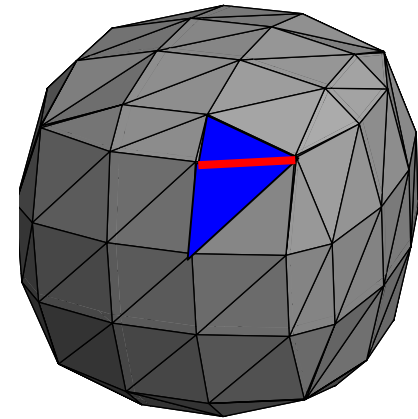
# “Good” Approximations: 2D

- **Closed** (with inside and outside)
  - A vertex is shared by even # of edges
- **Manifold**
  - A vertex is shared by 2 edges
- **Non-intersecting**



# “Good” Approximations: 3D

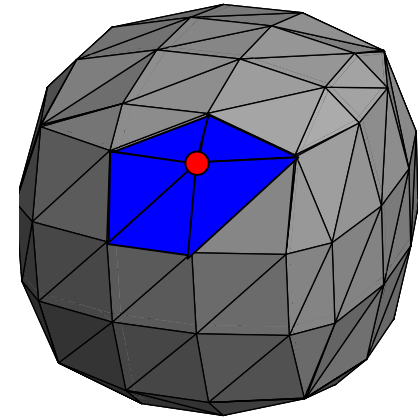
- Closed (with inside and outside)
  - An edge is shared by even # of polygons
- Manifold
  - An edge is shared by 2 polygons, and a vertex is contained in a ring of polygons
- Non-intersecting



A closed, manifold,  
non-intersecting  
triangular mesh

# “Good” Approximations: 3D

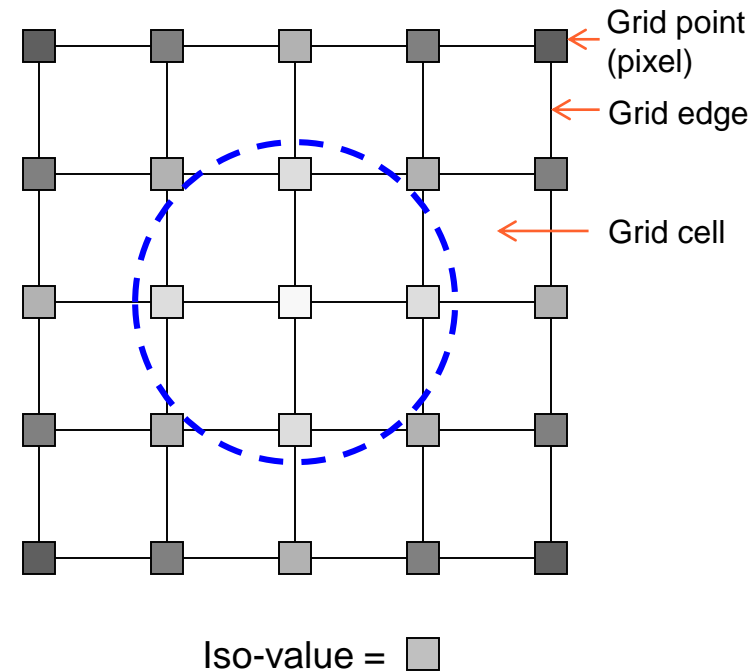
- Closed (with inside and outside)
  - An edge is shared by even # of polygons
- Manifold
  - An edge is shared by 2 polygons, and a vertex is contained in a ring of polygons
- Non-intersecting



A closed, manifold,  
non-intersecting  
triangular mesh

# Contouring (On A Grid)

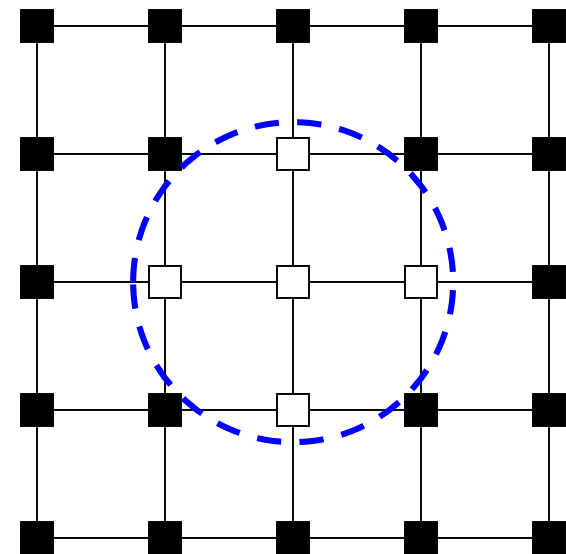
- Input
  - A grid where each grid point (pixel or voxel) has a value (color)
  - An iso-value (threshold)
- Output
  - A closed, manifold, non-intersecting polyline (2D) or mesh (3D) that separates grid points **above** the iso-value from those that are **below** the iso-value.





# Contouring (On A Grid)

- Input
  - A grid where each grid point (pixel or voxel) has a value (color)
  - An iso-value (threshold)
- Output
  - Equivalently, we extract the zero-contour (separating **negative** from **positive**) after **subtracting the iso-value** from the grid points

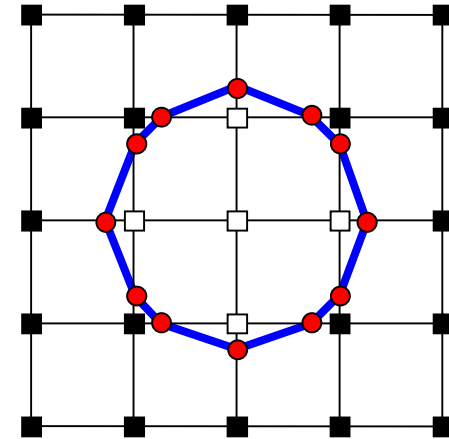


Iso-value = 0

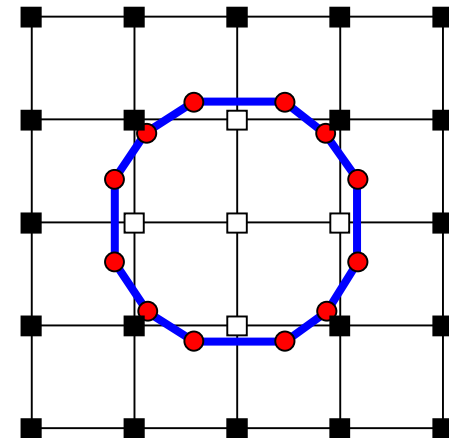
■ negative      □ positive

# Algorithms

- Primal methods
  - Marching Squares (2D), Marching Cubes (3D)
  - Placing vertices on **grid edges**

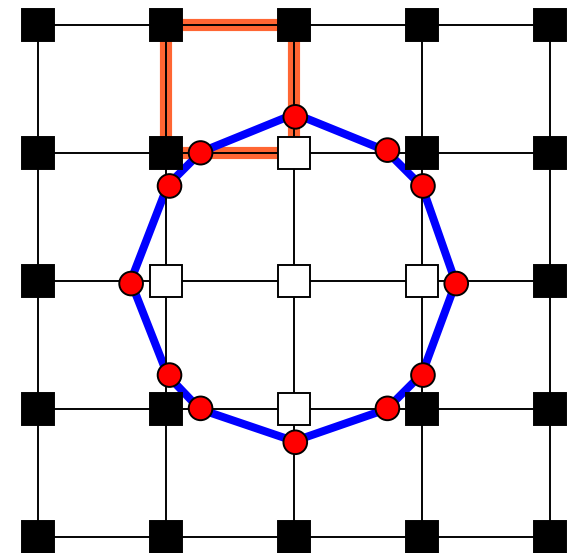


- Dual methods
  - Dual Contouring (2D,3D)
  - Placing vertices in **grid cells**



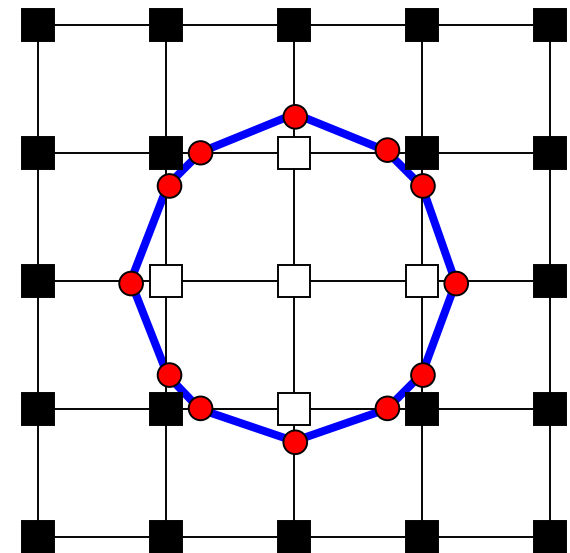
# Marching Squares (2D)

- For each grid **cell** with a sign change
  - Create one vertex on each grid edge with a sign change
  - Connect vertices by lines



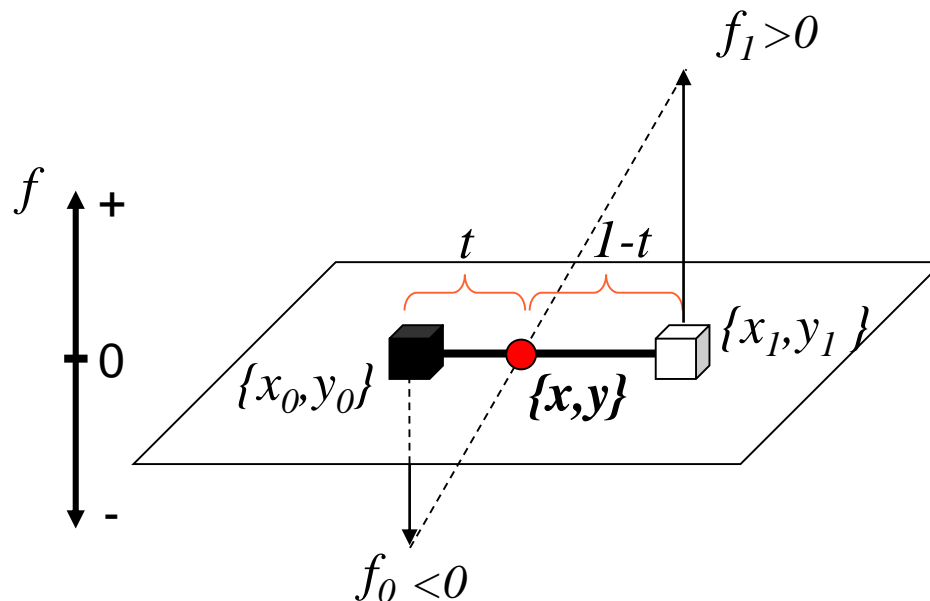
# Marching Squares (2D)

- For each grid **cell** with a sign change
  - Create one vertex on each grid edge with a sign change
  - Connect vertices by lines



# Marching Squares (2D)

- Creating vertices: linear interpolation
  - Assuming the underlying, continuous function is linear on the grid edge
  - Find the zero-crossing between the function and the grid edge



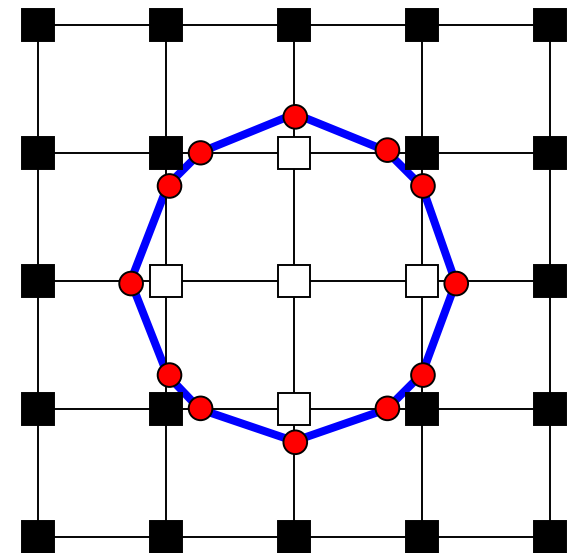
$$t = \frac{f_0}{f_0 - f_1}$$

$$x = x_0 + t(x_1 - x_0)$$

$$y = y_0 + t(y_1 - y_0)$$

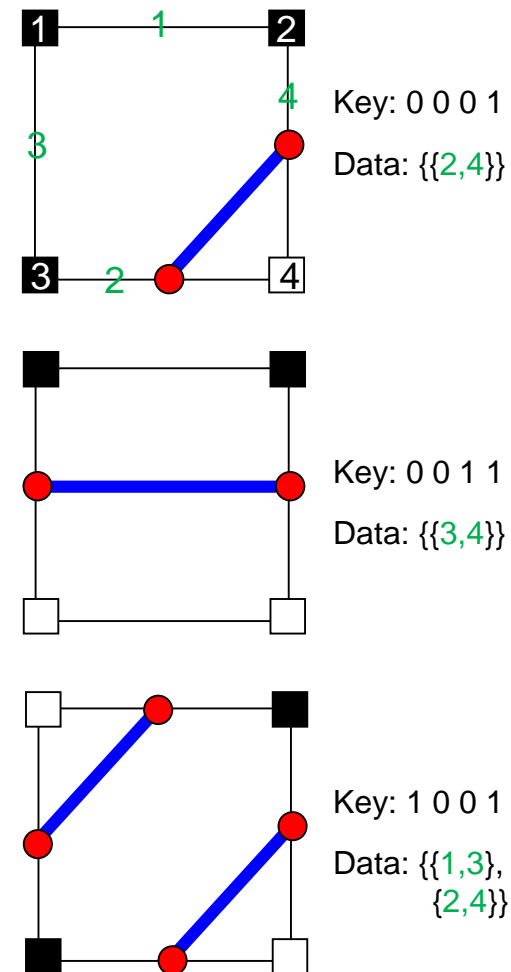
# Marching Squares (2D)

- For each grid **cell** with a sign change
  - Create one vertex on each grid edge with a sign change
  - Connect vertices by lines



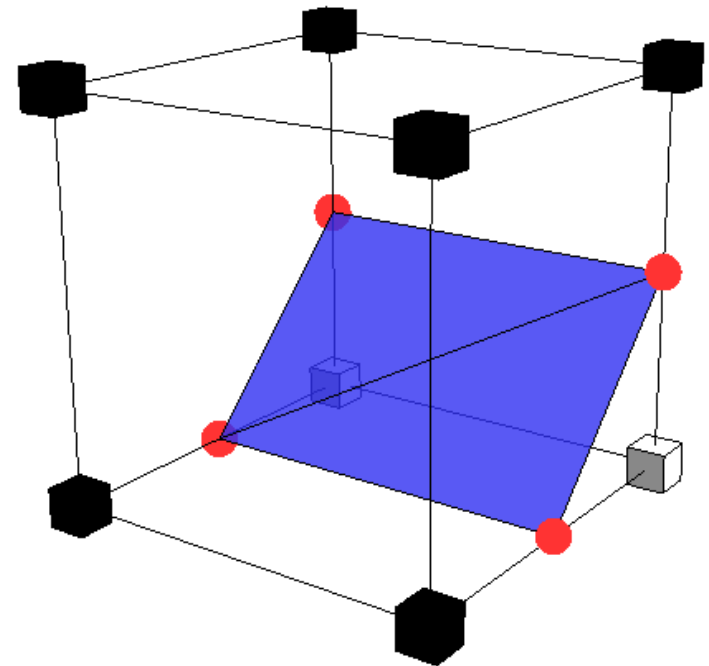
# Marching Squares (2D)

- Connecting vertices by lines
  - Lines shouldn't intersect
  - Each vertex is used once
    - So that it will be used exactly twice by the two cells incident on the edge
- Two approaches
  - Do a walk around the grid cell
    - Connect consecutive pair of vertices
  - Or, using a pre-computed look-up table
    - $2^4=16$  sign configurations
    - For each sign configuration, it stores the indices of the grid edges whose vertices make up the lines.



# Marching Cubes (3D)

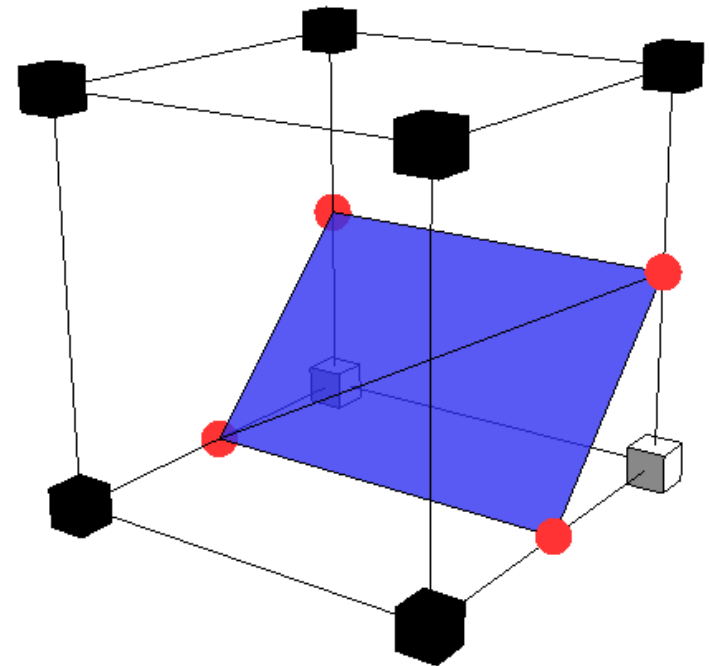
- For each grid **cell** with a sign change
  - Create one vertex on each grid edge with a sign change
  - Connect vertices into **triangles**





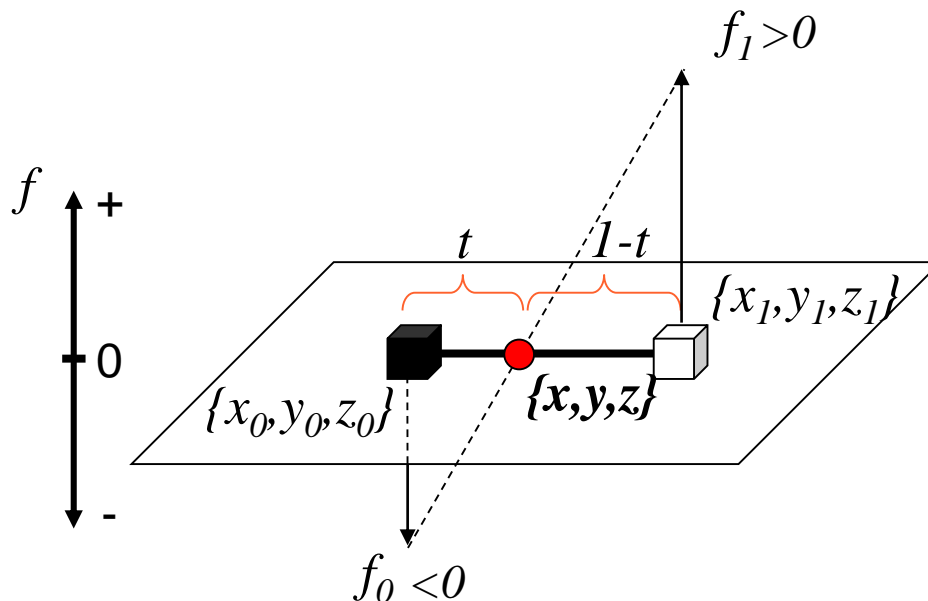
# Marching Cubes (3D)

- For each grid **cell** with a sign change
- ➔
- Create one vertex on each grid edge with a sign change
  - Connect vertices into **triangles**



# Marching Cubes (3D)

- Creating vertices: linear interpolation
  - Assuming the underlying, continuous function is linear on the grid edge
  - Find the zero-crossing between the function and the grid edge



$$t = \frac{f_0}{f_0 - f_1}$$

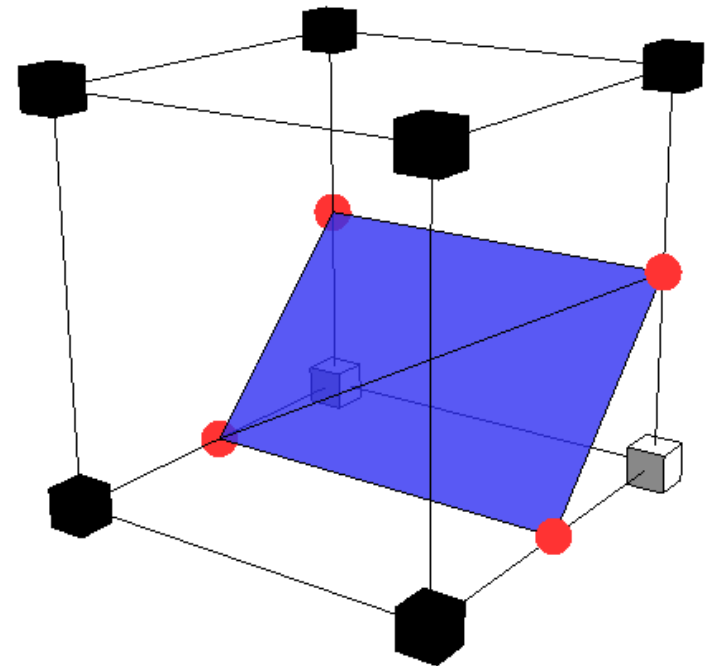
$$x = x_0 + t(x_1 - x_0)$$

$$y = y_0 + t(y_1 - y_0)$$

$$z = z_0 + t(z_1 - z_0)$$

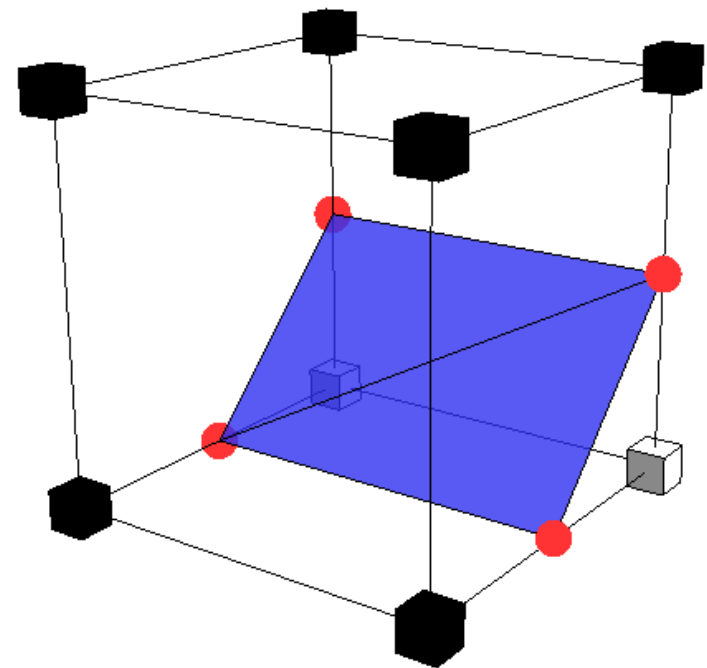
# Marching Cubes (3D)

- For each grid **cell** with a sign change
  - Create one vertex on each grid edge with a sign change
  - — Connect vertices into **triangles**



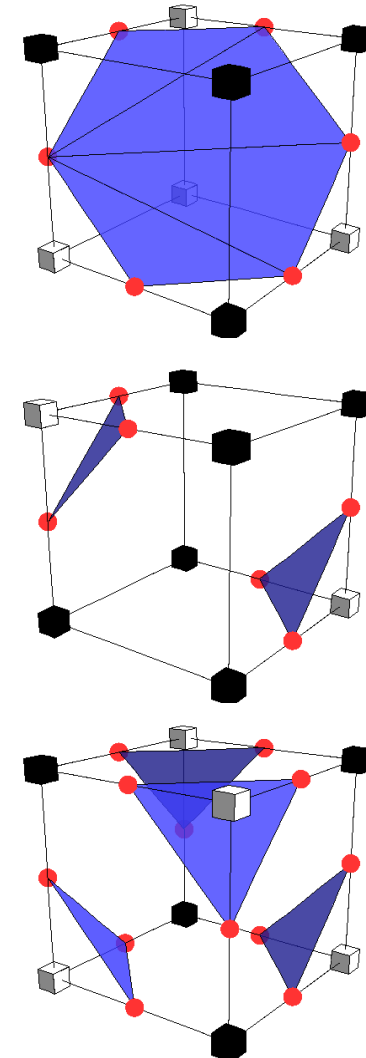
# Marching Cubes (3D)

- Connecting vertices by triangles
  - Triangles shouldn't intersect
  - To be a closed manifold:
    - Each vertex used by a triangle “fan”
    - Each mesh edge used by 2 triangles (if inside grid cell) or 1 triangle (if on a grid face)



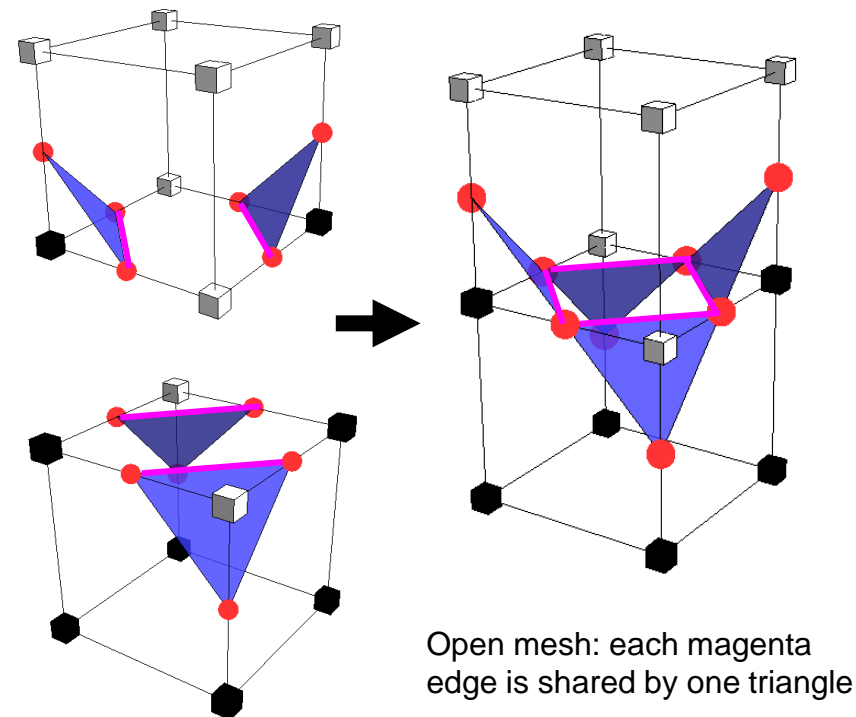
# Marching Cubes (3D)

- Connecting vertices by triangles
  - Triangles shouldn't intersect
  - To be a closed manifold:
    - Each vertex used by a triangle “fan”
    - Each mesh edge used by 2 triangles (if inside grid cell) or 1 triangle (if on a grid face)



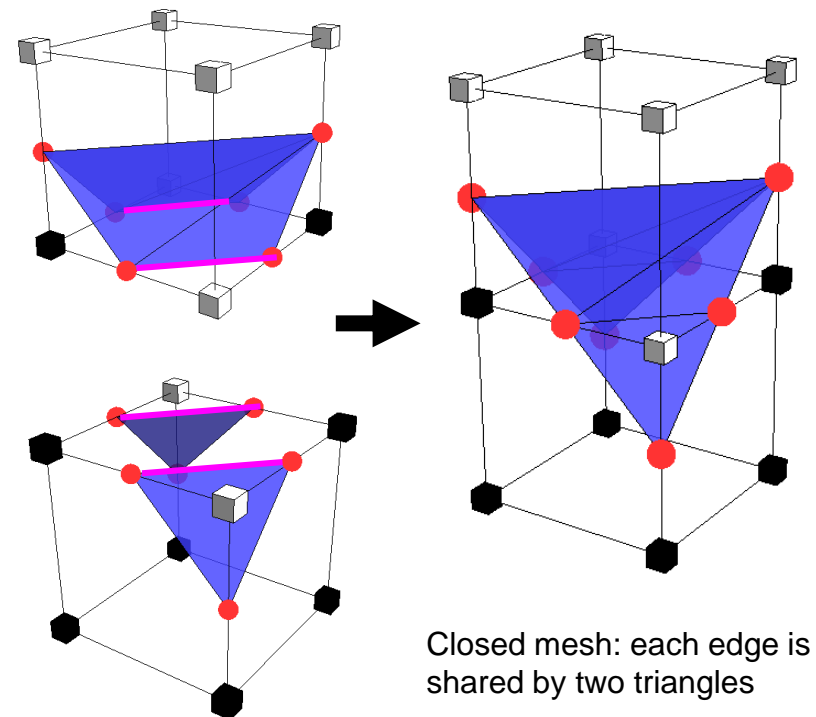
# Marching Cubes (3D)

- Connecting vertices by triangles
  - Triangles shouldn't intersect
  - To be a closed manifold:
    - Each vertex used by a triangle "fan"
    - Each mesh edge used by 2 triangles (if inside grid cell) or 1 triangle (if on a grid face)



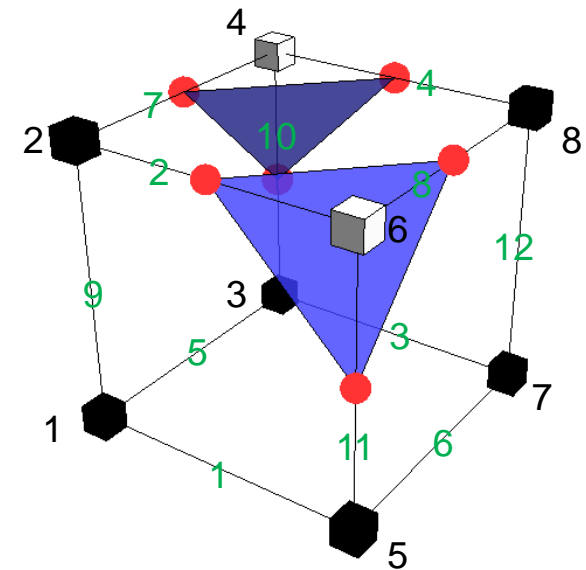
# Marching Cubes (3D)

- Connecting vertices by triangles
  - Triangles shouldn't intersect
  - To be a closed manifold:
    - Each vertex used by a triangle “fan”
    - Each mesh edge used by 2 triangles (if inside grid cell) or 1 triangle (if on a grid face)
    - Each mesh edge on the grid face is **shared** between adjacent cells



# Marching Cubes (3D)

- Connecting vertices by triangles
  - Triangles shouldn't intersect
  - To be a closed manifold:
    - Each vertex used by a triangle “fan”
    - Each mesh edge used by 2 triangles (if inside grid cell) or 1 triangle (if on a grid face)
    - Each mesh edge on the grid face is **shared** between adjacent cells
- Look-up table
  - $2^8=256$  sign configurations
  - For each sign configuration, it stores indices of the grid edges whose vertices make up the triangles



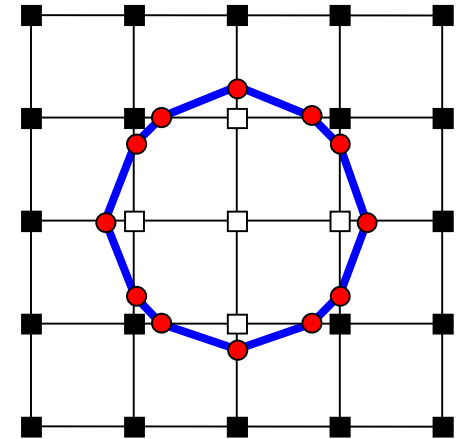
Sign: “0 0 0 1 0 1 0 0”

Triangles:  $\{\{2, 8, 11\}, \{4, 7, 10\}\}$

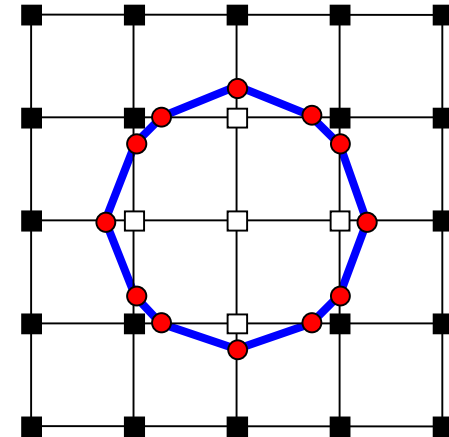


# Implementation Notes

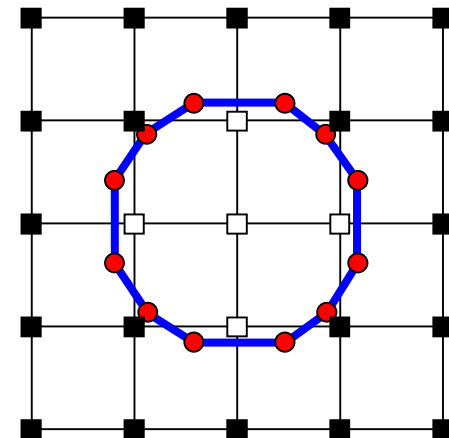
- Avoid computing one vertex multiple times
  - Compute the vertex location once, and store it in a hash table
- If the grid point's value is the iso-value
  - Treat it either as “above” or “below”, but be consistent.



- Primal methods
  - Marching Squares (2D), Marching Cubes (3D)
  - Placing vertices on **grid edges**

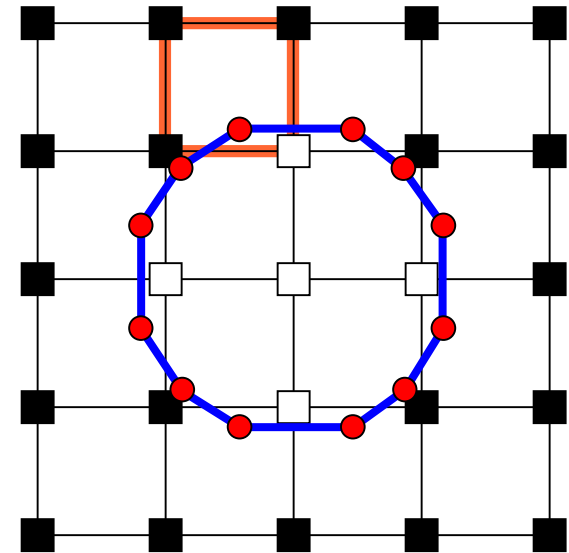


- Dual methods
  - Dual Contouring (2D,3D)
  - Placing vertices in **grid cells**



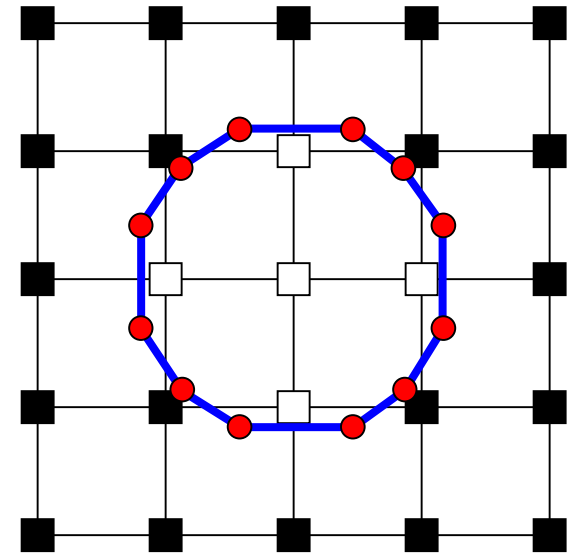
# Dual Contouring (2D)

- For each grid **cell** with a sign change
  - Create one vertex
- For each grid **edge** with a sign change
  - Connect the two vertices in the adjacent cells with a line segment



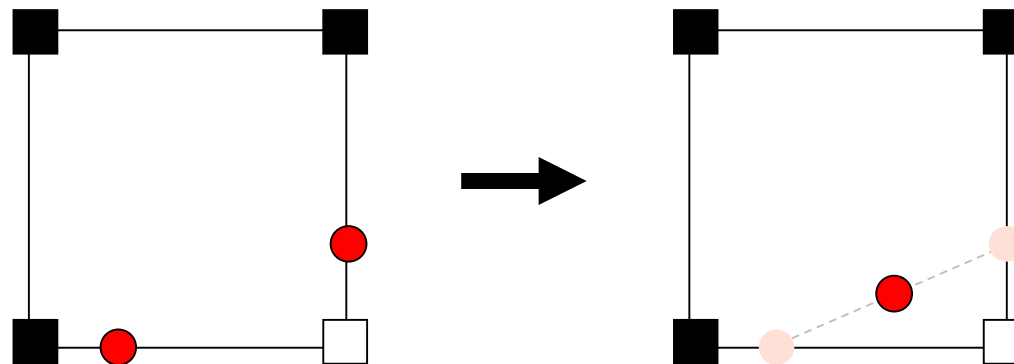
# Dual Contouring (2D)

- For each grid **cell** with a sign change
  - Create one vertex
- For each grid **edge** with a sign change
  - Connect the two vertices in the adjacent cells with a line segment



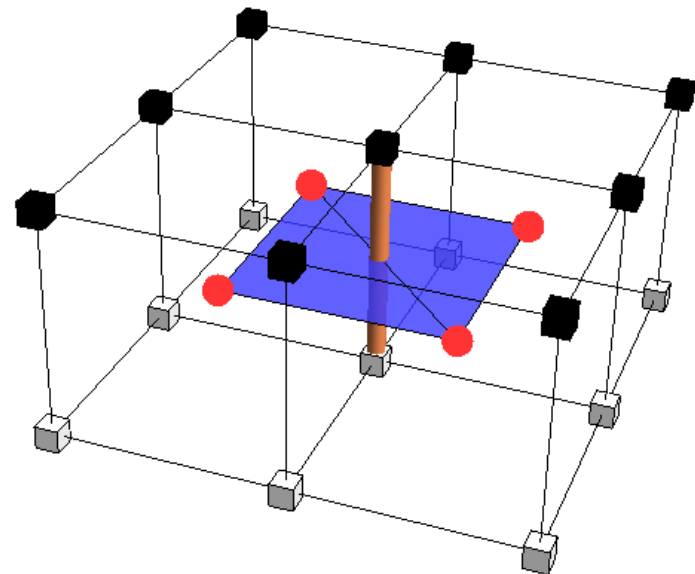
# Dual Contouring (2D)

- Creating the vertex within a cell
  - Compute one point on each grid edge with a sign change (by linear interpolation, as in Marching Squares)
  - Take the centroid of these points



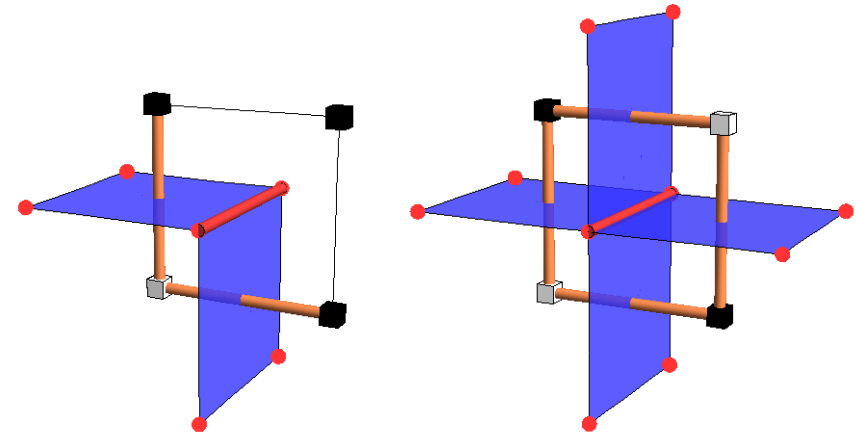
# Dual Contouring (3D)

- For each grid **cell** with a sign change
  - Create one vertex (same way as 2D)
- For each grid **edge** with a sign change
  - Create a quad (or two triangles) connecting the four vertices in the adjacent grid cubes
  - No look-up table is needed!



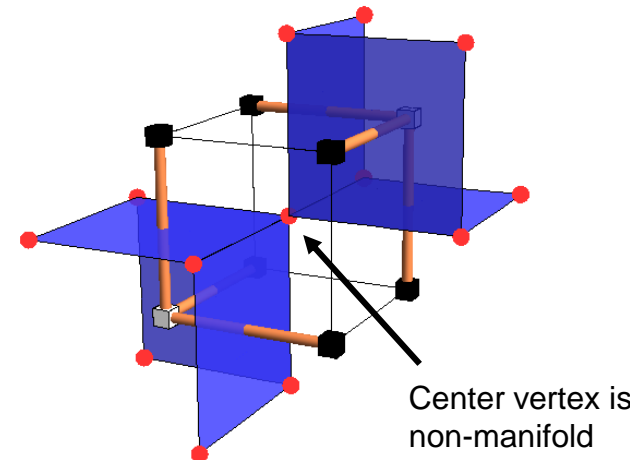
# Dual Contouring: Discussion

- Closed
  - Each mesh edge is shared by even number of quads
- Possibly non-manifold
  - An edge may be shared by 4 quads
  - A vertex may be shared by 2 rings of quads
- Can be fixed
  - But with more effort (e.g., multiple vertices per cell)



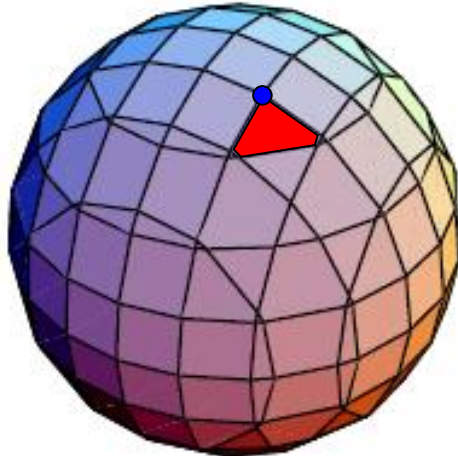
Red edge is shared by 2 quads

Red edge is shared by 4 quads (non-manifold)

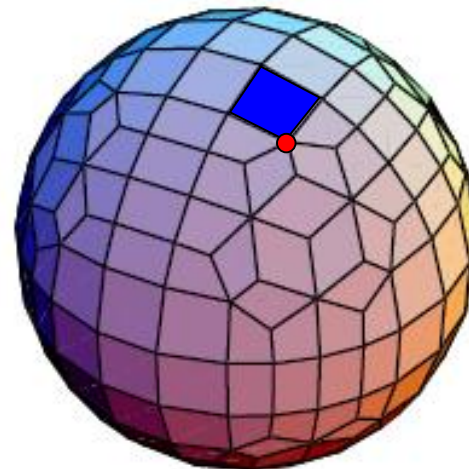


# Duality

- The two outputs have a dual structure
  - Vertices and quads of Dual Contouring correspond (roughly) to untriangulated polygons and vertices produced by Marching Cubes



Marching Cubes

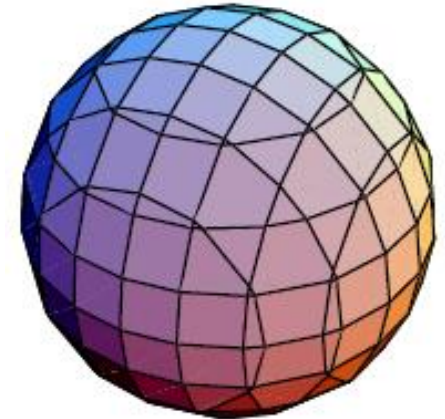


Dual Contouring

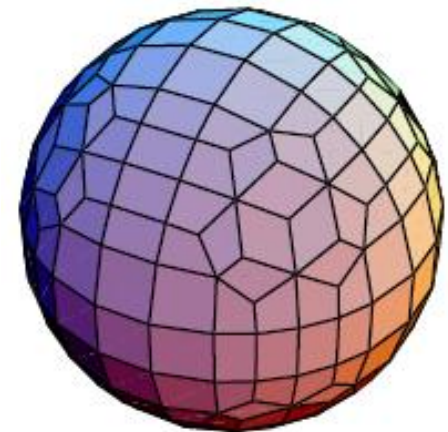


# Primal vs. Dual

- Marching Cubes
  - ✓ Always manifold
  - ✗ Requires look-up table in 3D
  - ✗ Often generates thin and tiny polygons
- Dual Contouring
  - ✗ Can be non-manifold
  - ✓ No look-up table needed
  - ✓ Generates better-shaped polygons



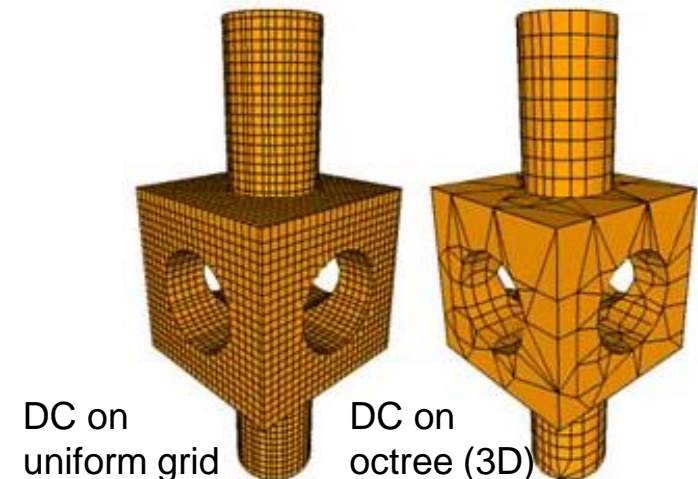
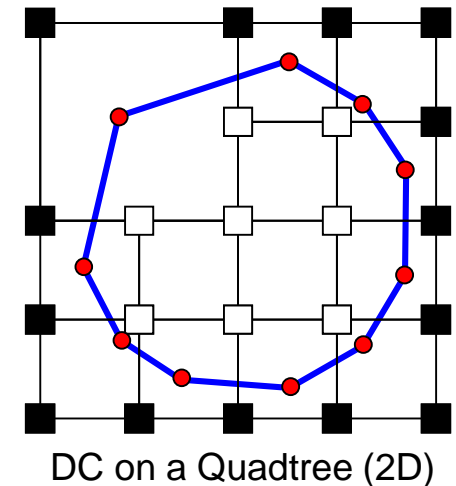
Marching Cubes



Dual Contouring

# Primal vs. Dual

- Marching Cubes
  - ✓ Always manifold
  - ✗ Requires look-up table in 3D
  - ✗ Often generates thin and tiny polygons
  - ✗ Restricted to uniform grids
- Dual Contouring
  - ✗ Can be non-manifold
  - ✓ No look-up table needed
  - ✓ Generates better-shaped polygons
  - ✓ Can be applied to any type of grid



# Further Readings

---

- Marching Cubes:
  - “*Marching cubes: A high resolution 3D surface construction algorithm*”, by Lorensen and Cline (1987)
    - >14000 citations on Google Scholar
  - “*A survey of the marching cubes algorithm*”, by Newman and Yi (2006)
- Dual Contouring:
  - “*Dual contouring of hermite data*”, by Ju et al. (2002)
    - >700 citations on Google Scholar
  - “*Manifold dual contouring*”, by Schaefer et al. (2007)