

CSE528 Computer Graphics: Theory, Algorithms, and Applications

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Introduction to Geometric Modeling

- **What is geometric modeling**
 - Representation of existing objects (mathematical tools to represent shape geometry of real-world objects, both natural and manufactured ones)
 - Reverse engineering (from physical prototypes to digital prototypes)
 - Design of new objects (shape editing, deformation, manipulation)
 - Rendering - leading to visual interpretation
- **Application of geometric modeling**
 - Graphics, CAD, CAGD, CAM/CAE, robotics, vision, virtual reality, scientific visualization, animation, physical simulation, computer games, etc.

Geometry Representations

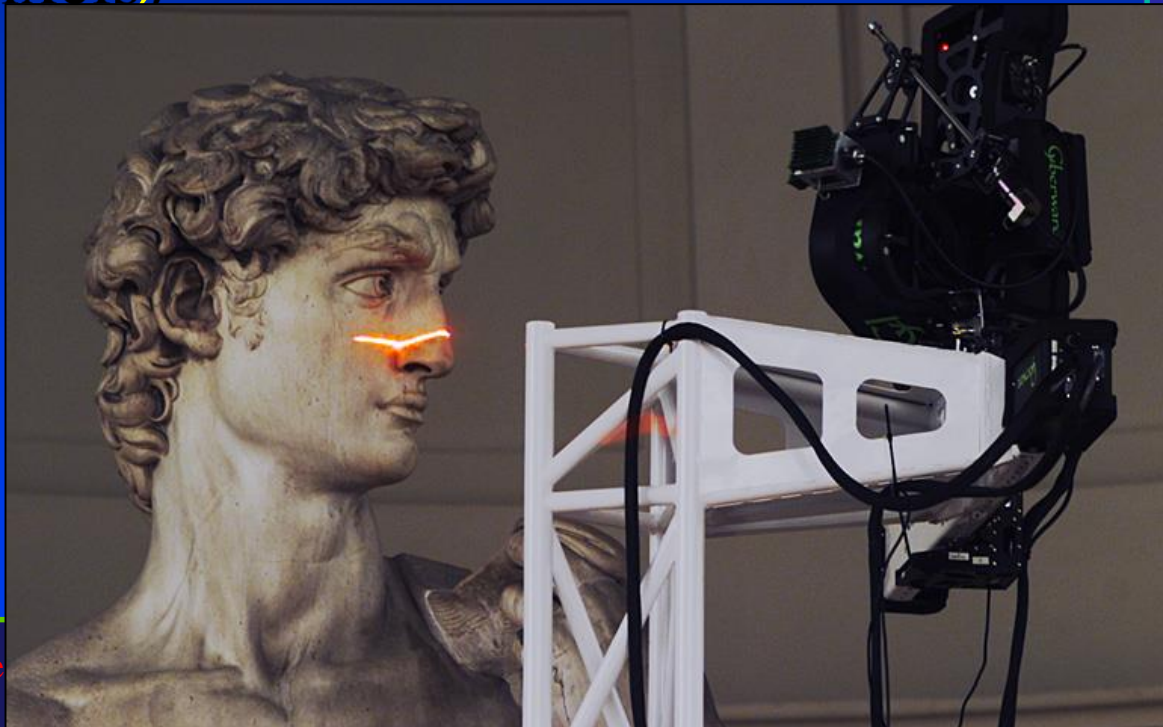
- **Various strengths and weaknesses**
 - Ease of use for design
 - Ease/speed for rendering
 - Simplicity
 - Smoothness
 - Collision detection
 - Flexibility (in more than one sense)
 - Suitability for simulation, and *many others...*

Point-based Graphics

- Modeling
- Rendering
- Animation / Simulation (Physics-based modeling)

Data Acquisition

- Laser scanners – obtaining millions to billions of points (x, y, z coordinates)
- Consider regular images – a few million pixels
- More points (than pixels)



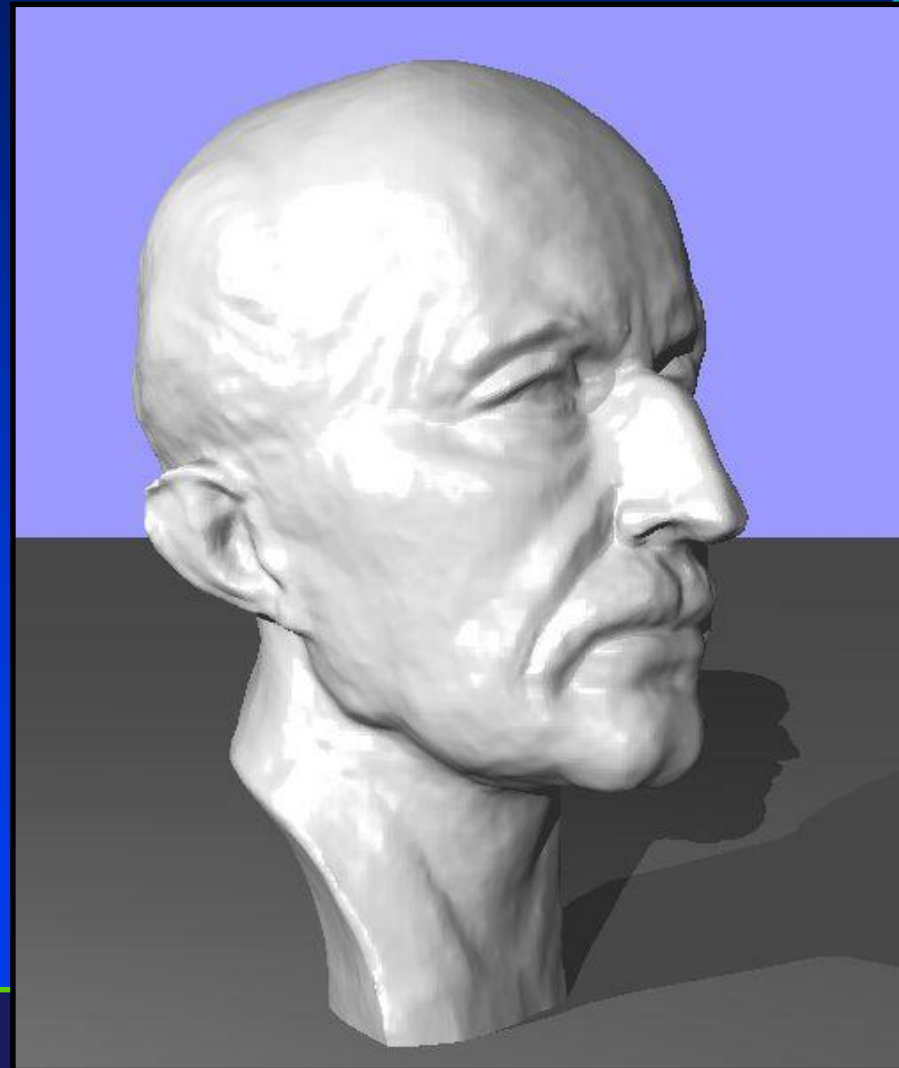
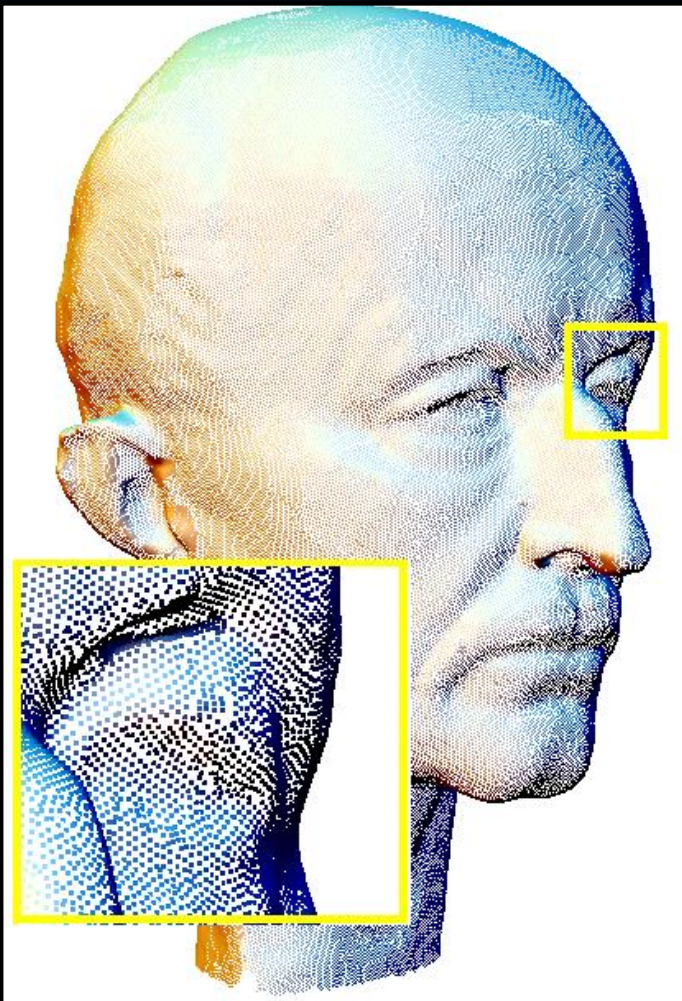
Point-based Graphics

- **Laser scanners**
 - Millions to *billions* of points
- **Typical image**
 - At most a few million pixels
- **More points than pixels...**

Point-based Graphics

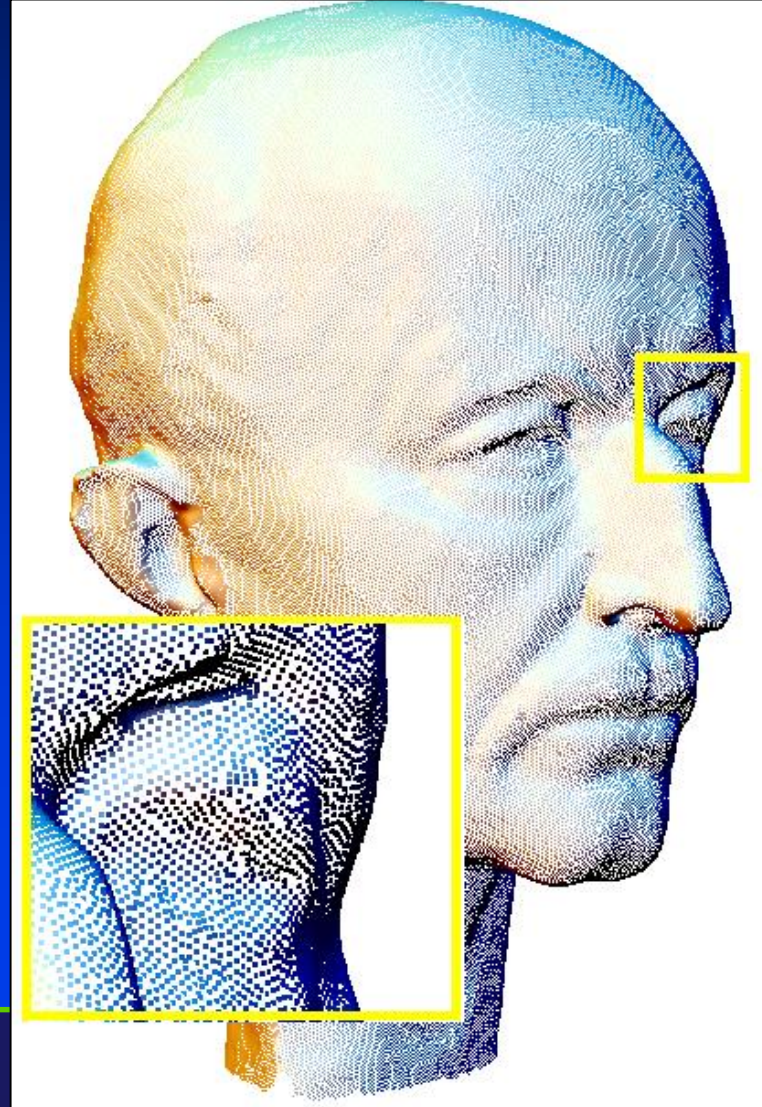
- **Surfaces represented only by points**
 - There are also normals (in addition to (x,y,z) coordinates)
 - No topology – no connectivity information
- **How can we do**
 - Rendering
 - Modeling operations
 - Simulation

Point-based Surface Descriptions



Point Rendering

- For each point draw a little “splat”
 - Use associated normal for shading
 - Possibly apply texture
- If “splats” are small compared to spacing then gaps result
- Splatting too many points would waste time

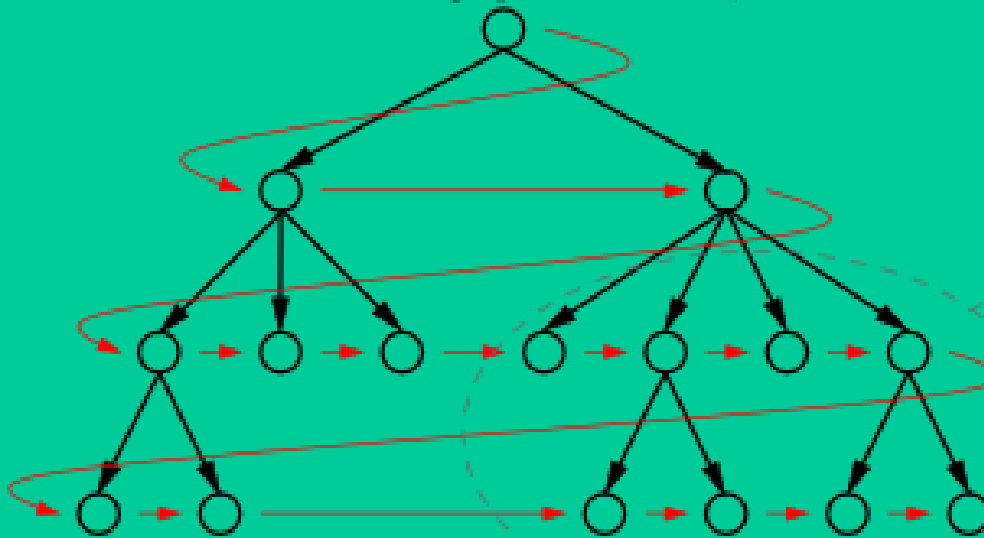


Rendering

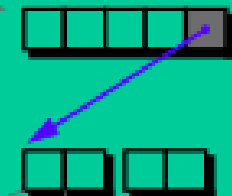
- “QSplat” algorithm
 - Build hierarchical tree of the points
 - Use bounding spheres to estimate size of clusters
 - Render clusters based on screen size
 - Use cluster-normals for internal nodes

Rendering – Qsplat Algorithm

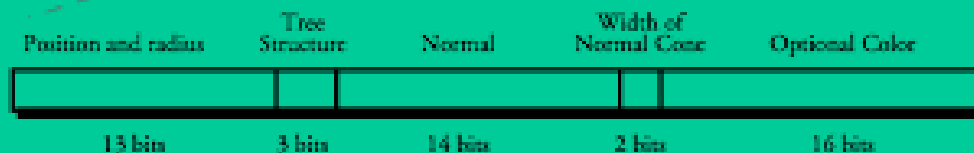
(a) Bounding Sphere Hierarchy



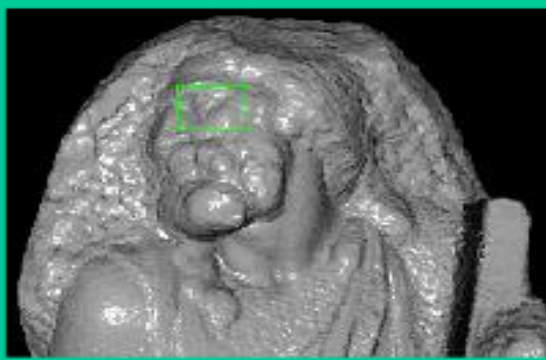
(b) File Layout for Circled Nodes at Left



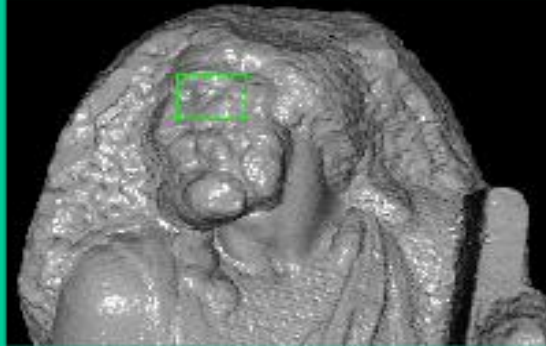
(c) Node Layout



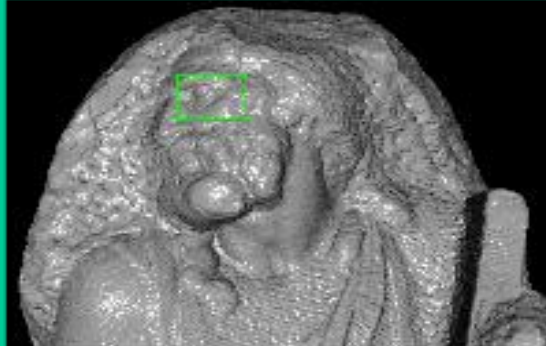
Rendering



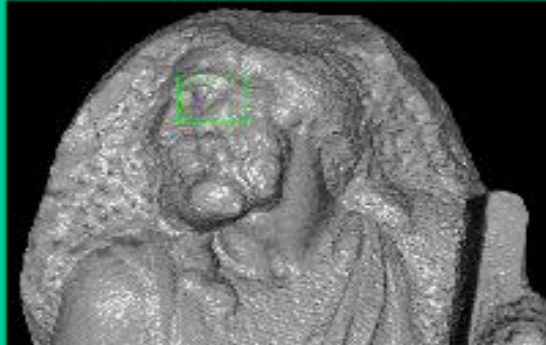
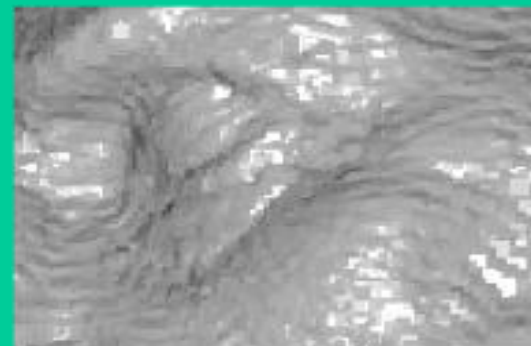
15-pixel cutoff
130,712 points
132 ms



10-pixel cutoff
259,975 points
215 ms



5-pixel cutoff
1,017,149 points
722 ms



1-pixel cutoff
14,835,967 points
8308 ms

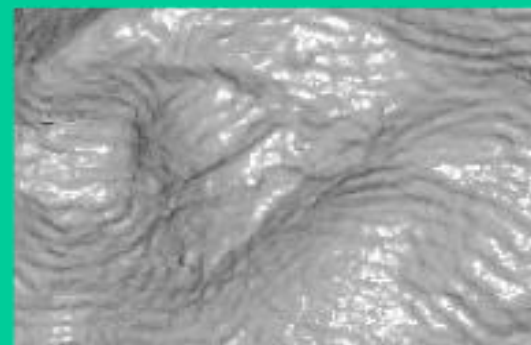
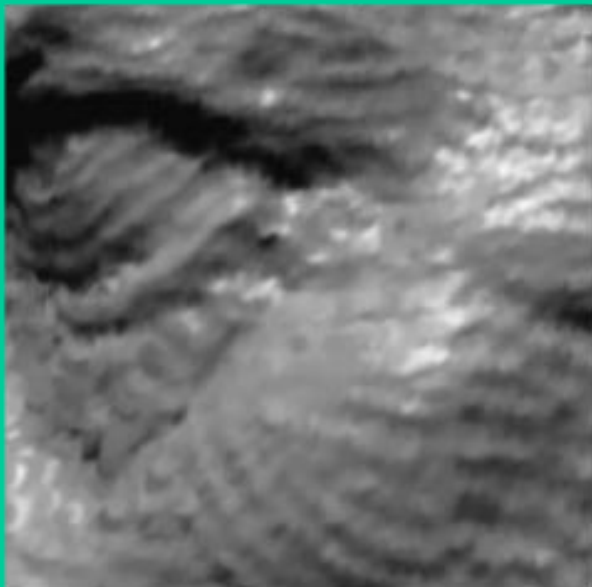
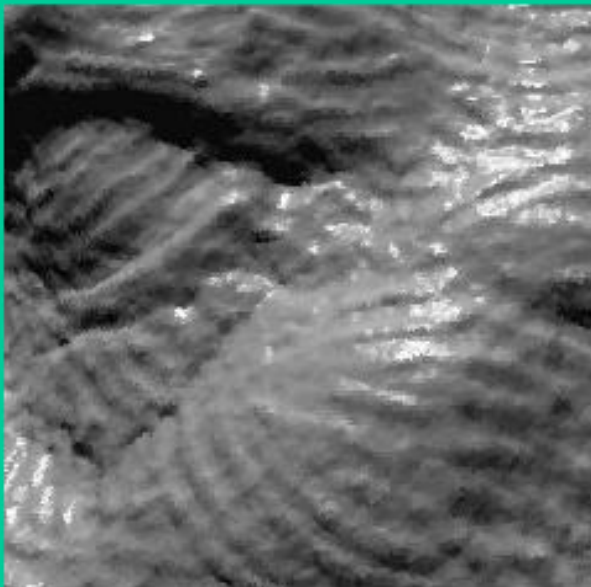
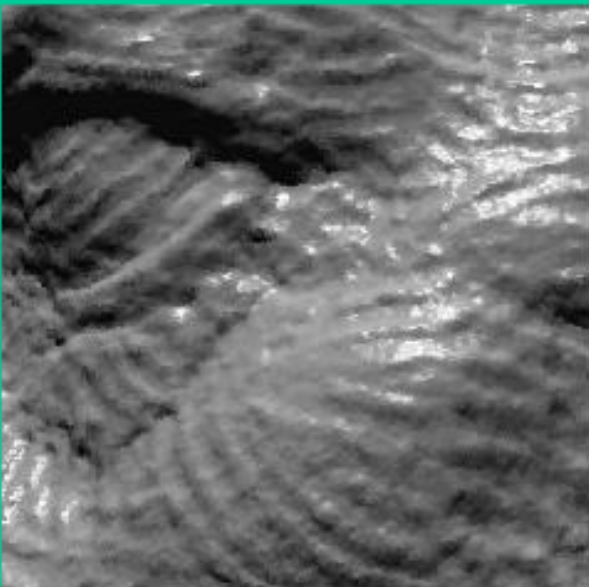
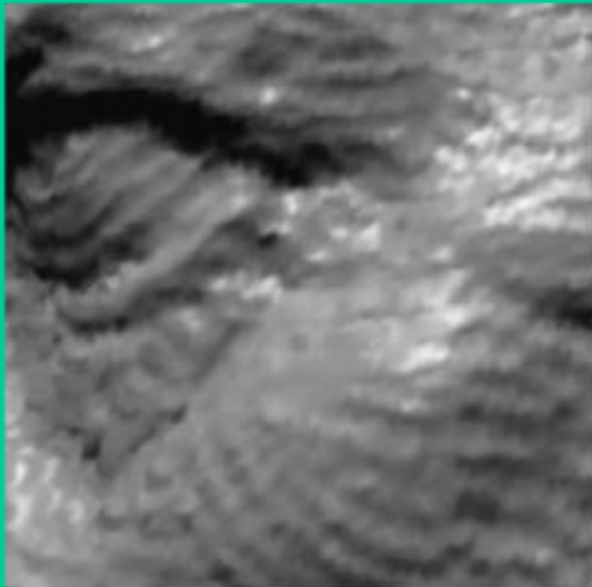
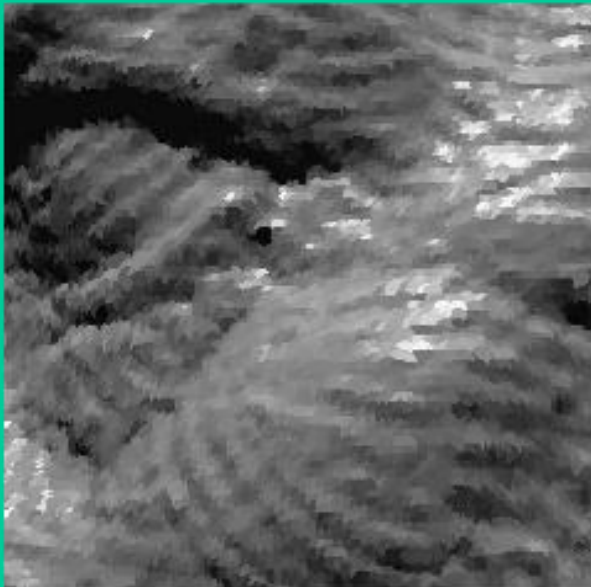
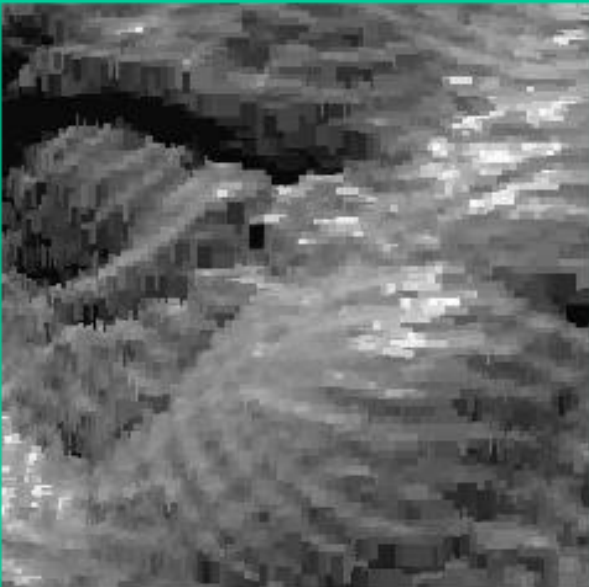


Image Denoising



Rendering



Rendering



(a)
Points



(b)
Polygons – same number of primitives as (a)
Same rendering time as (a)



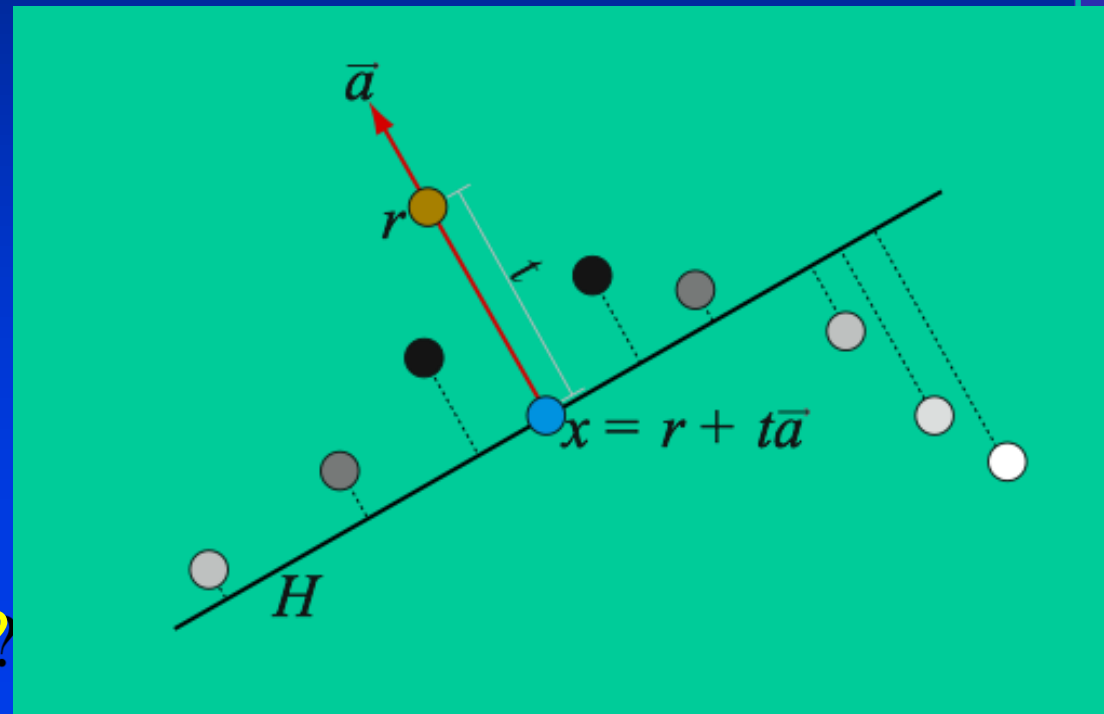
(c)
Polygons – same number of vertices as (a)
Twice the rendering time of (a)

Defining a Point Cloud Surface

- Modeling a point-cloud surface
- Two related methods
 - Surface is a point attractor
 - Point-set surfaces
 - Implicit surface
 - Multi-level Partition of Unity Implicits
 - Implicit Moving Least-Squares

Point-Set Surfaces

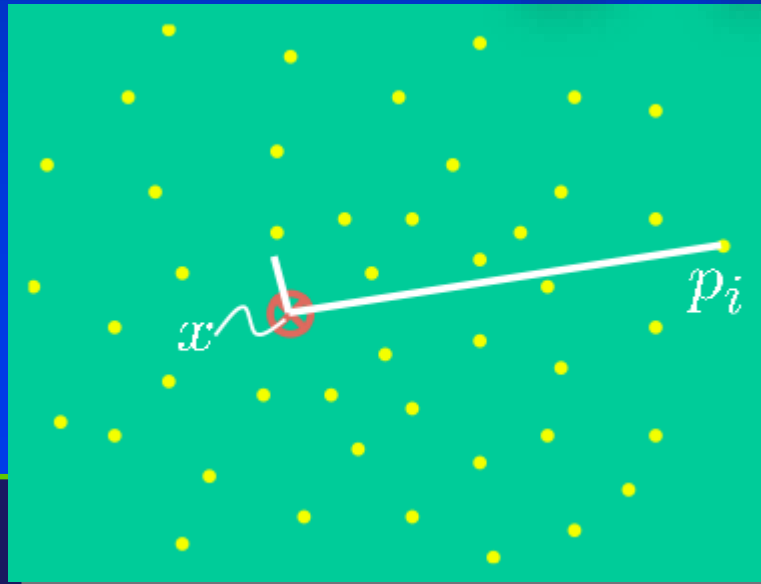
- Surface is the attractor of a repeated projection process
 - Find nearby points
 - Fit plane (weighted)
 - Project into plane
 - Repeat
- Does it converge?
- How to weight points?



Standard Least-Squares Fitting

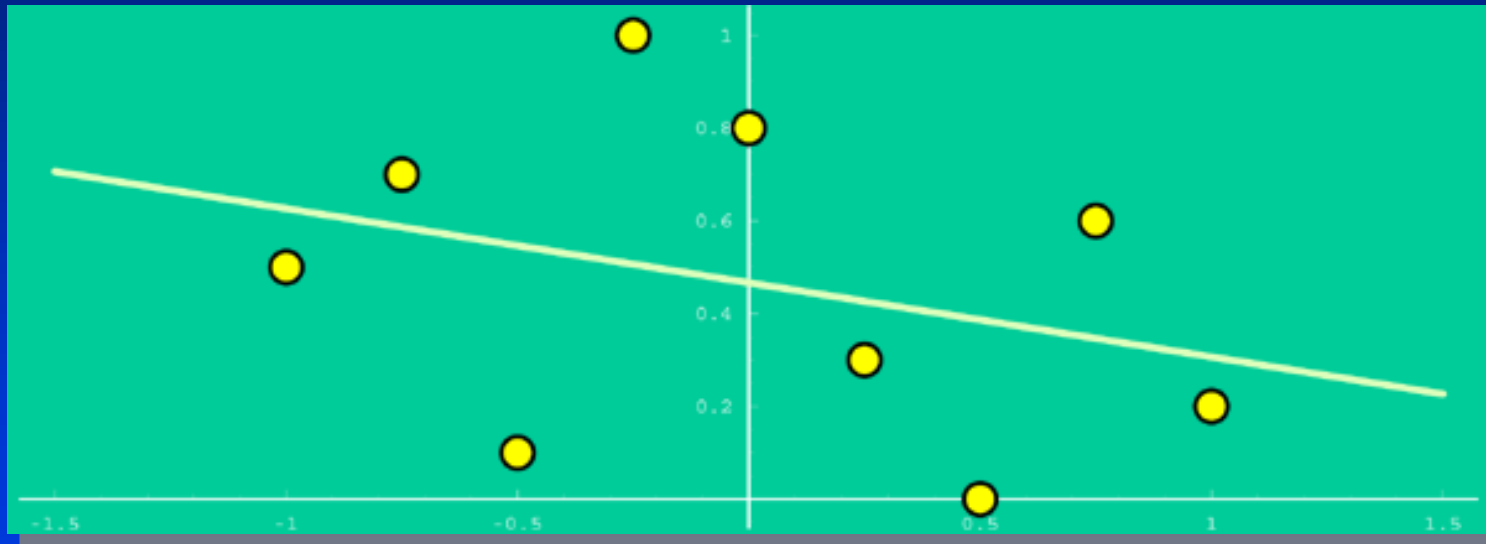
$$\begin{bmatrix} b^\top(p_1) \\ \vdots \\ b^\top(p_N) \end{bmatrix} c = \begin{bmatrix} \phi_1 \\ \vdots \\ \phi_N \end{bmatrix}$$

$$B^\top B c = B^\top \phi$$

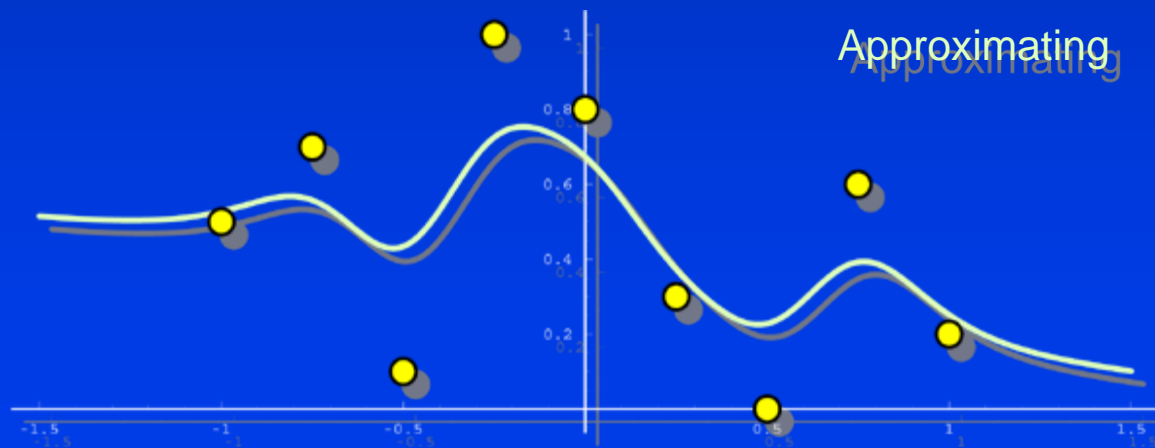
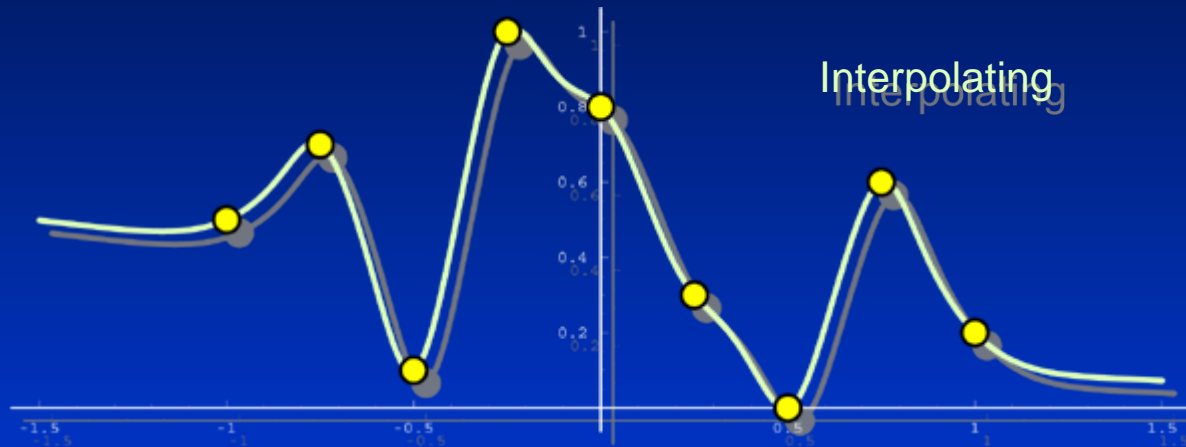


Moving Least-Square Interpolation

Least Squares



Moving Least-Squares Fitting

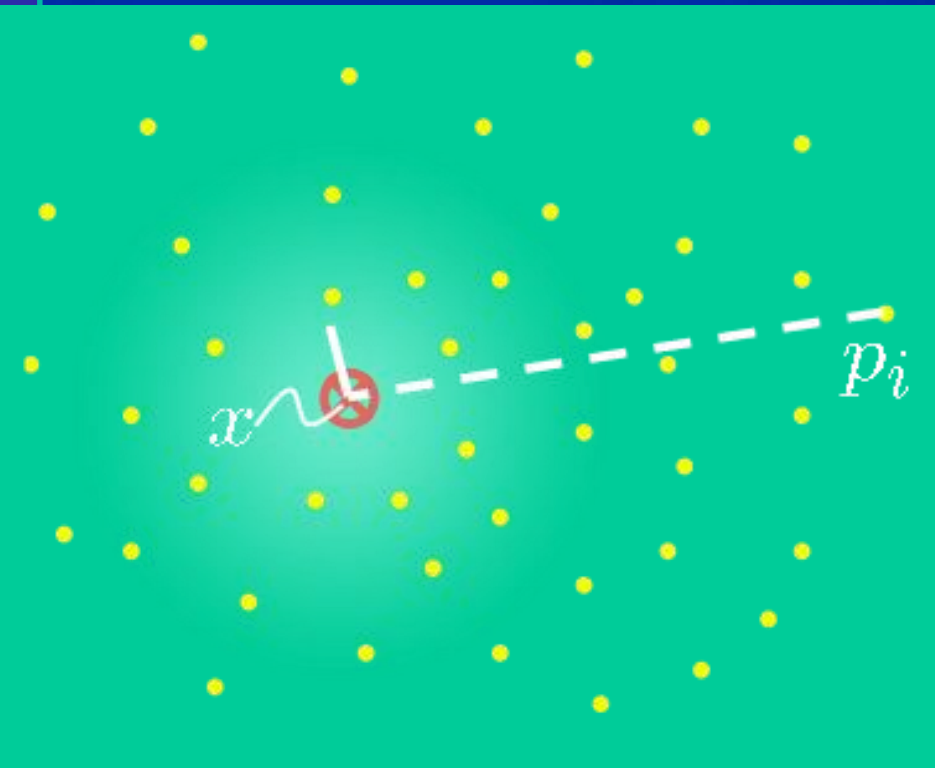


Moving Least-Squares Fitting

$$\begin{bmatrix} w(x, p_1) \\ \vdots \\ w(x, p_N) \end{bmatrix} \begin{bmatrix} b^\top(p_1) \\ \vdots \\ b^\top(p_N) \end{bmatrix} c = \begin{bmatrix} w(x, p_1) \\ \vdots \\ w(x, p_N) \end{bmatrix} \begin{bmatrix} \phi_1 \\ \vdots \\ \phi_N \end{bmatrix}$$

$$w(r) = \frac{1}{(r^2 + \epsilon^2)}$$

$$B^\top (W(x))^2 B c(x) = B^\top (W(x))^2 \phi$$



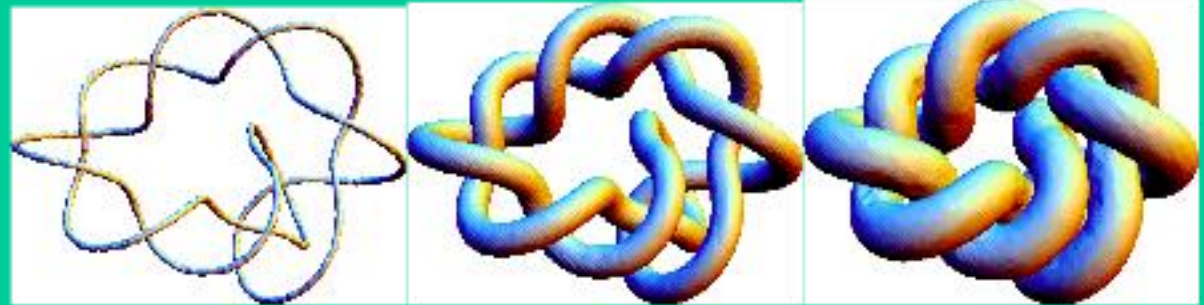
Editing Operations

- **Implicit functions can be**
 - Combined with booleans for CSG
 - Warped
 - Offset
 - Composed
 - And more....



Editing Operations

- **Implicit functions can be**
 - Combined with Booleans for CSG
 - Warped
 - Offset
 - Composed
 - And more....



$f = 0.025$

$f = 0$

$f = -0.025$



$f = -0.075, \alpha = 0.75$



$f = -0.075, \alpha = 1.0$

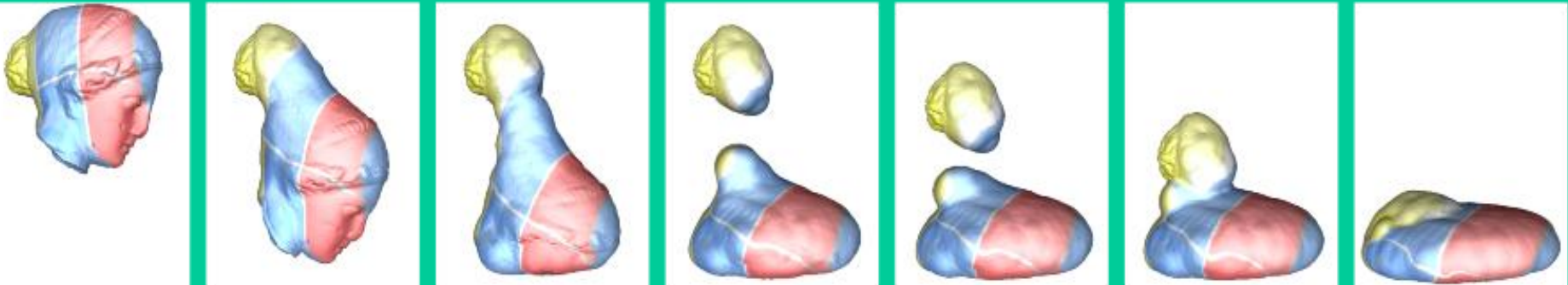
Editing Operations

- **Implicit functions can be**
 - Combined with Booleans for CSG
 - Warped
 - Offset
 - Composed
 - And more....



Point-based Simulation

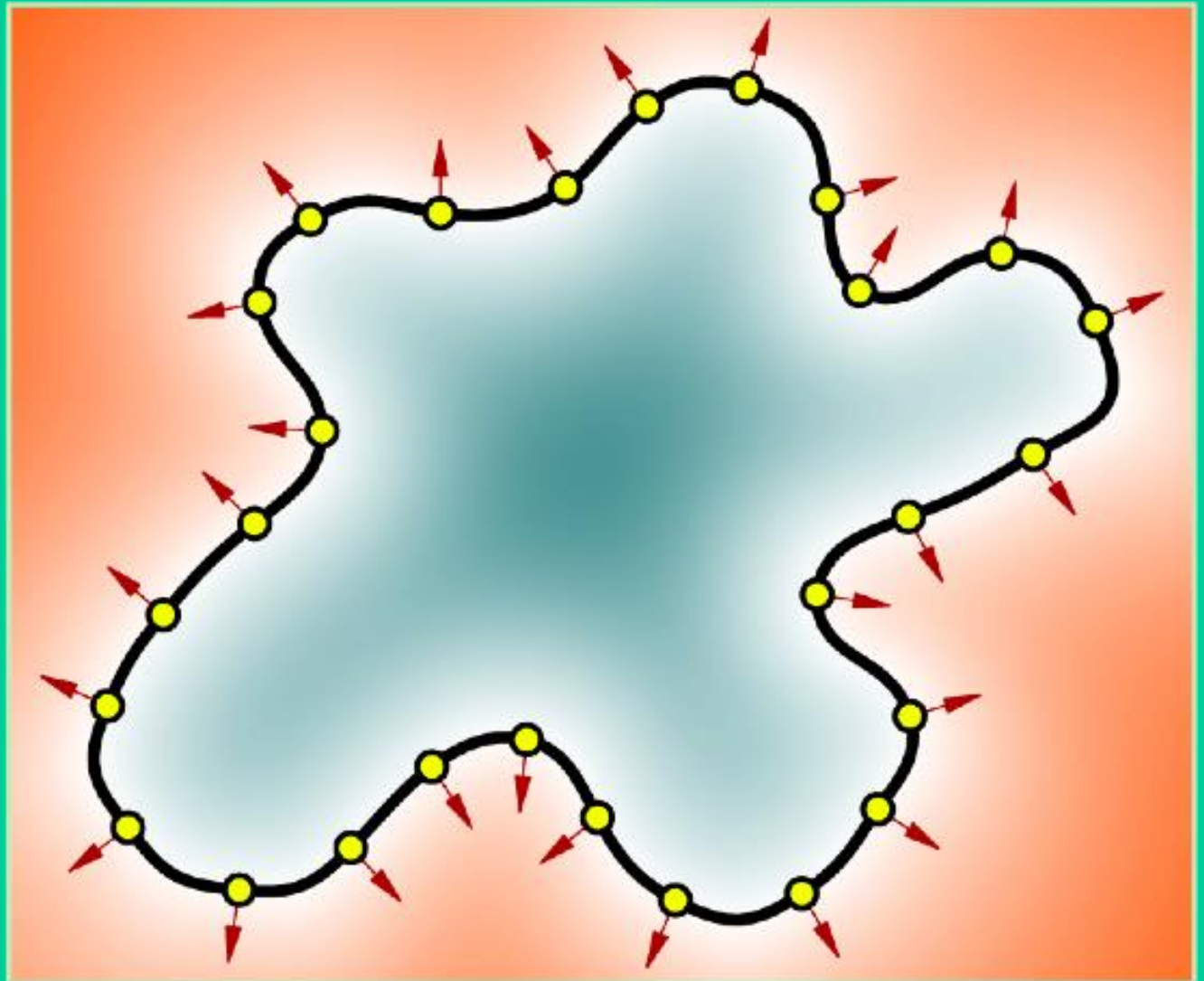
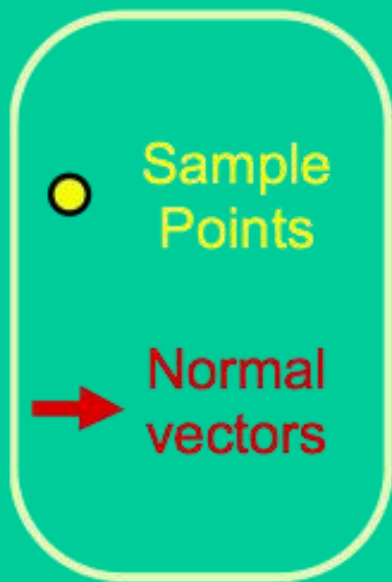
- MLS originated in mechanics literature
- Natural use in graphics for the animation purpose



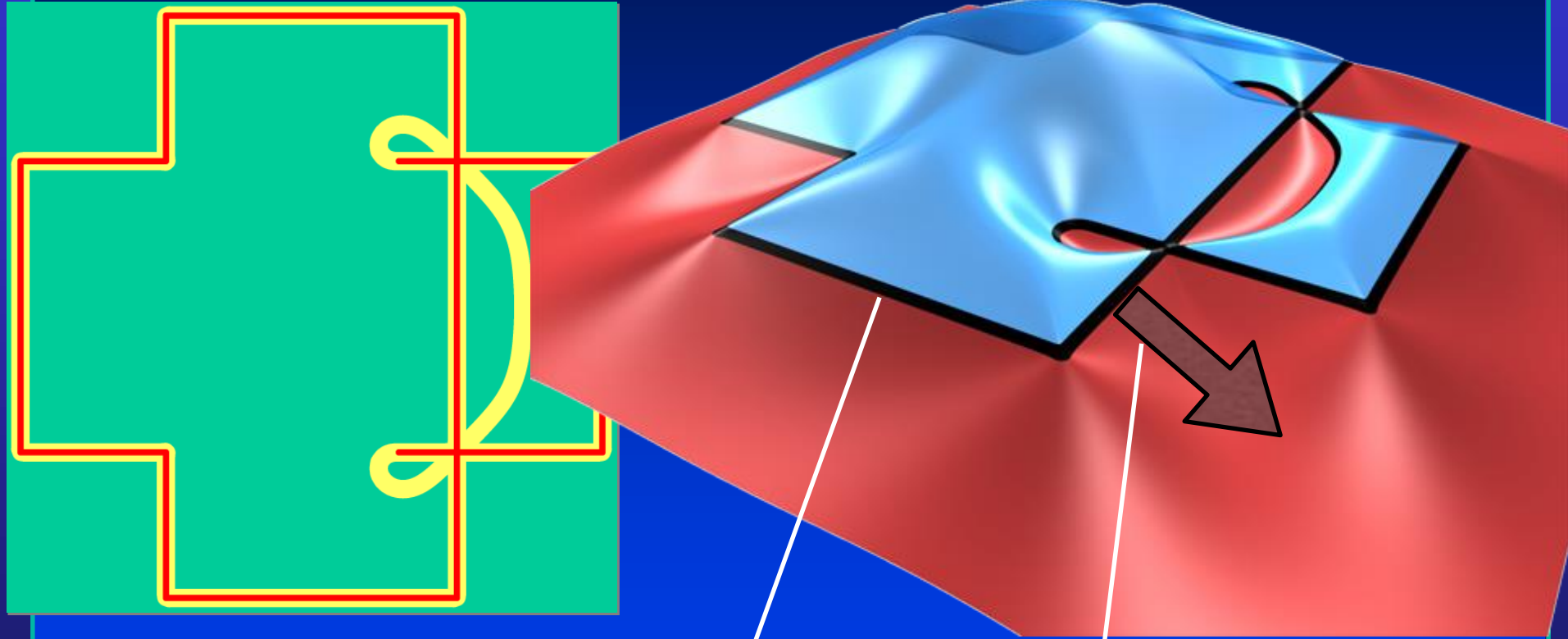
Implicit Moving Least-Squares

- Shape (surface) is implicitly defined by point cloud
- Define a scalar function that is zero passing through all the points

Implicit Moving Least-Squares



Implicit Moving Least-Squares



Function is zero on boundary
Decreases in outward direction

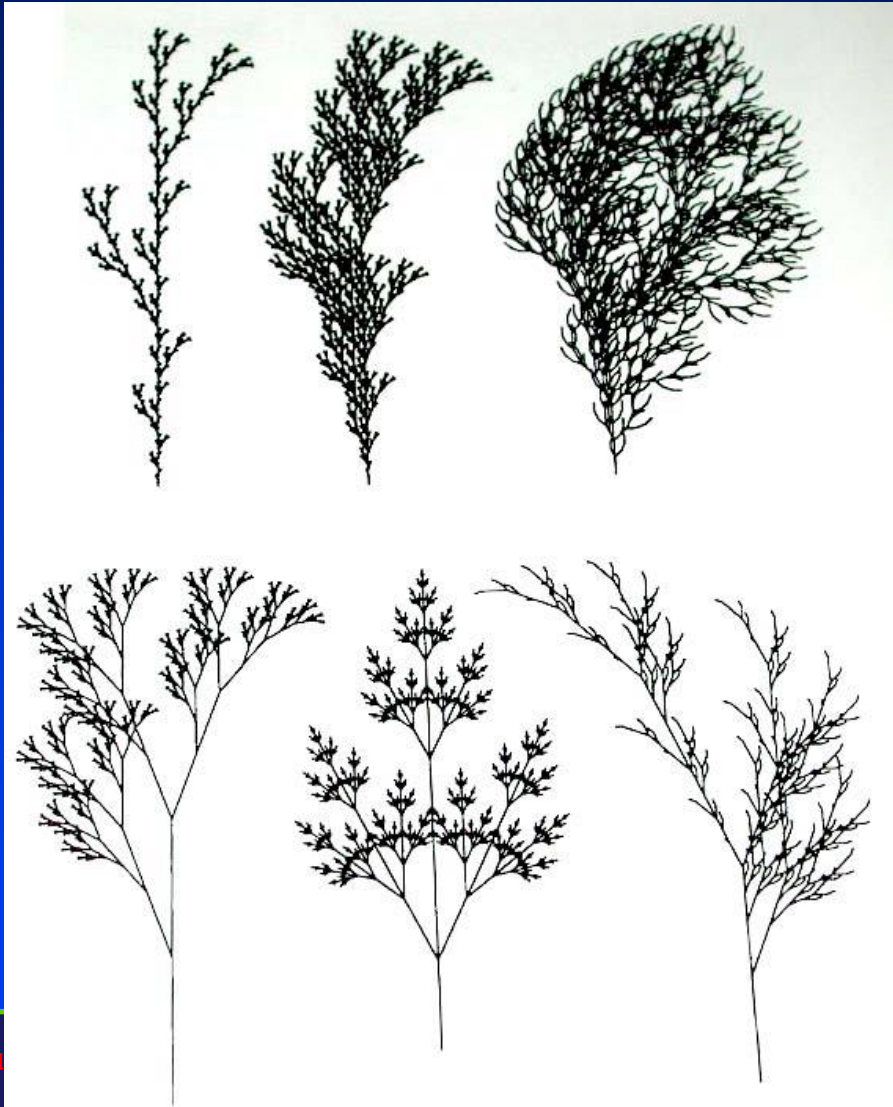
Particles





Algorithmic Primitives

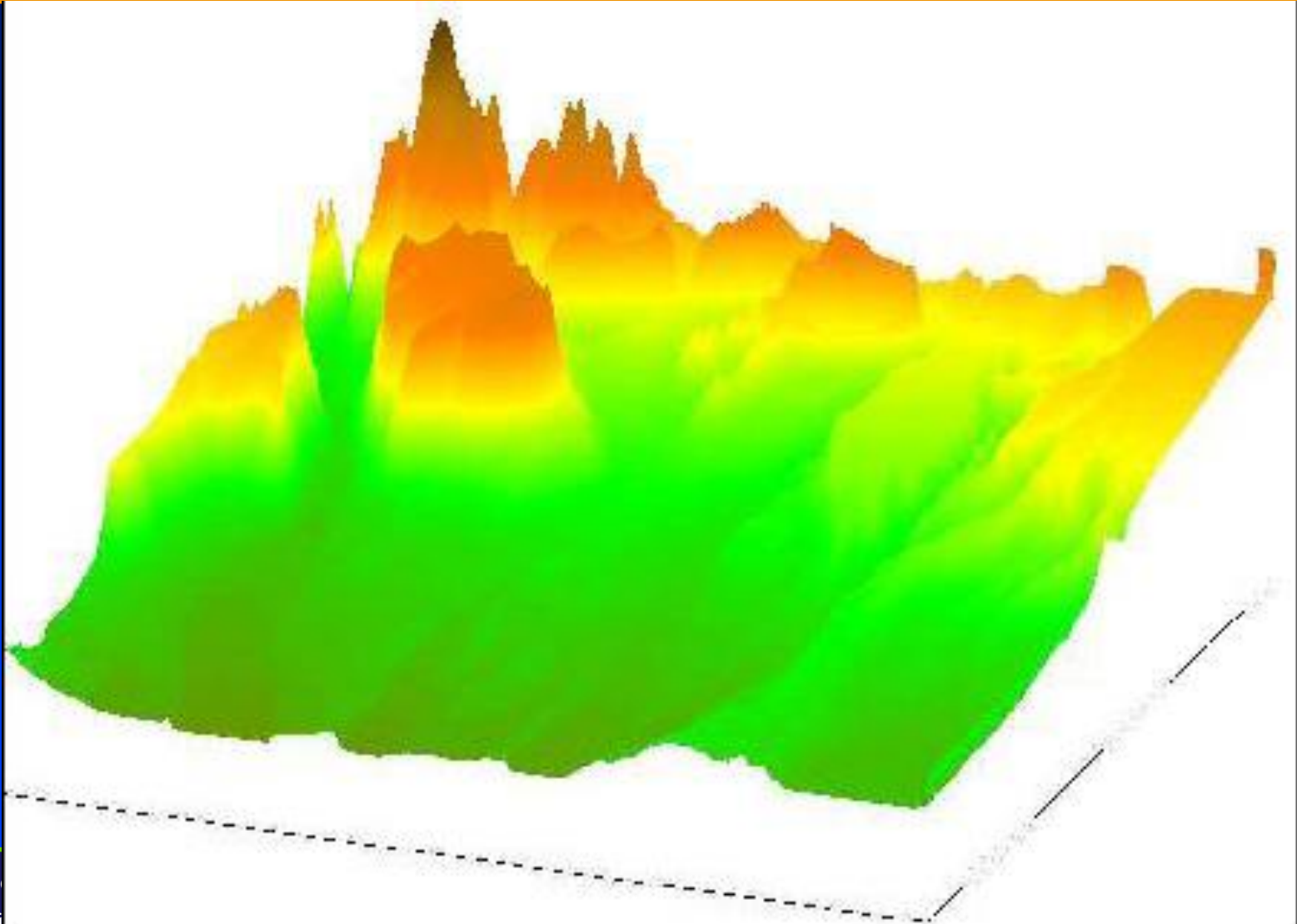
- Algorithms for trees, mountains, grass, fur, lightning, fire, ...



Moving Least Squares

- Theory, and
- Techniques

Scattered Data Fitting



Scattered Data Approximation and Interpolation

- Scattered data: an arbitrary set of points in \mathbb{R}^d space, and these scattered data carry scalar quantities (i.e., a scalar field in d dimensional parametric space)

Least Squares Approximation

- Commonly-used basis functions include: quadratic, linear, constant terms
- For example:

$$\mathbf{b}(\mathbf{x}) = \begin{bmatrix} 1 & x & y & x^2 & xy & y^2 \end{bmatrix}^T$$

$$\mathbf{b}(\mathbf{x}) = \begin{bmatrix} 1 & x & y & z \end{bmatrix}^T$$

$$\mathbf{b}(\mathbf{x}) = \begin{bmatrix} 1 \end{bmatrix}$$

Least Squares Approximation

- Problem statement: we have n points in \mathbb{R}^d space, and we want to obtain a globally defined function $f(\mathbf{x})$ that can approximate the given scalar values at these points in the least-squares sense
- We are considering the space of polynomials of total degree m in d spatial dimensions

$$\min_{f \in P_m^d} \sum_i \left\| (f(x_i) - f_i) \right\|^2$$

$$f(\mathbf{x}) = \mathbf{b}(\mathbf{x})^T \bullet \mathbf{c}$$

$$\mathbf{b}(\mathbf{x}) = [b_1(\mathbf{x}) \quad b_2(\mathbf{x}) \quad \dots \quad b_k(\mathbf{x})]^T$$

$$\mathbf{c} = [c_1 \quad c_2 \quad \dots \quad c_k]^T$$

Solution

- Function minimization: the partial derivatives of the error functional must be set to zero
- We now obtain a linear system of equations

$$\frac{\partial E}{\partial \mathbf{c}} = \mathbf{0}$$

$$\sum_i 2b_j(\mathbf{x}_i) \left[\mathbf{b}(\mathbf{x}_i)^T \mathbf{c} - f_i \right] = 0$$

Solution

$$\sum_i \left[\mathbf{b}(\mathbf{x}_i) \mathbf{b}(\mathbf{x}_i)^T \mathbf{c} - \mathbf{b}(\mathbf{x}_i) f_i \right] = \mathbf{0}$$

$$\mathbf{c} = \left[\sum_i \mathbf{b}(\mathbf{x}_i) \mathbf{b}(\mathbf{x}_i)^T \right]^{-1} \sum_i \mathbf{b}(\mathbf{x}_i) f_i$$

Weighted Least Squares Approximation

- In the weighted least squares formulation, we will have to use a different error functional that now has a weighting function term inside the formulation

$$\min_{f \in P_m^d} \sum_i \theta(\|\bar{\mathbf{x}} - \mathbf{x}_i\|) \| (f(\mathbf{x}_i) - f_i) \|^2$$

Weighting Function Choices

- The weighting function should be locally defined

$$\theta(d) = e^{-\frac{d^2}{h^2}}$$

$$\theta(d) = (1 - d / h)^4 (4d / h + 1)$$

$$\theta(d) = \frac{1}{d^2 + \varepsilon^2}$$

Solution

- Once again, we take partial derivatives of the error functional
- **Function minimization:** the partial derivatives of the error functional must be set to zero
- We now obtain a linear system of equations

$$\frac{\partial E}{\partial \mathbf{c}(\bar{\mathbf{x}})} = \mathbf{0}$$

$$\sum_i \theta(d_i) 2b_j(\mathbf{x}_i) [\mathbf{b}(\mathbf{x}_i)^T \mathbf{c}(\bar{\mathbf{x}}) - f_i] = 0$$

Solution

- The weighting functions participate in the solution
- Note that, this solution is actually locally meaningful, and it is applicable in a small neighborhood

$$\sum_i \left[\theta(d_i) \mathbf{b}(\mathbf{x}_i) \mathbf{b}(\mathbf{x}_i)^T \mathbf{c}(\bar{\mathbf{x}}) - \theta(d_i) \mathbf{b}(\mathbf{x}_i) f_i \right] = \mathbf{0}$$

$$\mathbf{c}(\bar{\mathbf{x}}) = \left[\theta(d_i) \sum_i \mathbf{b}(\mathbf{x}_i) \mathbf{b}(\mathbf{x}_i)^T \right]^{-1} \sum_i \theta(d_i) \mathbf{b}(\mathbf{x}_i) f_i$$

Global Approximation

- The concept of Partition-of-Unity (POU)

$$\varphi_j(x) = \frac{\theta_j(x)}{\sum_{i=1}^n \theta_i(x)}$$

$$f(\mathbf{x}) = \sum_j \varphi_j(\mathbf{x}) \mathbf{b}(\mathbf{x})^T \mathbf{c}(\bar{\mathbf{x}})$$

Moving Least Squares

- Moving Least Squares
Approximants

$$f(x) = \sum_i \phi_i(x) f_i = \sum_j b_j(x) c_j(x)$$

$$\min_c \sum_i \theta(\|\mathbf{x} - \mathbf{x}_i\|) \left\| (\mathbf{b}(\mathbf{x}_i))^T \mathbf{c}(\mathbf{x}) - f_i \right\|^2$$

MLS Basis Functions

$$\phi_i(\mathbf{x}) = \mathbf{b}(\mathbf{x})^T \mathbf{A}(\mathbf{x})^{-1} \mathbf{B}_i(\mathbf{x})$$

$$\mathbf{A}(\mathbf{x}) = \sum_{i=1}^n \theta_i(\mathbf{x}) \mathbf{b}(\mathbf{x}_i) \mathbf{b}(\mathbf{x}_i)^T$$

$$\mathbf{B}(\mathbf{x}) = \left[\theta_1(\mathbf{x}) \mathbf{b}(\mathbf{x}_1) \quad \theta_2(\mathbf{x}) \mathbf{b}(\mathbf{x}_2) \quad \dots \quad \theta_n(\mathbf{x}) \mathbf{b}(\mathbf{x}_n) \right]$$

Weighing Functions

- A cubic spline weight function is a good choice

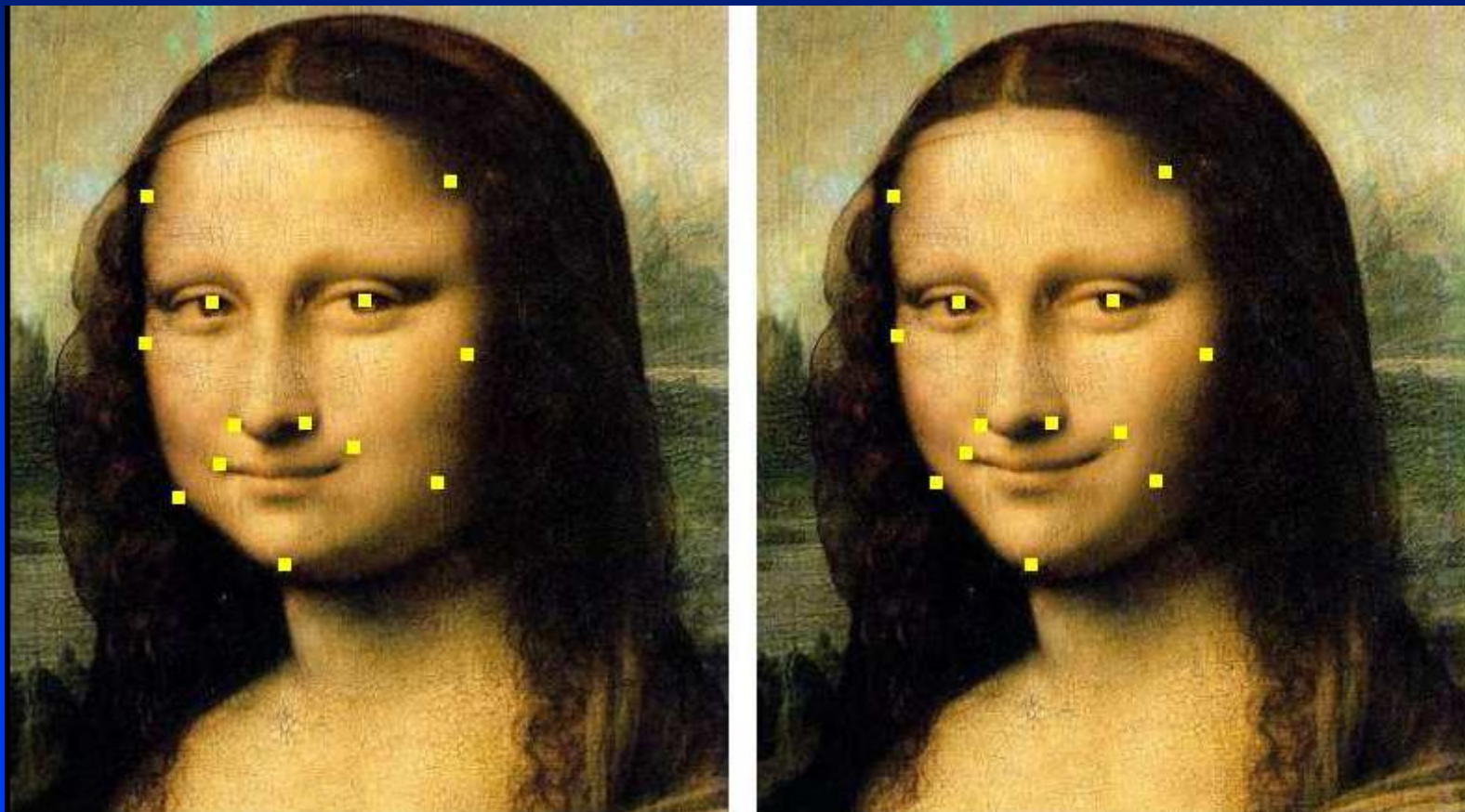
Partition of Unity

- When b is a constant term, MLS basis functions reduce to partition-of-unity basis functions for all the weighting functions

Other Applications

- In addition to point-based Graphics (discussed earlier), MLS is a widespread and very powerful tool in Graphics, with many applications
- Surface reconstruction from points
- Interpolating or approximating implicit surfaces
- Simulation
- Animation
- Partition of Unity
- Physics-based modeling, simulation, and animation

Image Editing



Surface Reconstruction

