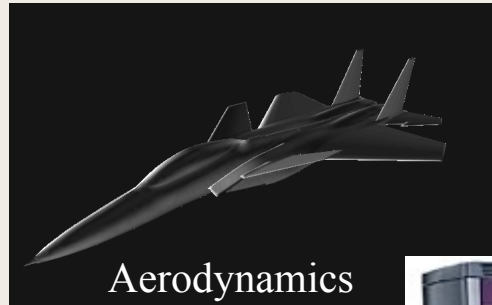


# Visualization of High-Order Finite Element Methods

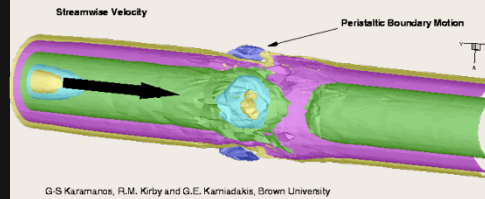
Professor Mike Kirby  
School of Computing and  
Scientific Computing and Imaging Institute  
**University of Utah**  
Salt Lake City, UT, USA



# Collage of Applications

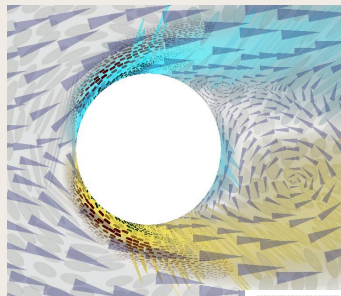


Aerodynamics

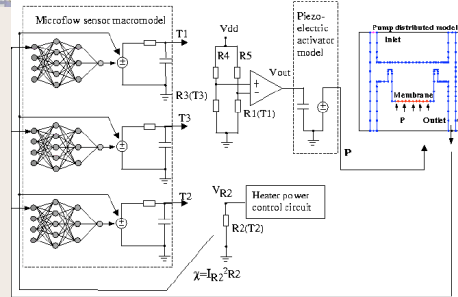


G.S. Karamanos, R.M. Kirby and G.E. Karniadakis, Brown University

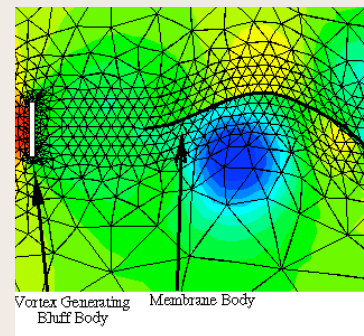
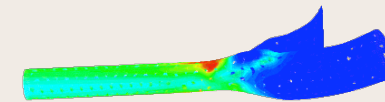
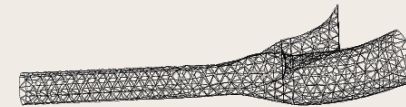
Biomechanics



Scientific  
Visualization



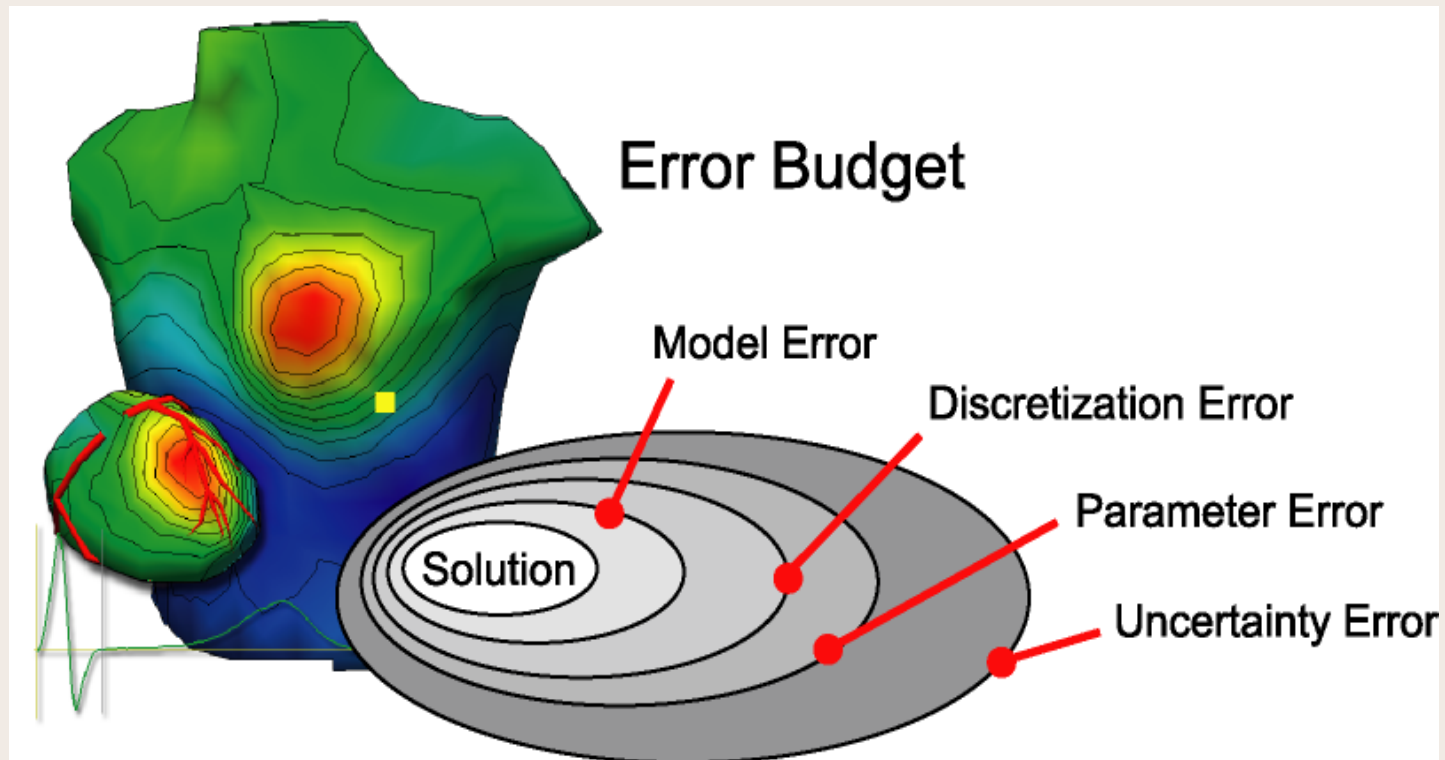
MEMS



Fluid-Structure

Visualization is a means of exploration and explanation

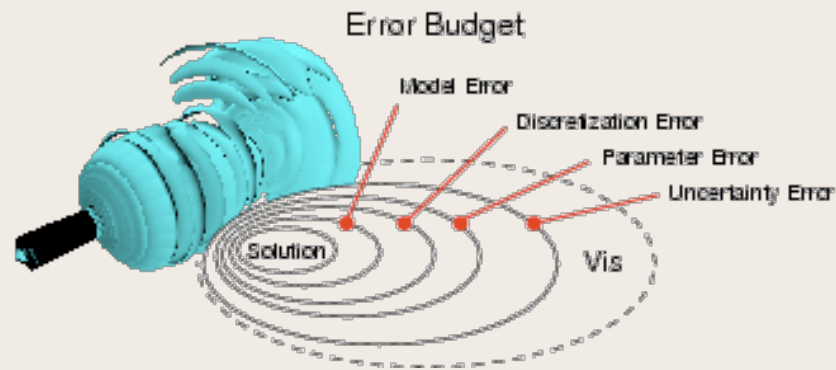
# Simulation Science Error Budget



What About Visualization Error?

# Visualization of High-Order Solutions: Motivation

- Visualization introduces error
- This error can be minimized if we take into account our knowledge of the data



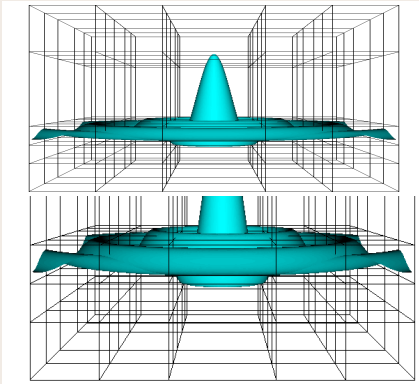


# Visualization of High-Order Method Results Using Ray -Tracing

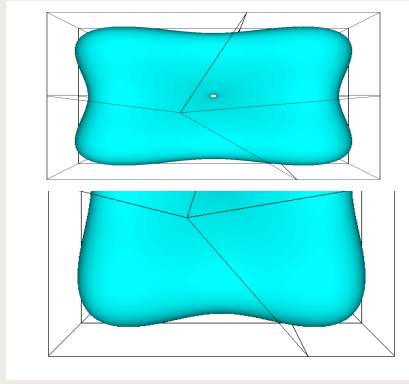


Blake Nelson and Robert M. Kirby, "Ray-Tracing Polymorphic Multi-Domain Spectral/hp Elements for Isosurface Rendering", *IEEE Transactions on Visualization and Computer Graphics*, Vol. 12, Number 1, pages 114-125, 2006.

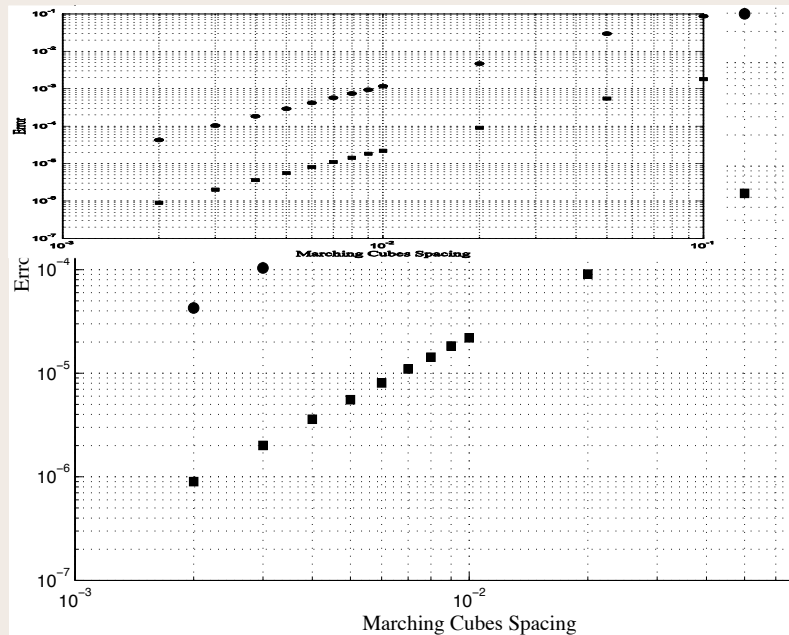
# What is Typically Done?



Example 1 (circles)



Example 2 (squares)

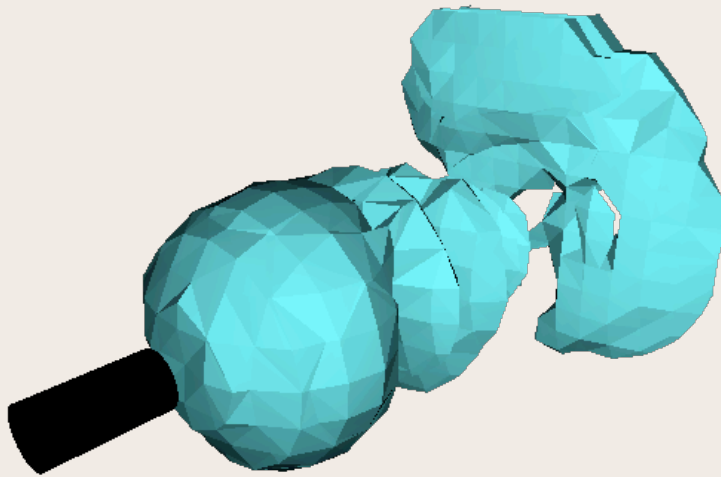


## Marching Cubes Approach

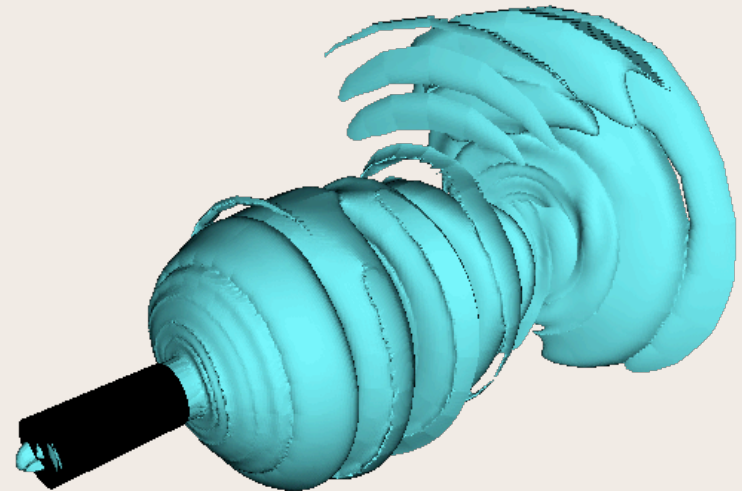
- Sample the data (i.e. evaluate high-order finite elements) on a lattice
- On each edge of the lattice, assume a linear interpolant; find roots
- Based upon roots found on edges, generate triangles which approximate the isosurface
- Provide triangles to the rendering pipeline

Low-Order Approximation to One's High-Order Finite Element Data

# Marching Cubes Visualization



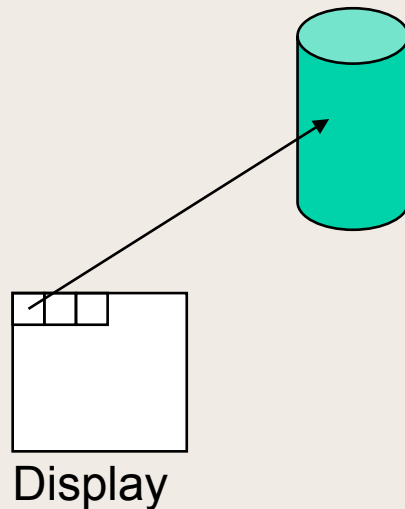
Coarse Marching  
Cubes Refinement



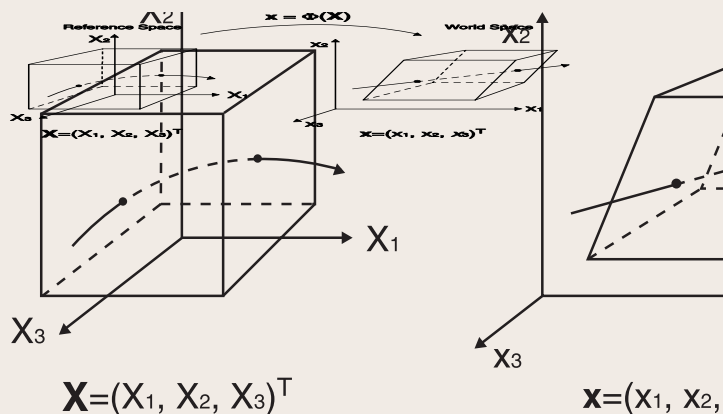
Highly-Refined Marching  
Cubes Refinement  
(2,921,875 Voxels)

Refinement is certainly a strategy, but is it the only strategy?

# Ray Tracing Basics



- For each pixel, cast a ray from the eye-point through the pixel into the domain
- Determine elements through which the ray traverses
- Find the first intersection between the isosurface of interest and the ray

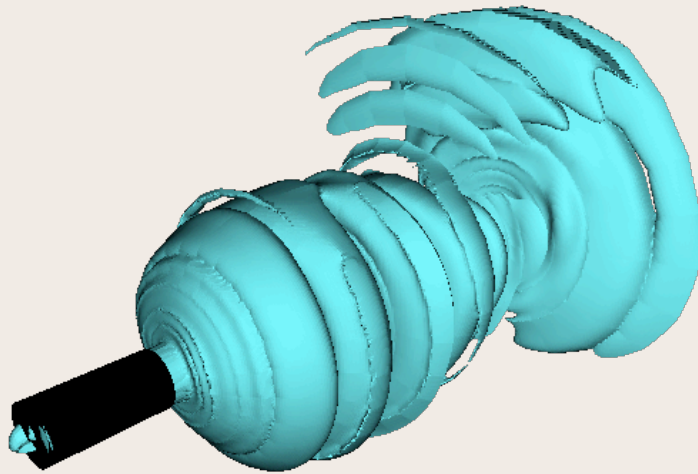


## Challenges with High-Order Finite Elements

- Curved Boundaries
- Elemental Mappings
- Efficient and Robust Root-Finding



# Ray Tracing For High-Order Elements

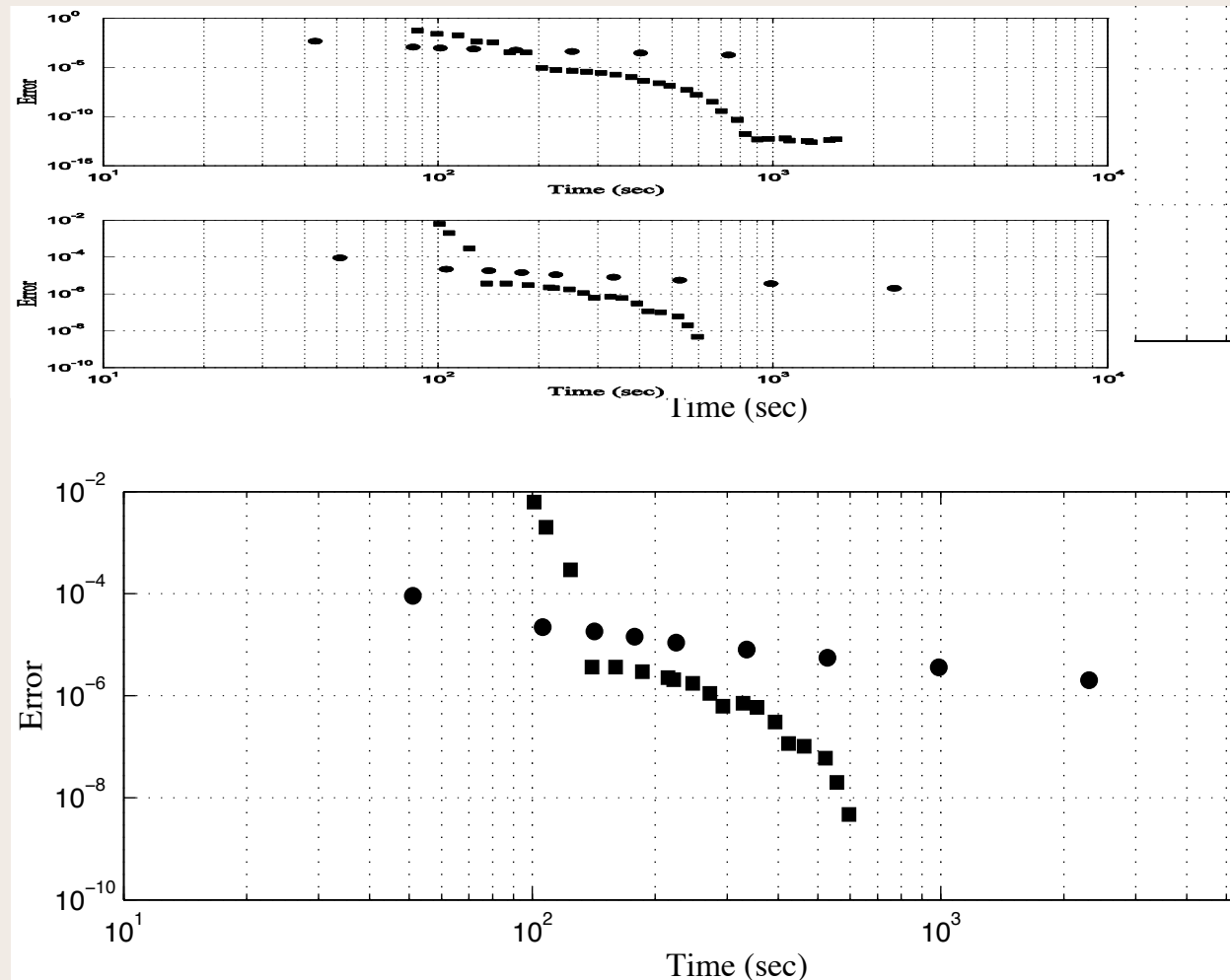


2,921,875 Voxels  
Marching Cubes



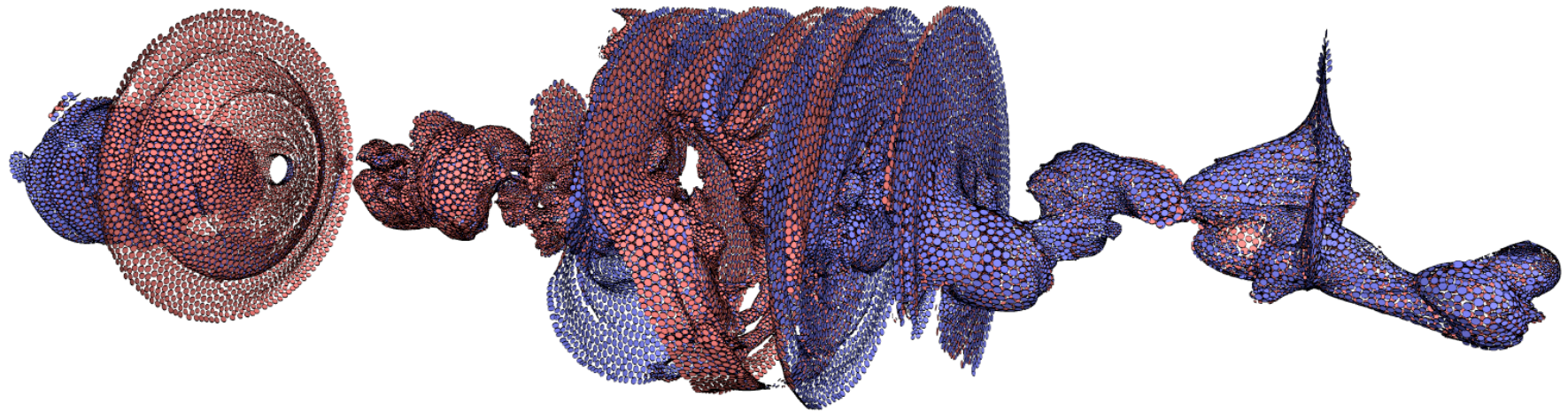
5,736 Elements  
13-order Approximation

# Error Versus Time For Two Example Discretizations



Circles: Marching Cubes  
Squares: Ray-Tracing

# Visualization of High-Order Method Results Using Particle Methods

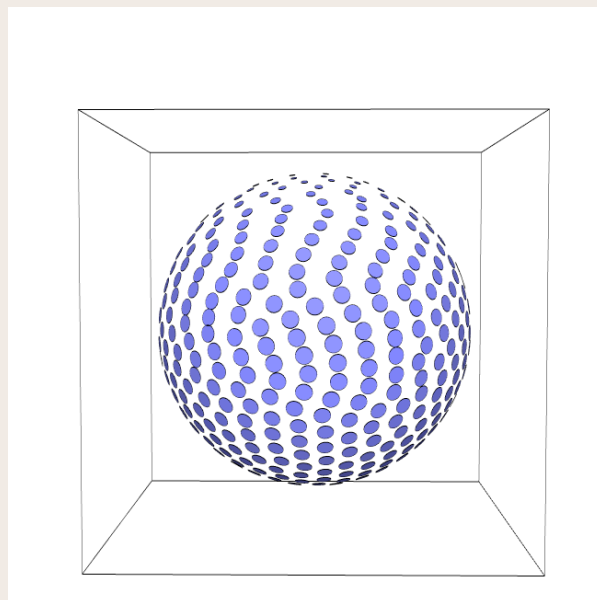


Miriah Meyer, Blake Nelson, Robert M. Kirby and Ross Whitaker, "Particle Systems for Efficient and Accurate Finite Element Visualization", *IEEE Transactions on Visualization and Computer Graphics*, In Press, 2007.



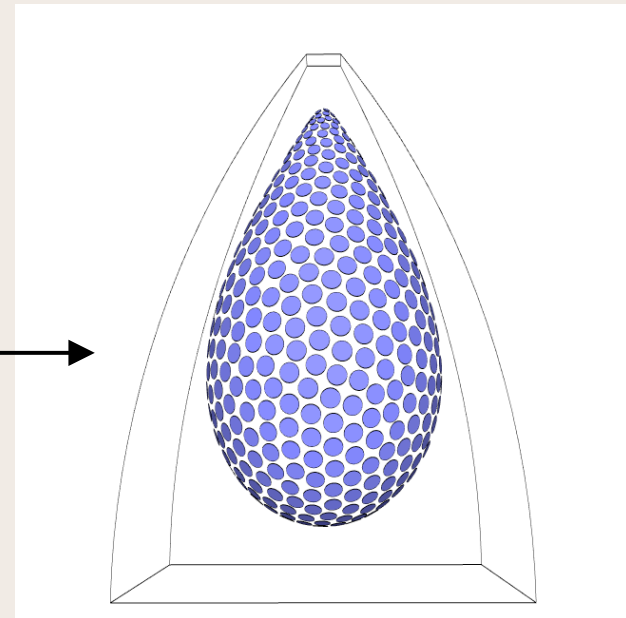
# Particle System Approach

- Reference space particles
- Distributions computed from world space positions
- Adaptivity determined from world space Hessian



Reference Space

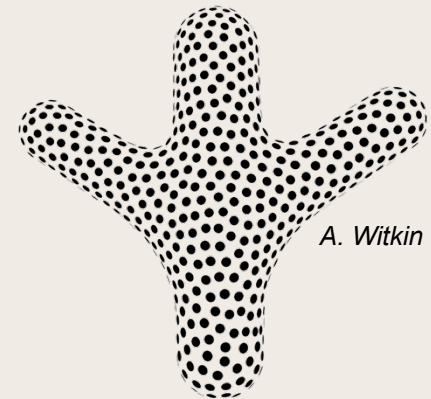
$$T(u) = x$$



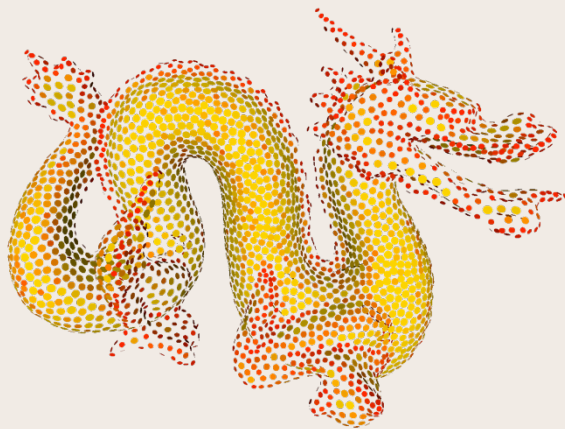
World Space

# Particle System Basics

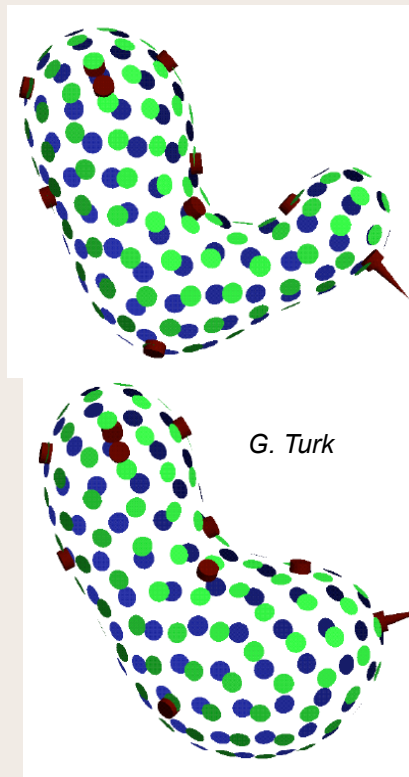
- For sampling surfaces
  - Witkin and Heckbert, 1992
  - Modeling
  - Visualization



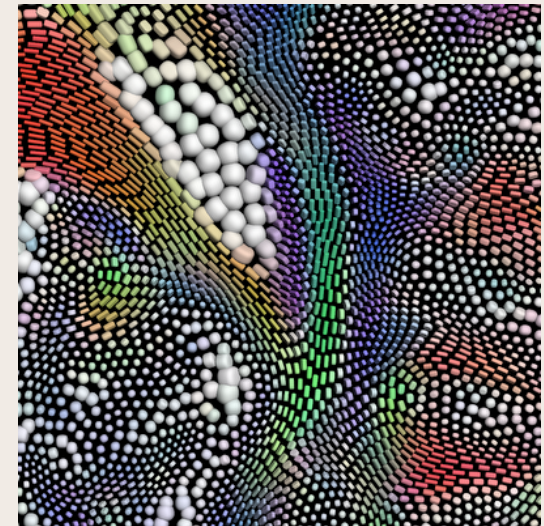
A. Witkin



M. Meyer



G. Turk



G. Kindlmann

# Particle System Basics

## 1. Project onto surface

$$\mathbf{x}_i \leftarrow \mathbf{x}_i - F(\mathbf{x}_i) \frac{F_{\mathbf{x}}(\mathbf{x}_i)}{F_{\mathbf{x}}^T(\mathbf{x}_i)F_{\mathbf{x}}(\mathbf{x}_i)}$$

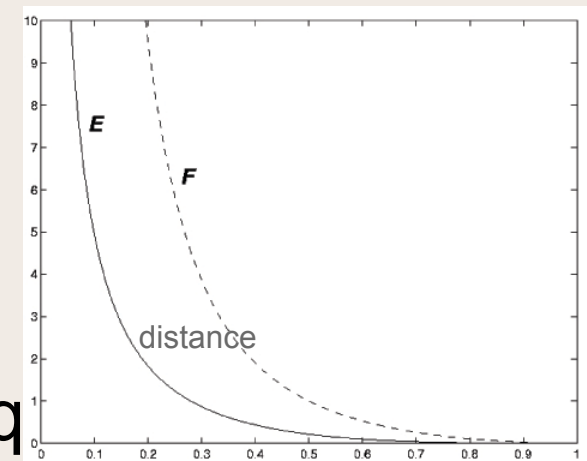
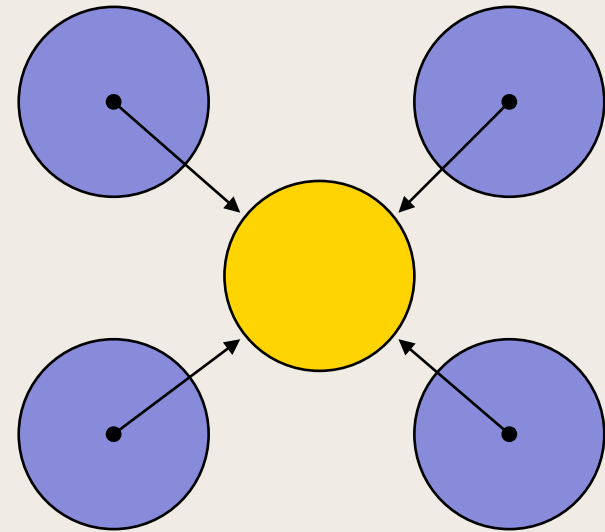
## 2. Inter-particle forces

$$E_i = \sum_{j=1, j \neq i}^m E_{ij} = \sum_{j=1, j \neq i}^m E\left(\frac{|\mathbf{r}_{ij}|}{\sigma}\right)$$

$$\mathbf{v}_i = -\frac{\partial E_i}{\partial \mathbf{x}_i} = -\sum_{j=1, j \neq i}^m \frac{\partial E_{ij}}{\partial |\mathbf{r}_{ij}|} \frac{\mathbf{r}_{ij}}{|\mathbf{r}_{ij}|}$$

$$\mathbf{x}_i \leftarrow \mathbf{x}_i + \left( I - \frac{F_{\mathbf{x}}(\mathbf{x}_i)F_{\mathbf{x}}^T(\mathbf{x}_i)}{F_{\mathbf{x}}^T(\mathbf{x}_i)F_{\mathbf{x}}(\mathbf{x}_i)} \right) \mathbf{v}_i$$

## 3. Steady state when forces are eq



# Particle System Basics

## Adaptive distributions

$$\mathbf{r}_{ij} = \alpha_{ij} (\mathbf{x}_i - \mathbf{x}_j) = -\mathbf{r}_{ji}$$

$$\alpha_{ij} = \alpha_{ji} = \frac{1 + \rho D_{ij} \left( \frac{s}{2\pi} \right)}{s\beta}$$

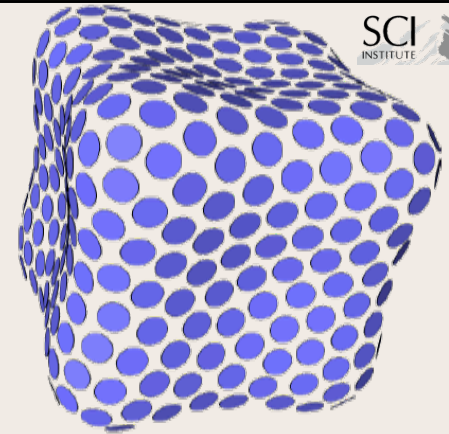
$\rho$ : angular density

$s$ : planar separation

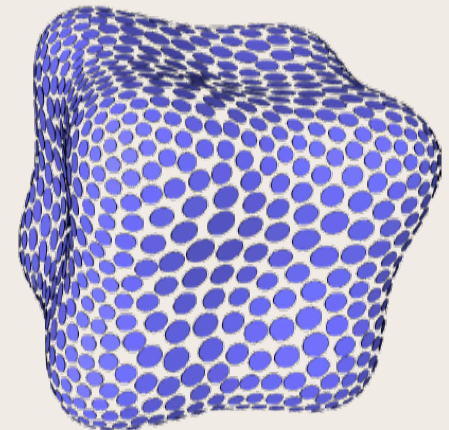
$D$ : curvature magnitude

$\beta$ : constant

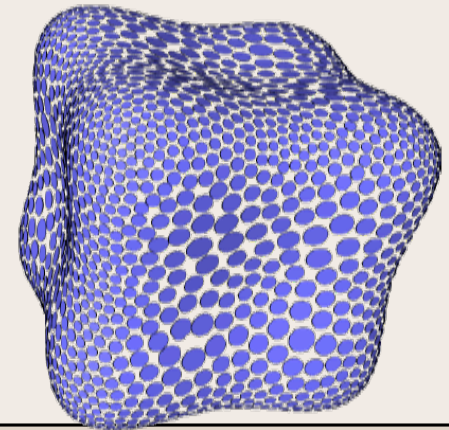
$\rho = 0$



$\rho = 7$

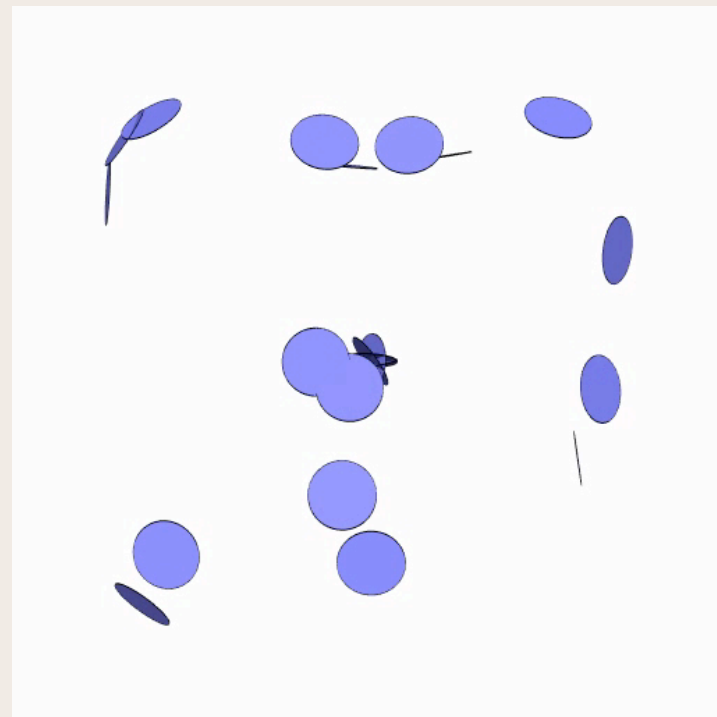
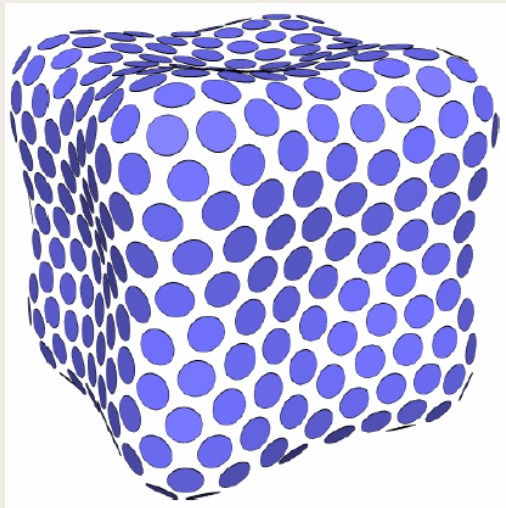


$\rho = 15$



# Particle System Basics

- Population control
  - Split and delete particles
  - Based on energy of a hexagonal packing

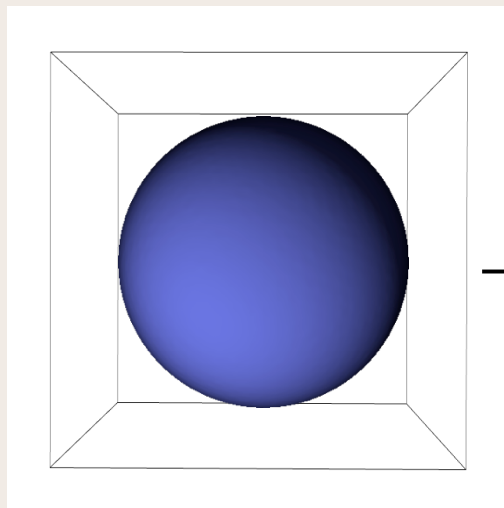


# Isosurface Properties

- Gradient  $F^i = \frac{\partial F}{\partial x^i} = \frac{\partial F^*}{\partial u_j} \frac{\partial u_j}{\partial x^i} = F_j^* K_j^i$

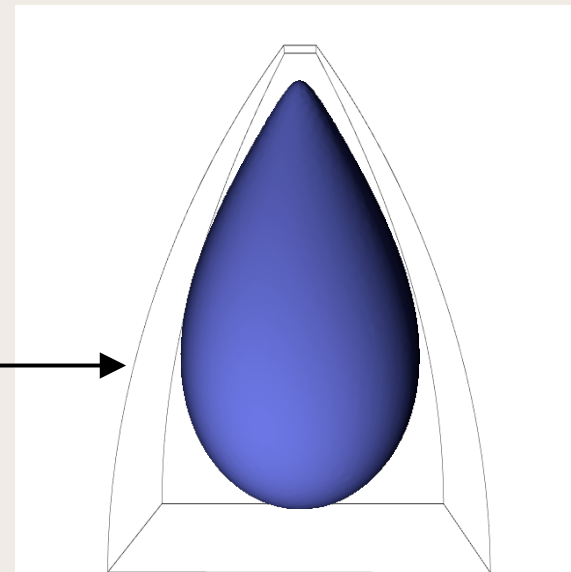
$$K = J^{-1}$$

- Hessian  $F^{ij} = \frac{\partial}{\partial x^i} \left( \frac{\partial F}{\partial x^j} \right) = \frac{\partial}{\partial u_k} \left( \frac{\partial F}{\partial x^j} \frac{\partial u_k}{\partial x^i} \right) = F_{lk}^* K_l^j K_k^i - F_l^* K_l^m J_{kn}^m K_n^j K_k^i$



Reference Space

$$T(u) = x$$



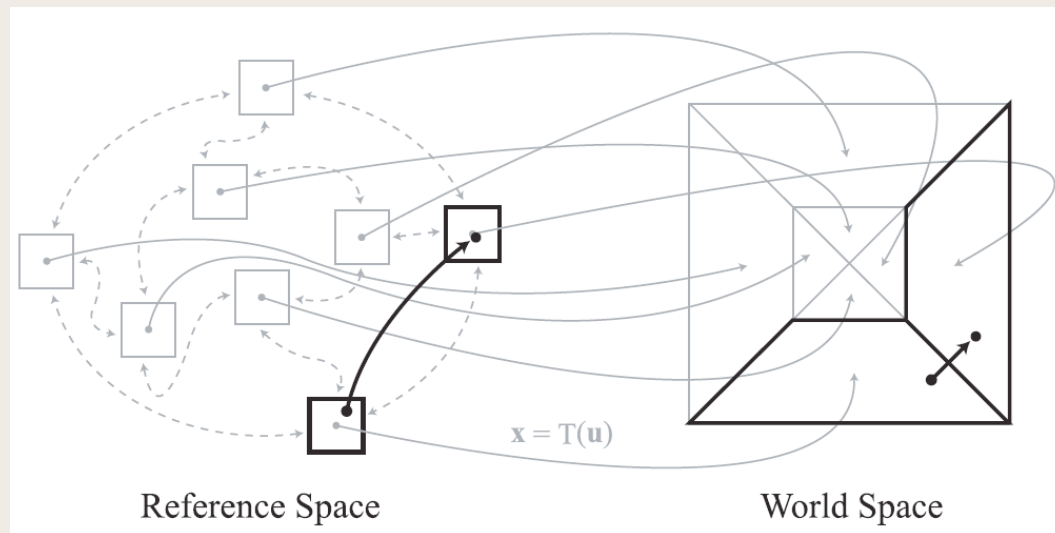
World Space

# Reference Space Particles

- Particles live in reference space
- Use world space positions to compute forces

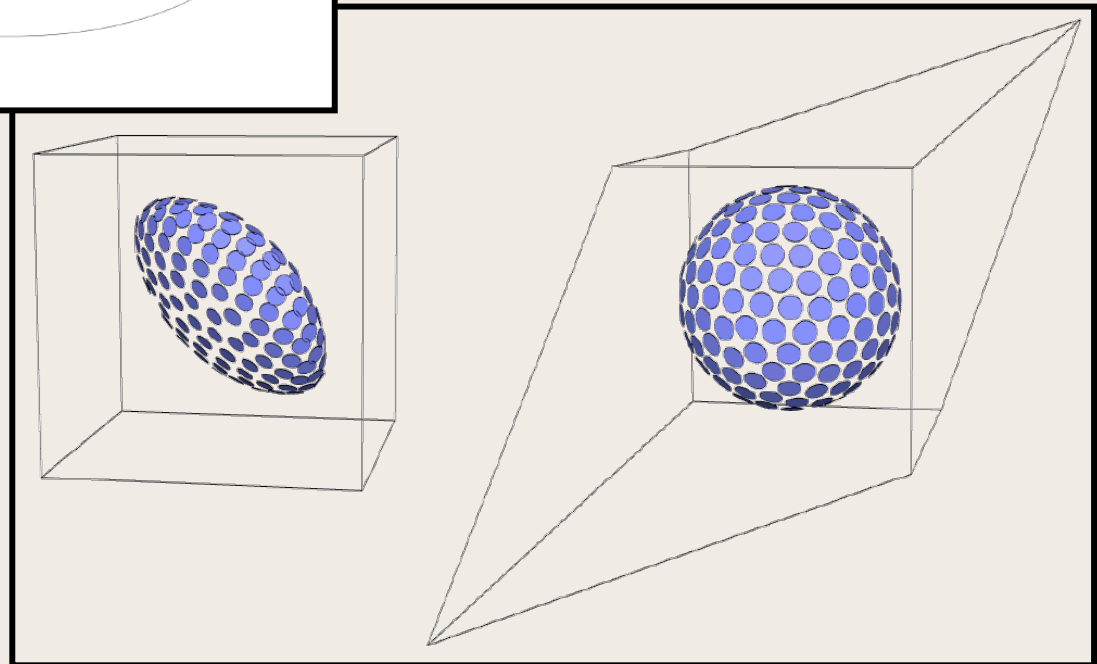
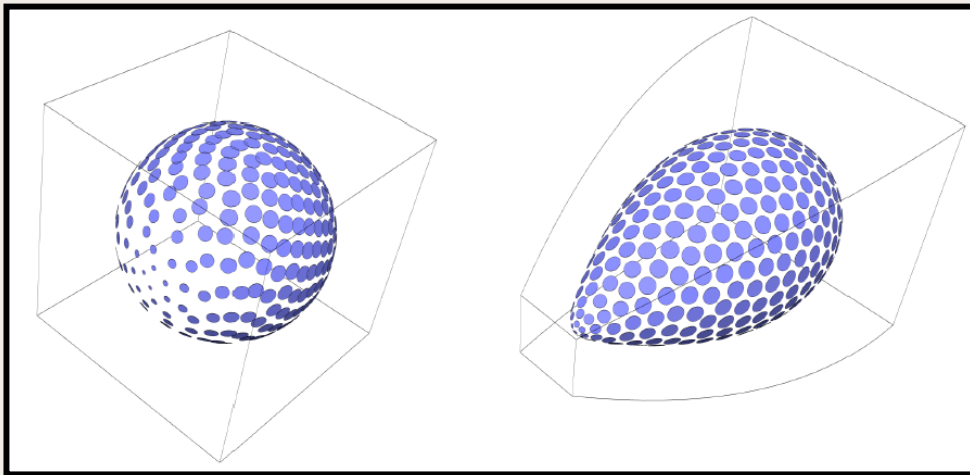
$$\mathbf{v}^* = K\mathbf{v}$$

- Move particle to a new element





# Reference Space Particles





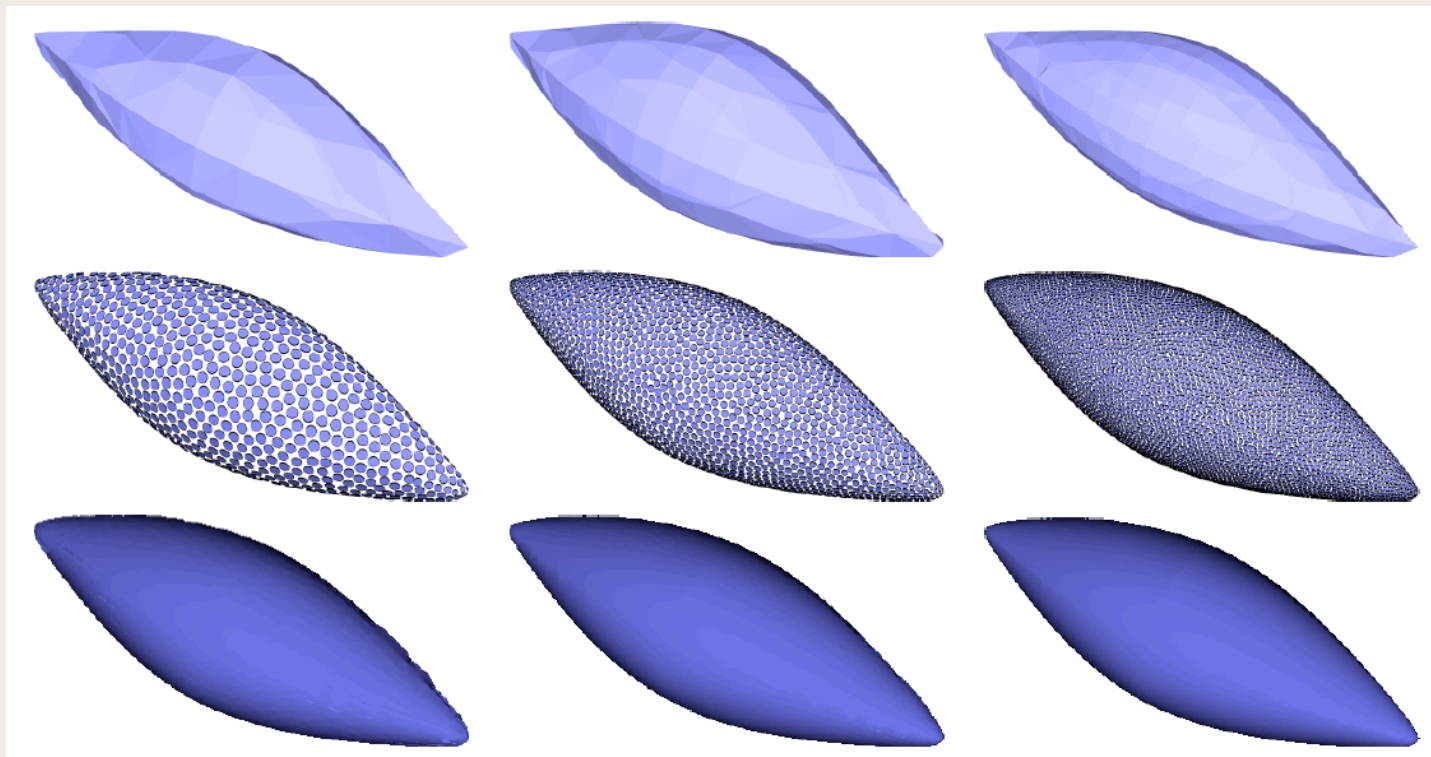
# Results

## Particle System vs. Marching Cubes

~20 seconds

~35 seconds

~70 seconds



1300 particles

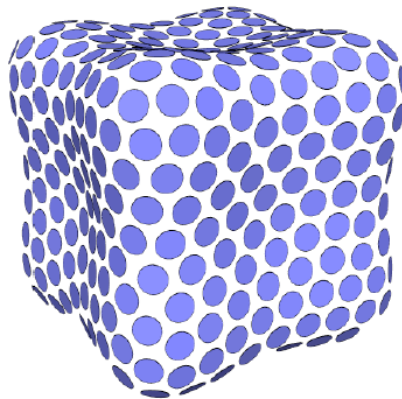
3200 particles

8600 particles

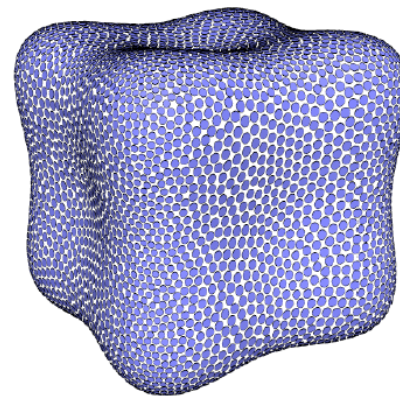
# Results

## Particle System vs. Raytracer

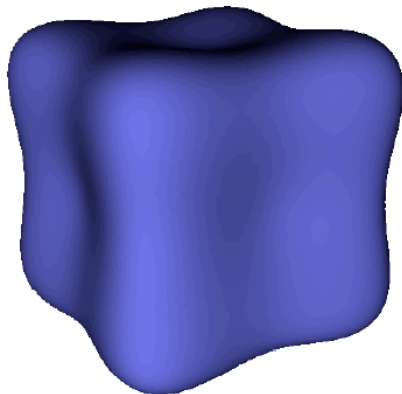
4 seconds,  
500 particles



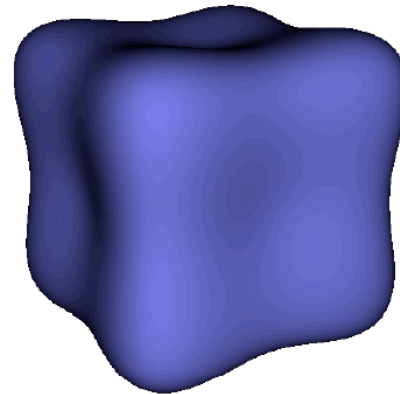
3 minutes,  
6800 particles



GPU-splat  
rendering,  
6800 particles

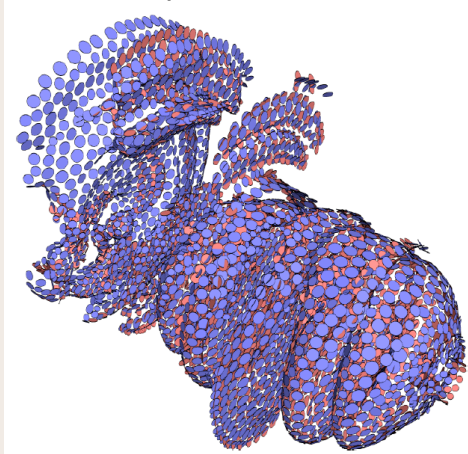


Raytraced  
512x512 image,  
6 minutes



# Results

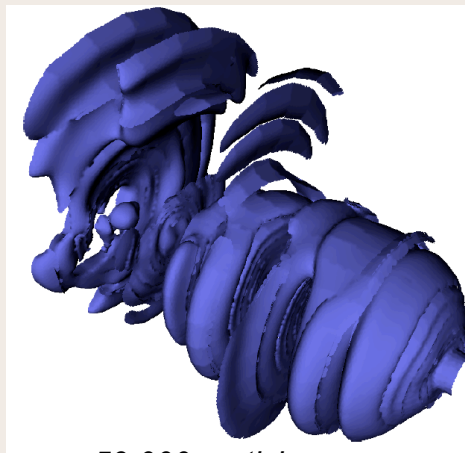
5000 particles



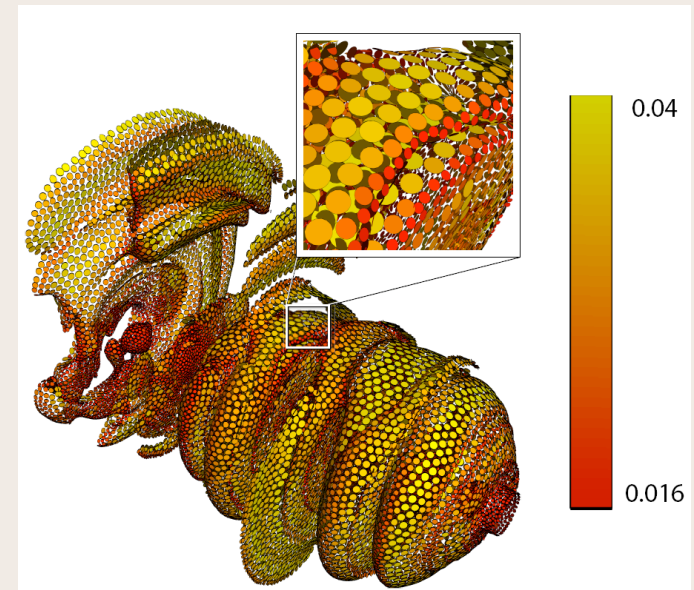
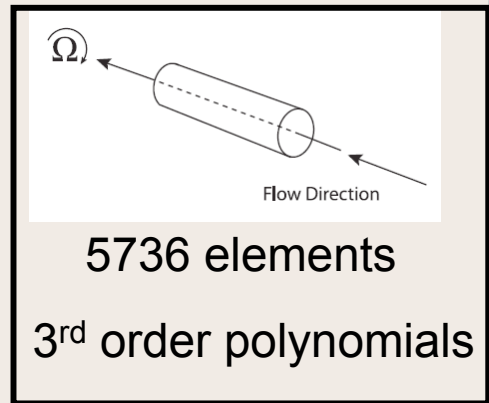
13,000 particles



28,000 particles



59,000 particles



# Summary

- Visualization is part of the Simulation Science Pipeline

## Exploration and Explanation

- Many Visualization Tools Use Low-Order Approximations To Render High-Order Finite Element Data

**Goal:** Exploit Structure of High-Order Finite Elements Directly

- Ray-Tracing for High-Order Finite Elements
- Particle Methods for High-Order Finite Element