



# Mixed Finite Elements for Variational Surface Modeling

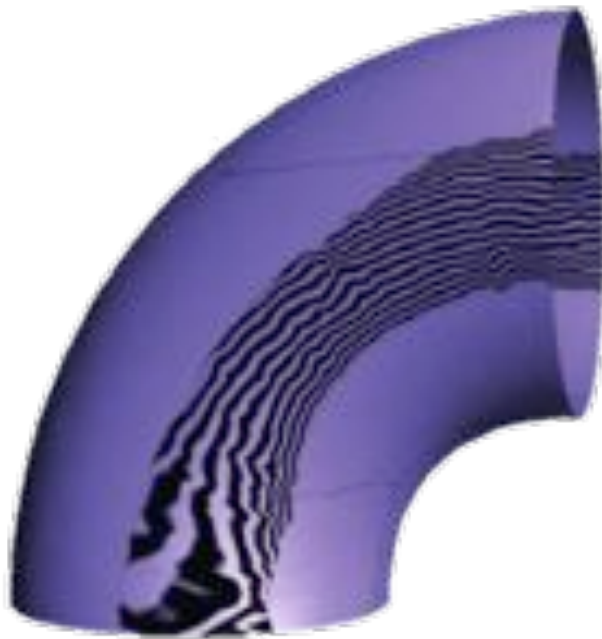
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Denis Zorin

# Common goal is to obtain or maintain high-quality surfaces

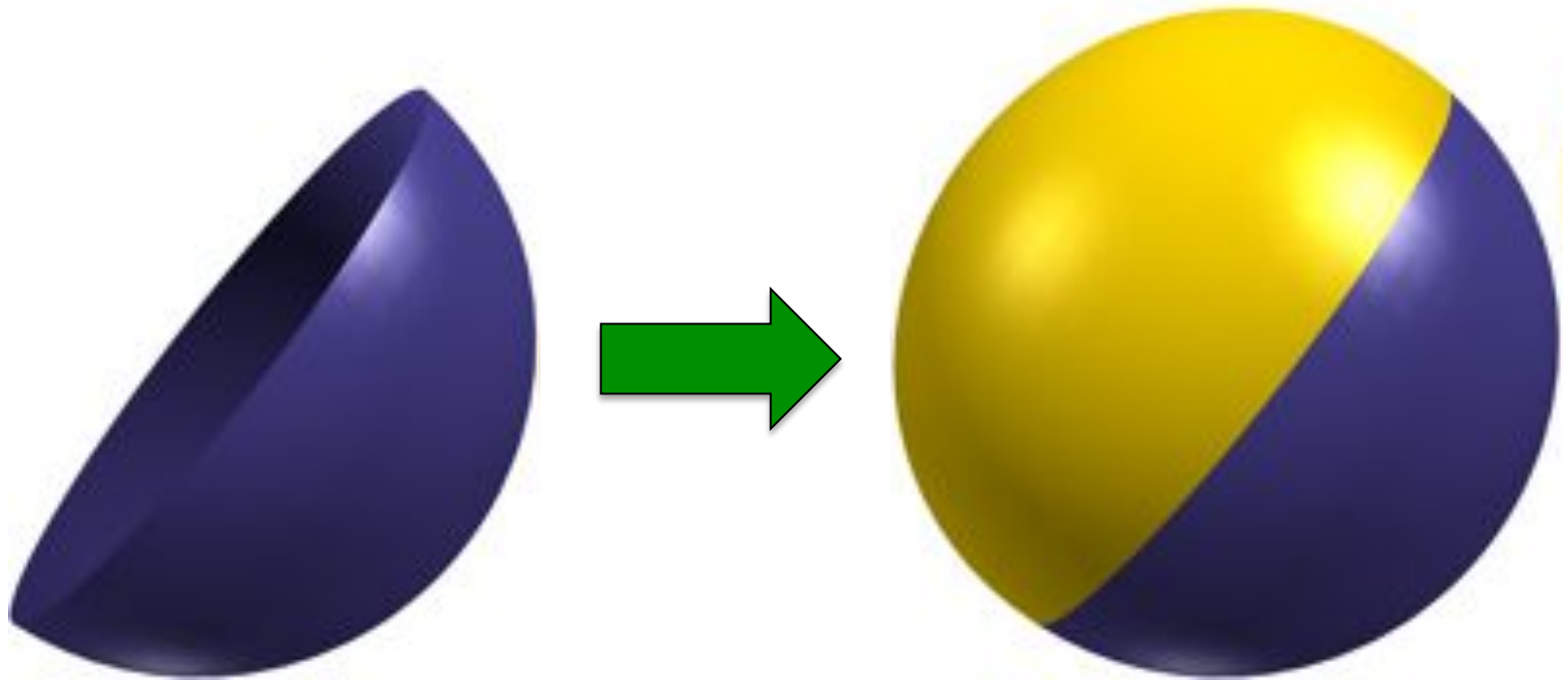


Low-quality surface



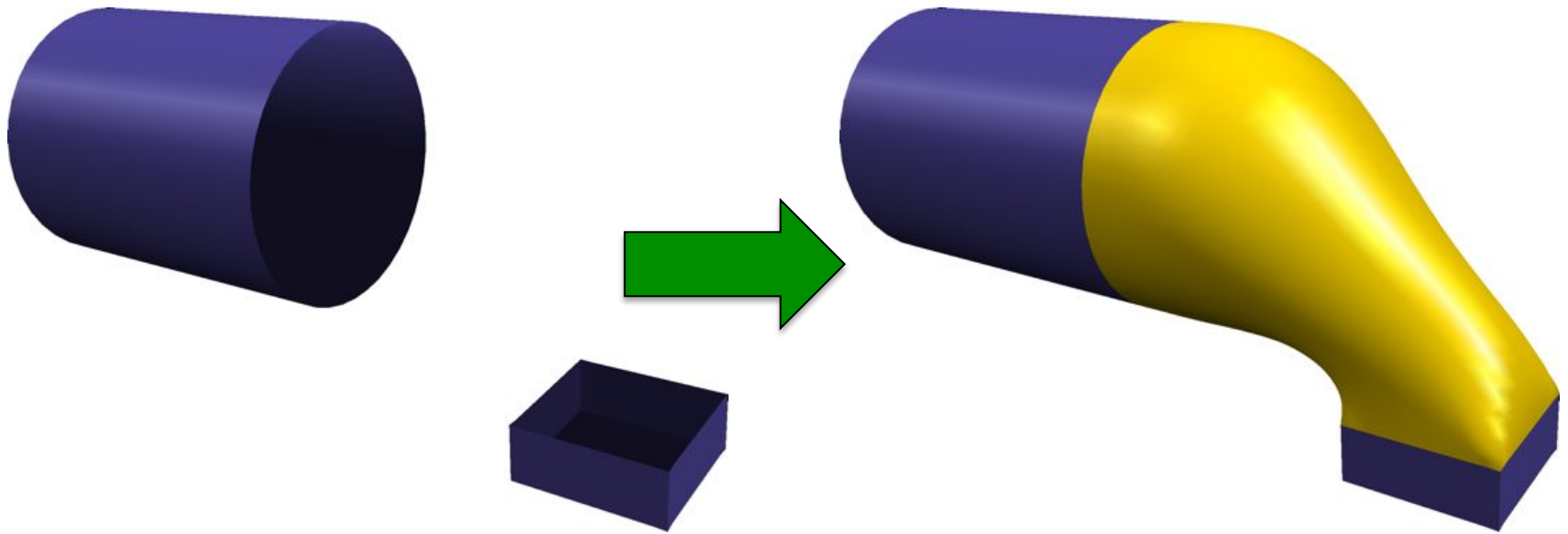
High-quality surface

We'd like to be able to fill holes in existing surfaces, ...



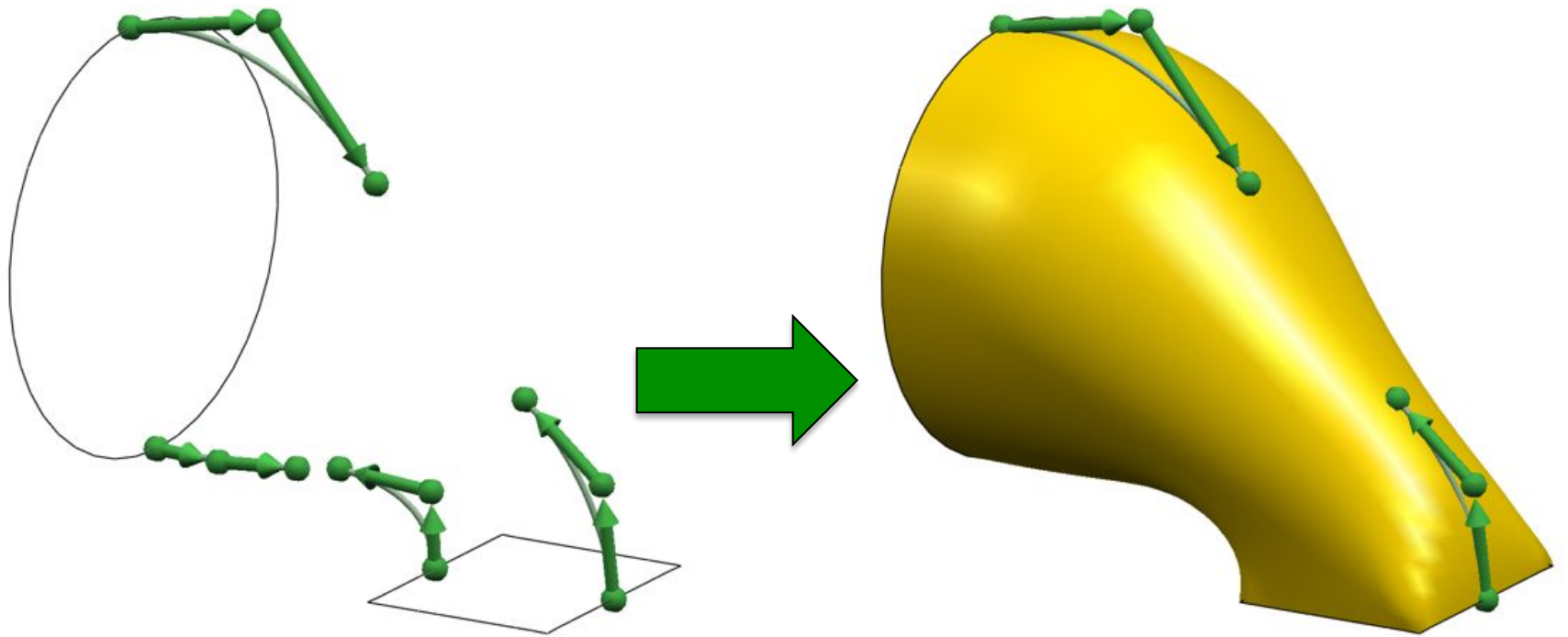
Also care about quality of boundary between new surface and old surface

... connect existing surfaces, ...



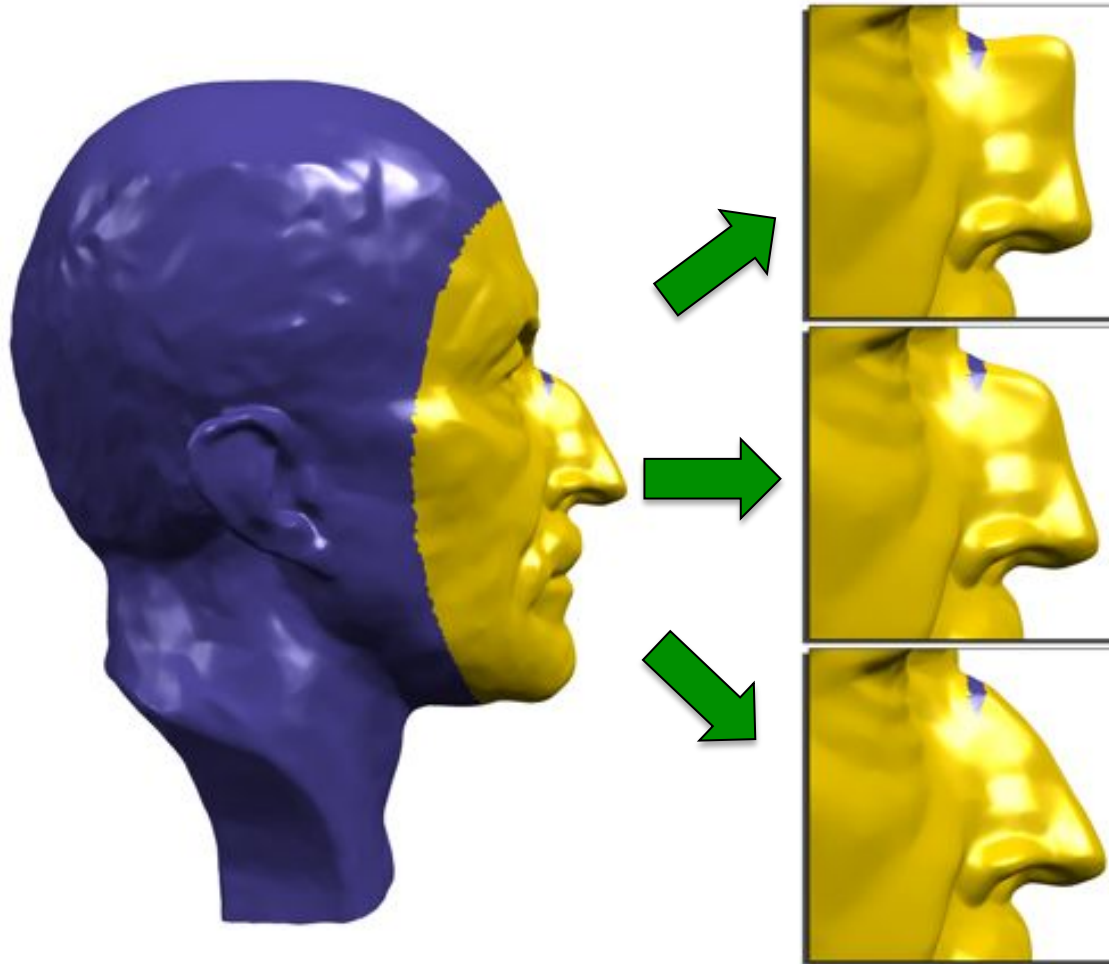
Important that boundaries of different surfaces blend smoothly

... connect existing curves, ...



High-precision controls for high-quality surfaces

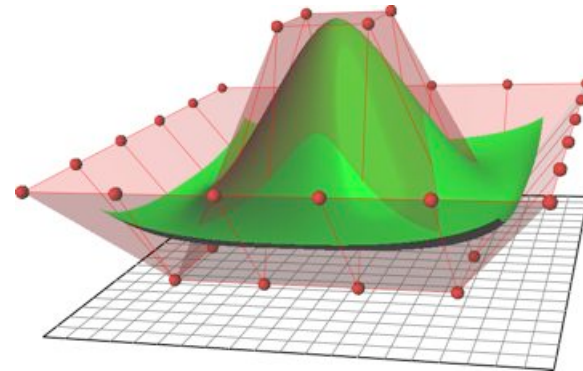
... and edit existing surfaces



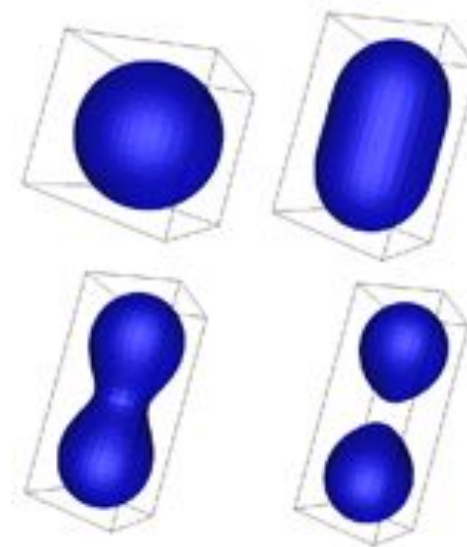
Fine-tuned edits that preserve details

# There are many ways to describe high quality surfaces

NURBS



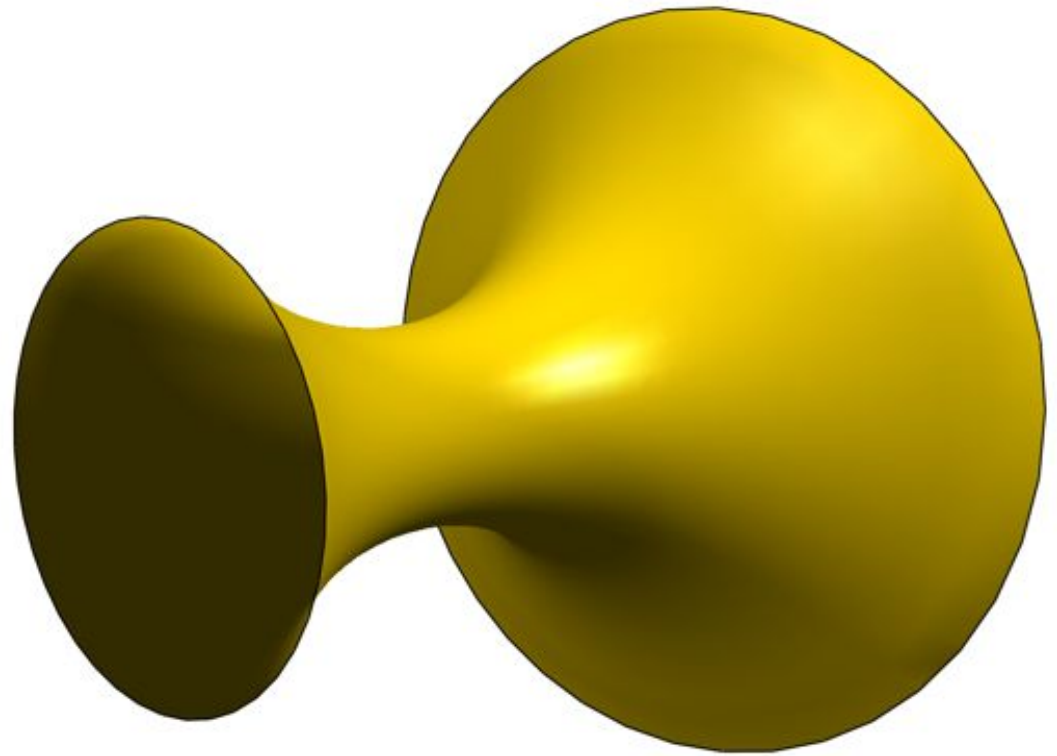
Implicit Surfaces



# Solving a PDE turns surface modeling into boundary value problem

PDE captures quality we would like, e.g.:

$$\Delta \mathbf{u} = 0$$



PDE surface in continuous domain

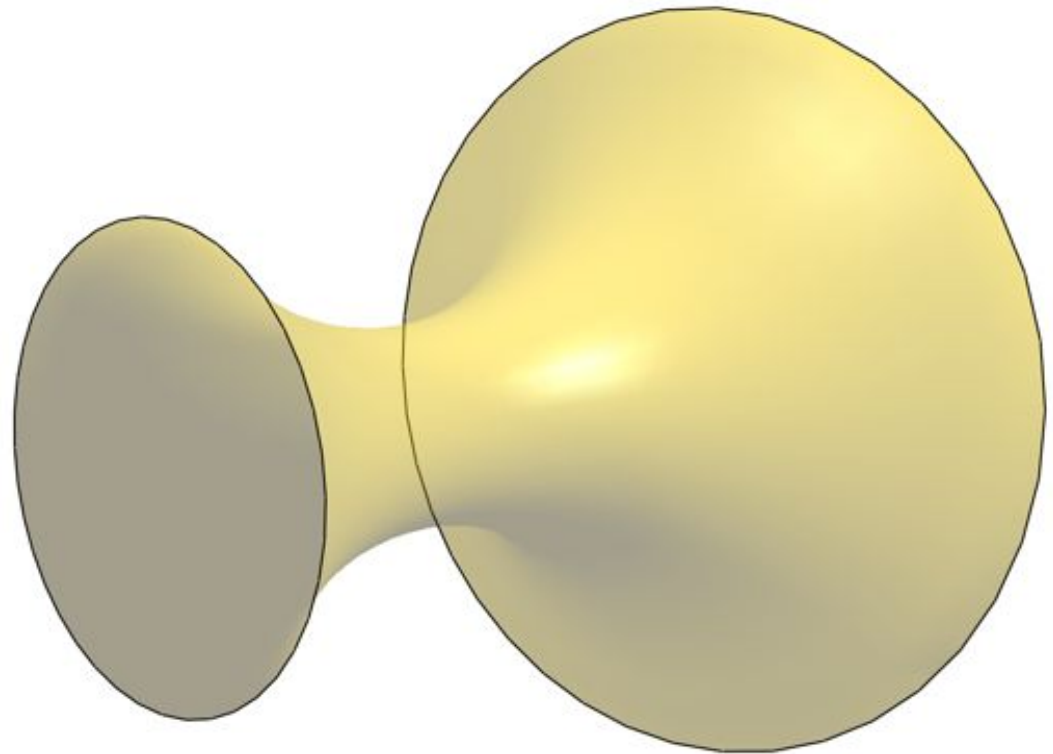


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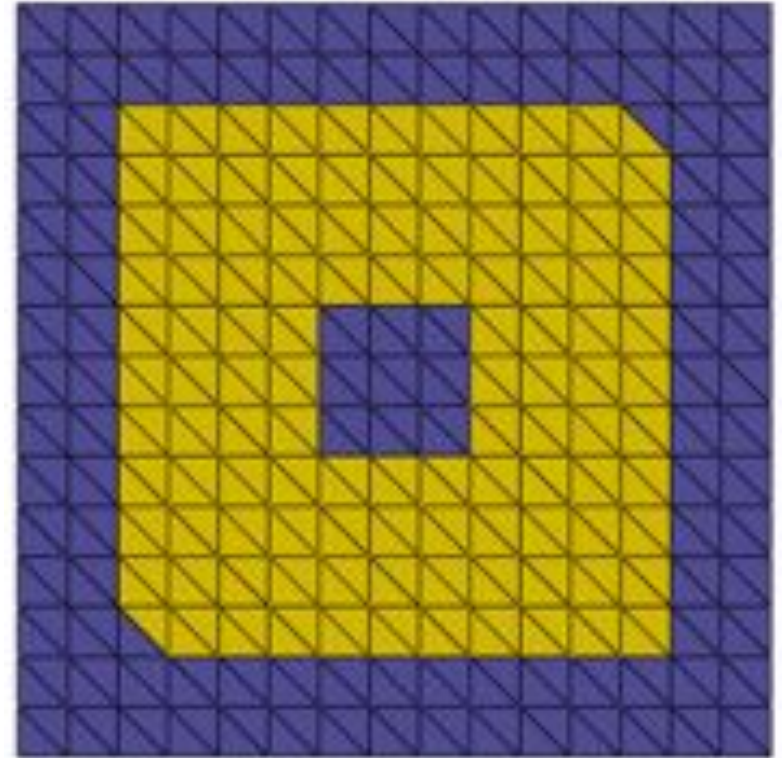
Find surface that satisfies PDE and boundary conditions



PDE surface in continuous domain

# Minimizing an energy or solving a PDE can produce high quality surfaces

Discretized domain

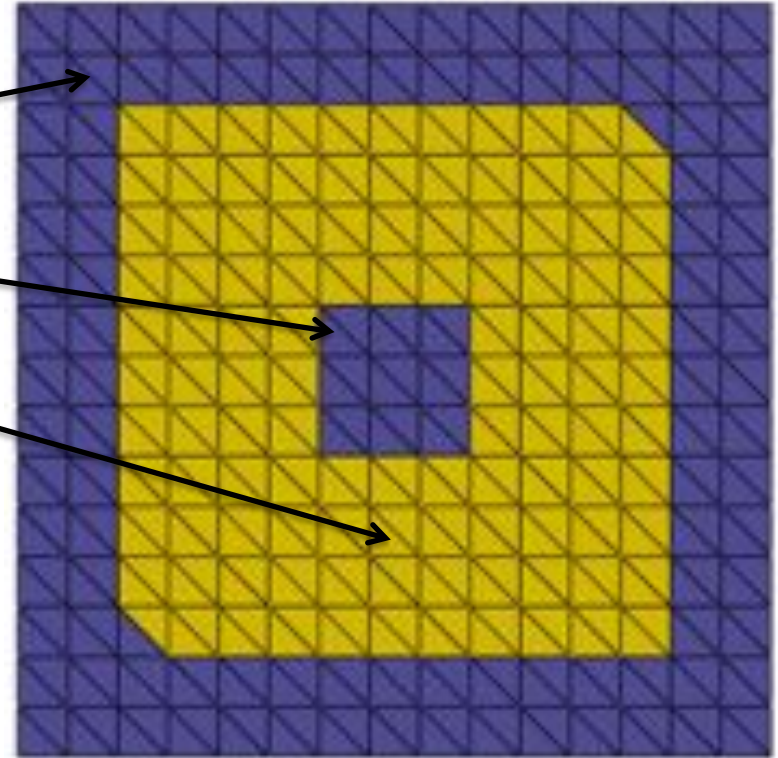


$\mathbf{u}_i$  is the  $(x,y,z)$  position of vertex  $i$  in discretization mesh

# Minimizing an energy or solving a PDE can produce high quality surfaces

Discretized domain

Define exterior  
and interior ( $\mathbf{u}_\Omega$ )



$\mathbf{u}_i$  is the  $(x,y,z)$  position of vertex  $i$  in discretization mesh

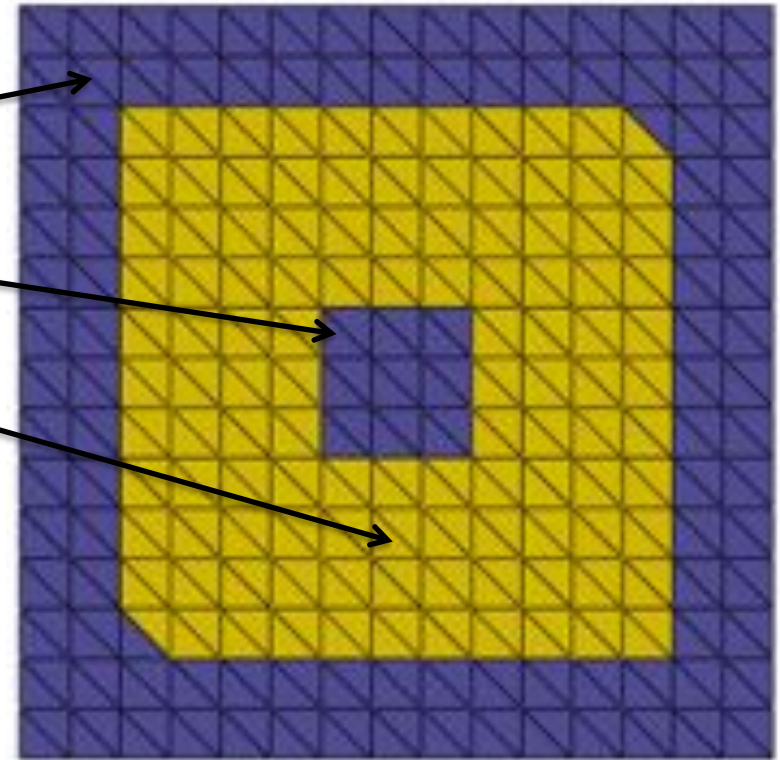
# Minimizing an energy or solving a PDE can produce high quality surfaces

Discretized domain

Define exterior and interior ( $\mathbf{u}_\Omega$ )

$$\begin{array}{|c|} \hline A \\ \hline \end{array} \quad \begin{array}{|c|} \hline \mathbf{u}_\Omega \\ \hline \end{array} = \begin{array}{|c|} \hline b \\ \hline \end{array}$$

Solve for  $\mathbf{u}_\Omega$



$\mathbf{u}_i$  is the  $(x,y,z)$  position of vertex  $i$  in discretization mesh

# Designing a technique to discretize high order PDEs requires care

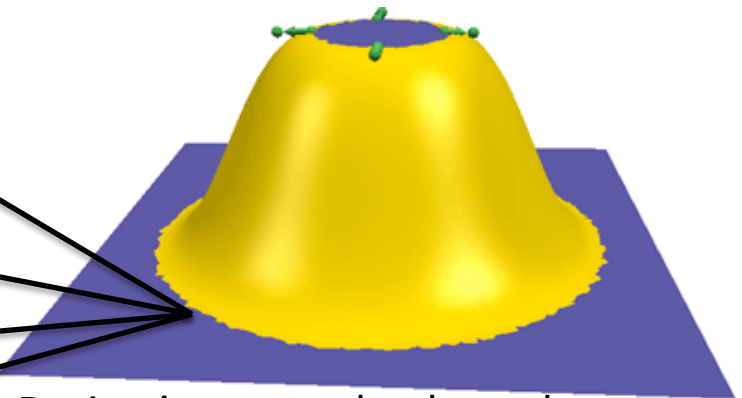
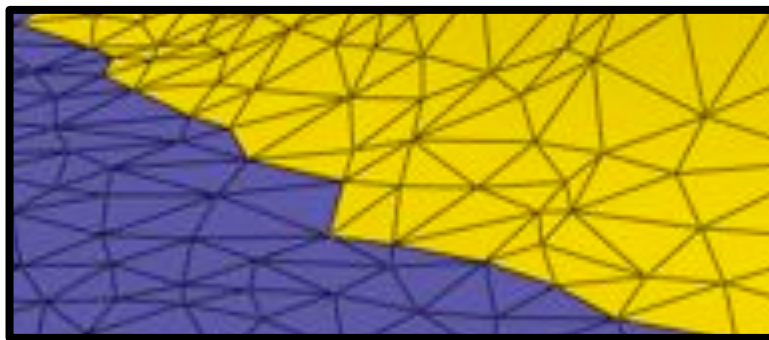
Guarantees about surface quality:  
interior and boundary

Expose control along boundary

Operate directly on input shape:  
simple triangle meshes,  
independent of discretization



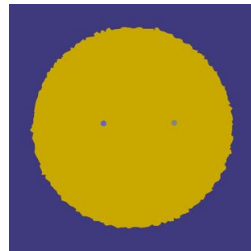
Positional control of exterior



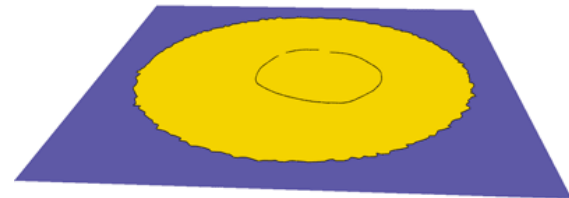
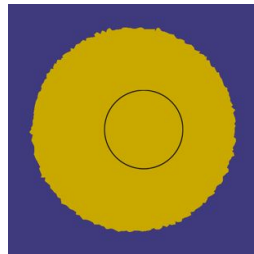
Derivative control at boundary

# Must support different boundary types

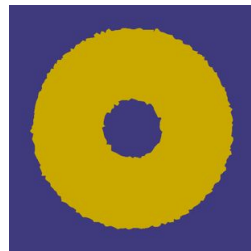
Points



Curves



Regions



# We present a technique for discretizing high order PDEs

Doesn't require high-order elements

Support points, curves and regions as boundaries

Exposes tangent and curvature control

Solution in single, sparse linear solve

# We present a technique for discretizing high order PDEs

Doesn't require high-order elements

Support points, curves and regions as boundaries

Exposes derivative and curvature control

Solution in single, sparse linear solve

Real-time modeling and deformation

Convergence for high order PDEs



# Biharmonic and Triharmonic equations serve as running examples

Biharmonic equation

$$\Delta^2 \mathbf{u} = 0$$

Notation:

$$\Delta \mathbf{u} = \nabla \cdot \nabla \mathbf{u} = \mathbf{u}_{xx} + \mathbf{u}_{yy} + \mathbf{u}_{zz}$$

$$\Delta^k \mathbf{u} = \Delta(\Delta^{k-1} \mathbf{u})$$

# Biharmonic and Triharmonic equations serve as running examples

Biharmonic equation

$$\Delta^2 \mathbf{u} = 0$$

Laplacian energy

$$E_B = \frac{1}{2} \langle \Delta \mathbf{u}, \Delta \mathbf{u} \rangle_{\Omega_0} \rightarrow \min$$

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Triharmonic equation

$$\Delta^3 \mathbf{u} = 0$$

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Triharmonic equation

$$\Delta^3 \mathbf{u} = 0$$

Laplacian gradient energy

$$E_T = \frac{1}{2} \langle \nabla \Delta \mathbf{u}, \nabla \Delta \mathbf{u} \rangle_{\Omega_0} \rightarrow \min$$

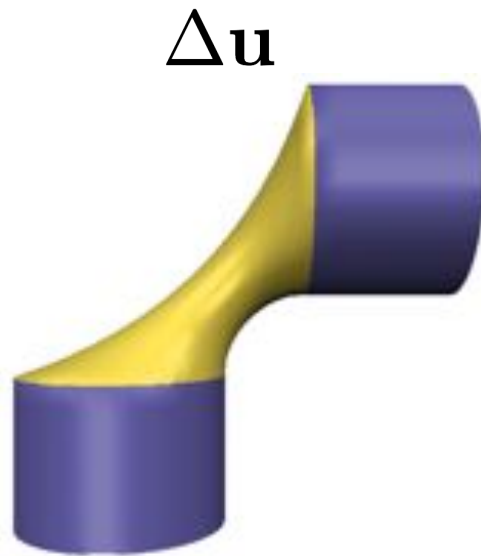
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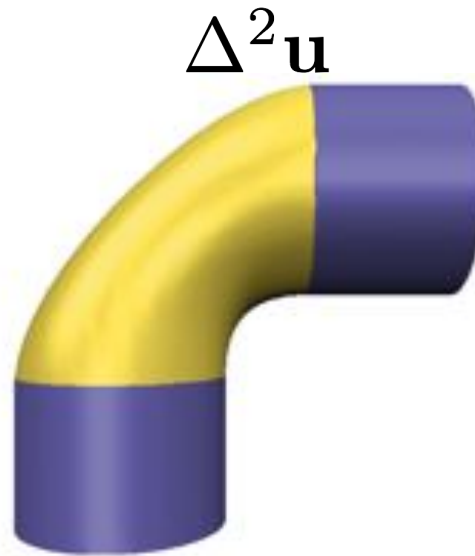
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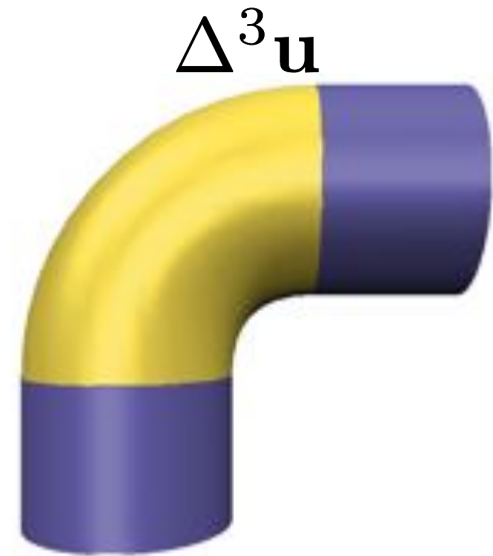
# Bi-/Tri- harmonic equations produce smooth surfaces and boundaries



Soap film  
 $C^0$  at boundary  
Positional control at  
boundary



Thin plate  
 $C^1$  at boundary  
+Tangent control at  
boundary



Curvature variation minimizing  
 $C^2$  at boundary  
+Curvature control at  
boundary

# Previous works have limitations

Simple domains, analytic boundaries

[Bloor and Wilson 1990]

Model shaped minimization of curvature variation energy

[Moreton and Séquin 1992]

Interpolate curve networks, local quadratic fits and finite differences

[Welch and Witkin 1994]

Uniform-weight discrete Laplacian

[Taubin 1995]

Cotangent-weight discrete Laplacian

[Pinkall and Polthier 1993],

[Wardetzky et al. 2007],

[Reuter et al. 2009]

# We can show previous solutions are applications of mixed FEM approach

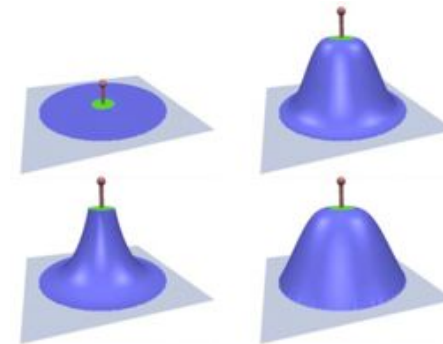
[Clarenz et al., 2004]

- Willmore Flow (fourth-order PDE)
- Positions and co-normals on boundary



[Botsch and Kobbelt, 2004]

- Discretization of k-harmonic equations



Discrete boundary conditions found in these can be derived from continuous case

Standard finite element method would  
require high-order elements

Need many more degrees of freedom

Existing high-order representations are neither  
practical, nor popular

Need low order,  $C^0$ , workarounds:

e.g. mixed FEM

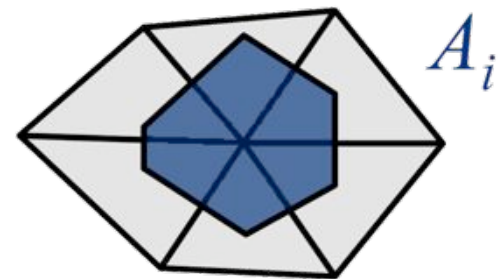
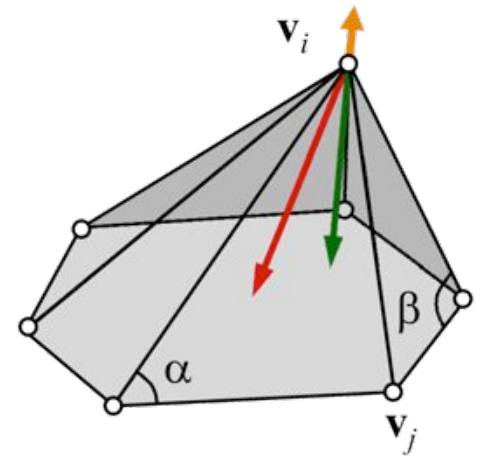


# Discrete Geometric Discretization not easily connected to continuous case

Idea is to define mesh analog of continuous geometric quantity

E.g. Laplace-Beltrami operator integrated over vertex area

Used often in geometric modeling



# We introduce mixed finite elements for variational surface modeling

Introduce new variable to convert high-order problem into two low-order problems

Solve two problems simultaneously

$$\Delta^2 \mathbf{u} = 0$$



$$\Delta \mathbf{u} = \mathbf{v}$$

$$\Delta \mathbf{v} = 0$$

# We introduce mixed finite elements for variational surface modeling

Introduce new variable to convert high-order problem into two low-order problems

$$\frac{1}{2} \langle \Delta \mathbf{u}, \Delta \mathbf{u} \rangle_{\Omega_0} \rightarrow \min$$



Solve two problems simultaneously

$$\begin{aligned} \frac{1}{2} \langle \mathbf{v}, \mathbf{v} \rangle_{\Omega_0} &\rightarrow \min, \\ \text{s.t. } \Delta \mathbf{u} &= \mathbf{v} \end{aligned}$$

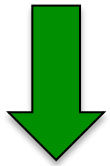
New variable needs to be enforced as hard constraint

We use Lagrange multipliers to enforce the new variable

$$\frac{1}{2} \langle \Delta \mathbf{u}, \Delta \mathbf{u} \rangle_{\Omega_0} \rightarrow \min$$

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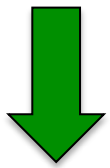


(New variable:  $\mathbf{v}$ )

$$\frac{1}{2} \langle \mathbf{v}, \mathbf{v} \rangle_{\Omega_0} \rightarrow \min, \text{ s.t. } \Delta \mathbf{u} = \mathbf{v}$$

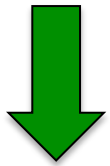
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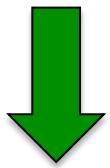


(Lagrange multiplier:  $\lambda$ )

$$\frac{1}{2} \langle \mathbf{v}, \mathbf{v} \rangle_{\Omega_0} + \langle \lambda, \Delta \mathbf{u} - \mathbf{v} \rangle_{\Omega_0} \rightarrow \min$$

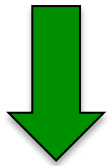
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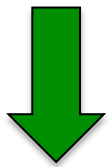
(New variable:  $\mathbf{v}$ )

$$\frac{1}{2} \langle \mathbf{v}, \mathbf{v} \rangle_{\Omega_0} \rightarrow \min, \text{ s.t. } \Delta \mathbf{u} = \mathbf{v}$$



(Lagrange multiplier:  $\lambda$ )

$$\frac{1}{2} \langle \mathbf{v}, \mathbf{v} \rangle_{\Omega_0} + \langle \lambda, \Delta \mathbf{u} - \mathbf{v} \rangle_{\Omega_0} \rightarrow \min$$



(Green's Identity)

$$\frac{1}{2} \langle \mathbf{v}, \mathbf{v} \rangle_{\Omega_0} + \langle \lambda, \mathbf{v} \rangle_{\Omega_0} + \langle \lambda, \frac{\partial \mathbf{u}}{\partial n} \rangle_{\partial \Omega_0} - \langle \nabla \lambda, \nabla \mathbf{u} \rangle_{\Omega_0} \rightarrow \min$$

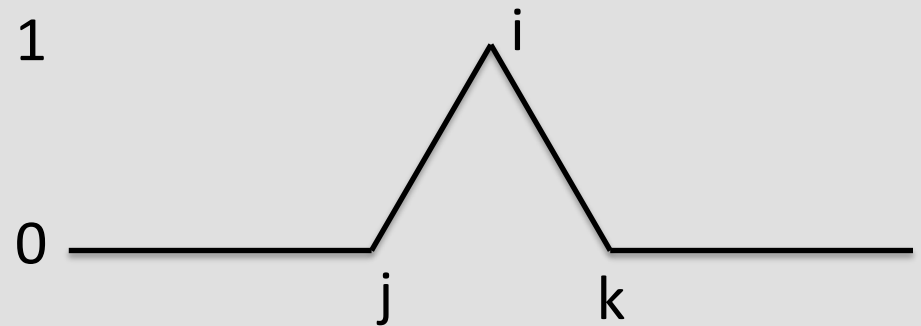
# Discretize each variable using piecewise linear elements

$$\mathbf{u} = \sum_{i \in \Omega} u_i \phi_i$$

$$\mathbf{v} = \sum_{i \in \Omega} v_i \phi_i$$

$$\lambda = \sum_{i \in \Omega} \lambda_i \phi_i$$

Hat function:  $\phi_i$



1 at vertex  $i$ , 0 at all other vertices

Linearly interpolated across edges, faces of mesh



# Take derivatives of energy to find minimum

$$\frac{1}{2} \langle \mathbf{v}, \mathbf{v} \rangle_{\Omega_0} + \langle \lambda, \mathbf{v} \rangle_{\Omega_0} + \langle \lambda, \frac{\partial \mathbf{u}}{\partial n} \rangle_{\partial \Omega_0} - \langle \nabla \lambda, \nabla \mathbf{u} \rangle_{\Omega_0} \rightarrow \min$$

With respect to  $\mathbf{v}$ :

$$\sum_{j \in I} (\mathbf{v}_j - \lambda_j) \langle \phi_j, \phi_i \rangle_{\Omega_0} = 0$$

# Take derivatives of energy to find minimum

$$\frac{1}{2} \langle \mathbf{v}, \mathbf{v} \rangle_{\Omega_0} + \langle \lambda, \mathbf{v} \rangle_{\Omega_0} + \langle \lambda, \frac{\partial \mathbf{u}}{\partial n} \rangle_{\partial \Omega_0} - \langle \nabla \lambda, \nabla \mathbf{u} \rangle_{\Omega_0} \rightarrow \min$$

With respect to  $\mathbf{v}$ :

$$\sum_{j \in I} (\mathbf{v}_j - \lambda_j) \langle \phi_j, \phi_i \rangle_{\Omega_0} = 0$$

With respect to  $\mathbf{u}$ :

$$- \sum_{j \in I} \lambda_j \langle \nabla \phi_j, \nabla \phi_i \rangle_{\Omega_0} = 0$$

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$$\frac{1}{2} \langle \mathbf{v}, \mathbf{v} \rangle_{\Omega_0} + \langle \lambda, \mathbf{v} \rangle_{\Omega_0} + \langle \lambda, \frac{\partial \mathbf{u}}{\partial n} \rangle_{\partial \Omega_0} - \langle \nabla \lambda, \nabla \mathbf{u} \rangle_{\Omega_0} \rightarrow \min$$

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With respect to  $\mathbf{u}$ :

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With respect to  $\lambda$ :

$$\sum_{j \in I} \mathbf{v}_j \langle \phi_j, \phi_i \rangle_{\Omega_0} + \sum_{j \in I} \frac{\partial \mathbf{u}_j}{\partial n} \langle \phi_j, \phi_i \rangle_{\partial \Omega_0} - \sum_{j \in I} \mathbf{u}_j \langle \nabla \phi_j, \nabla \phi_i \rangle_{\Omega_0} = 0$$

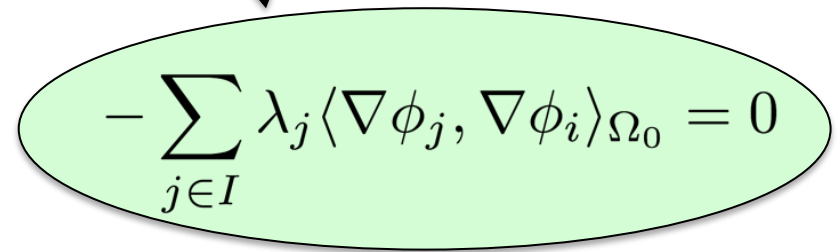
# Take derivatives of energy to find minimum

$$\frac{1}{2} \langle \mathbf{v}, \mathbf{v} \rangle_{\Omega_0} + \langle \lambda, \mathbf{v} \rangle_{\Omega_0} + \langle \lambda, \frac{\partial \mathbf{u}}{\partial n} \rangle_{\partial \Omega_0} - \langle \nabla \lambda, \nabla \mathbf{u} \rangle_{\Omega_0} \rightarrow \min$$

With respect to  $\mathbf{v}$ :

$$\sum_{j \in I} (\mathbf{v}_j - \lambda_j) \langle \phi_j, \phi_i \rangle_{\Omega_0} = 0$$

With respect to  $\mathbf{u}$ :


$$-\sum_{j \in I} \lambda_j \langle \nabla \phi_j, \nabla \phi_i \rangle_{\Omega_0} = 0$$

With respect to  $\lambda$ :

$$\sum_{j \in I} \mathbf{v}_j \langle \phi_j, \phi_i \rangle_{\Omega_0} + \sum_{j \in I} \frac{\partial \mathbf{u}_j}{\partial n} \langle \phi_j, \phi_i \rangle_{\partial \Omega_0} - \sum_{j \in I} \mathbf{u}_j \langle \nabla \phi_j, \nabla \phi_i \rangle_{\Omega_0} = 0$$

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With respect to  $\mathbf{v}$ :

Lagrange multiplier has disappeared

$$\sum_{j \in I} \mathbf{v}_j \langle \nabla \phi_j, \nabla \phi_i \rangle_{\Omega_0} = 0$$

With respect to  $\lambda$ :

$$\sum_{j \in I} \mathbf{v}_j \langle \phi_j, \phi_i \rangle_{\Omega_0} + \sum_{j \in I} \frac{\partial \mathbf{u}_j}{\partial n} \langle \phi_j, \phi_i \rangle_{\partial \Omega_0} - \sum_{j \in I} \mathbf{u}_j \langle \nabla \phi_j, \nabla \phi_i \rangle_{\Omega_0} = 0$$

# Solve simultaneously as one big system

Move known parts to right-hand side

Rewrite in block matrix form:

$$\begin{bmatrix} -M & L \\ L & 0 \end{bmatrix} \begin{bmatrix} \mathbf{v} \\ \mathbf{u} \end{bmatrix} = \begin{bmatrix} -L\bar{\mathbf{u}} - N\bar{\mathbf{n}} \\ 0 \end{bmatrix}$$

Discrete Laplacian

$$L_{ij} = \langle \nabla \phi_i, \nabla \phi_j \rangle$$

Mass matrix

$$M_{ij} = \langle \phi_i, \phi_j \rangle$$

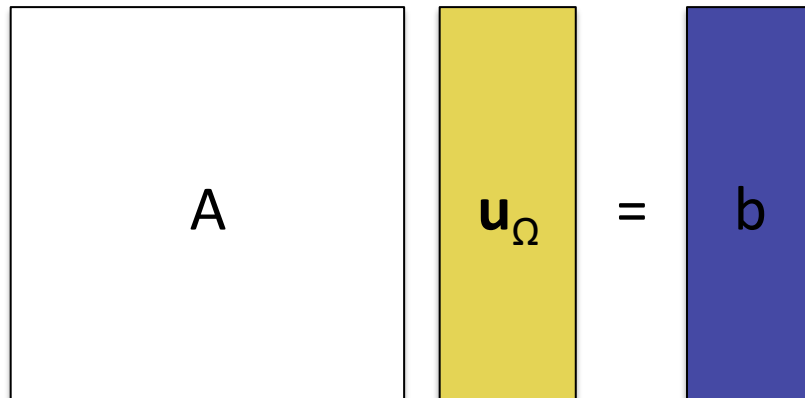
Neumann matrix

$$N_{ij} = \langle \phi_i, \phi_j \rangle_{\partial\Omega}$$

Solve simultaneously as one big system

Move known terms to right-hand side

Rewrite in block matrix form:



A diagram illustrating a block matrix equation. It consists of three main components arranged horizontally: a square box on the left containing the letter 'A', a vertical yellow rectangular box in the middle containing the symbol  $\mathbf{u}_\Omega$ , and a vertical blue rectangular box on the right containing the letter 'b'. An equals sign '=' is positioned between the yellow and blue boxes, indicating the equation  $A \mathbf{u}_\Omega = \mathbf{b}$ .

# We can solve deformations in real-time using pre-factored matrix

Point boundaries



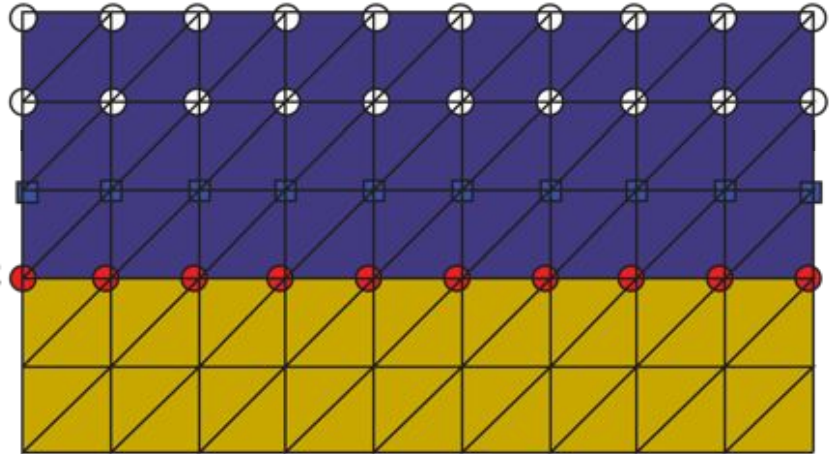
Curve boundaries with derivatives





# Region boundaries are also derived from continuous case

Use two rings of boundary instead of one ring with specified derivatives



Resulting systems are similar, different right-hand sides

Helps simplify implementation to support all three boundary types

# Triharmonic offers more boundary control, better smoothness

Introduce two new variables to convert high-order problem into three low-order problems

$$\Delta^3 \mathbf{u} = 0$$



Solve three problems simultaneously

$$\Delta \mathbf{u} = \mathbf{v}$$

$$\Delta \mathbf{v} = \mathbf{w}$$

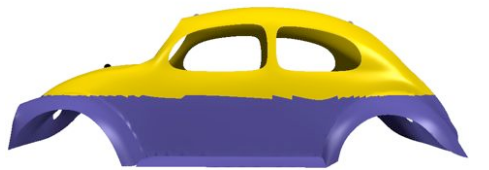
$$\Delta \mathbf{w} = 0$$

Need even more Lagrange multipliers

But in the end we get a structurally similar, linear system

# Triharmonic guarantees $C^2$ continuity at boundaries

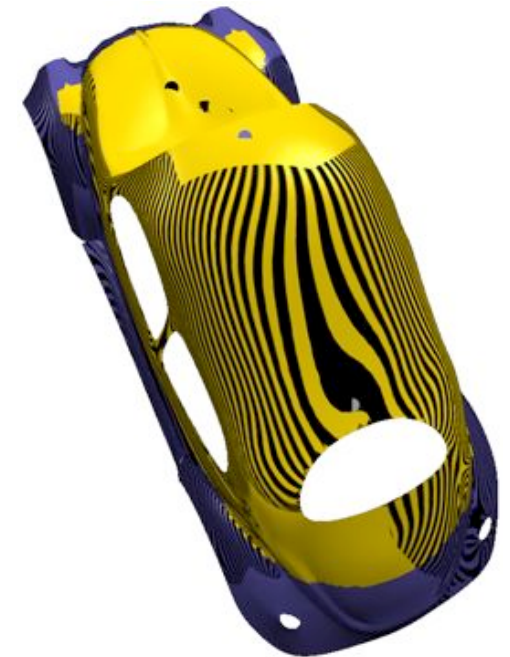
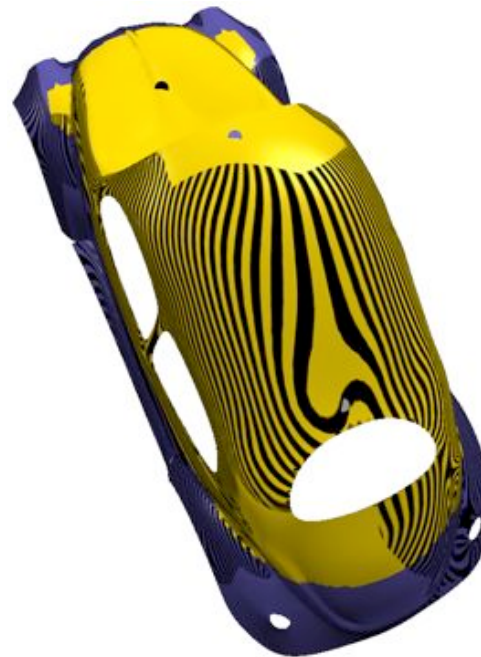
Original



Biharmonic

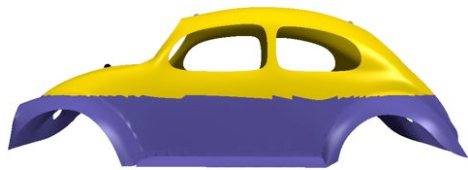


Triharmonic



# Triharmonic guarantees $C^2$ continuity at boundaries

Original



Biharmonic



Triharmonic



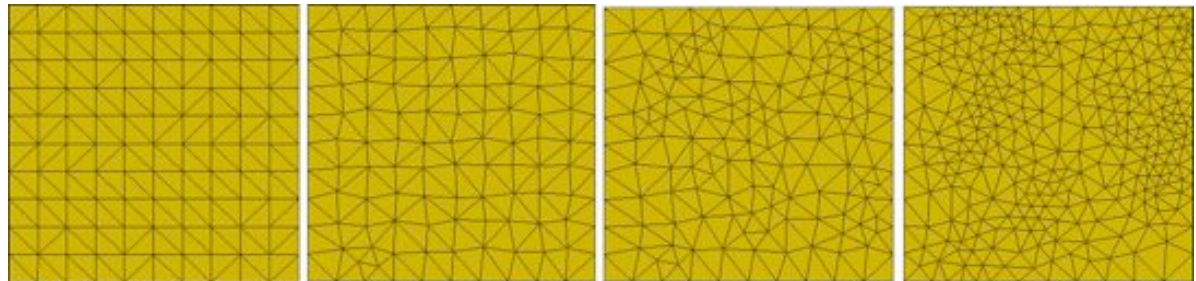
# Convergence with refinement is also guaranteed and mesh independent

Test solved functions against known analytic functions

$$\Delta^k \mathbf{u} = \Delta^k \mathbf{u}_t$$

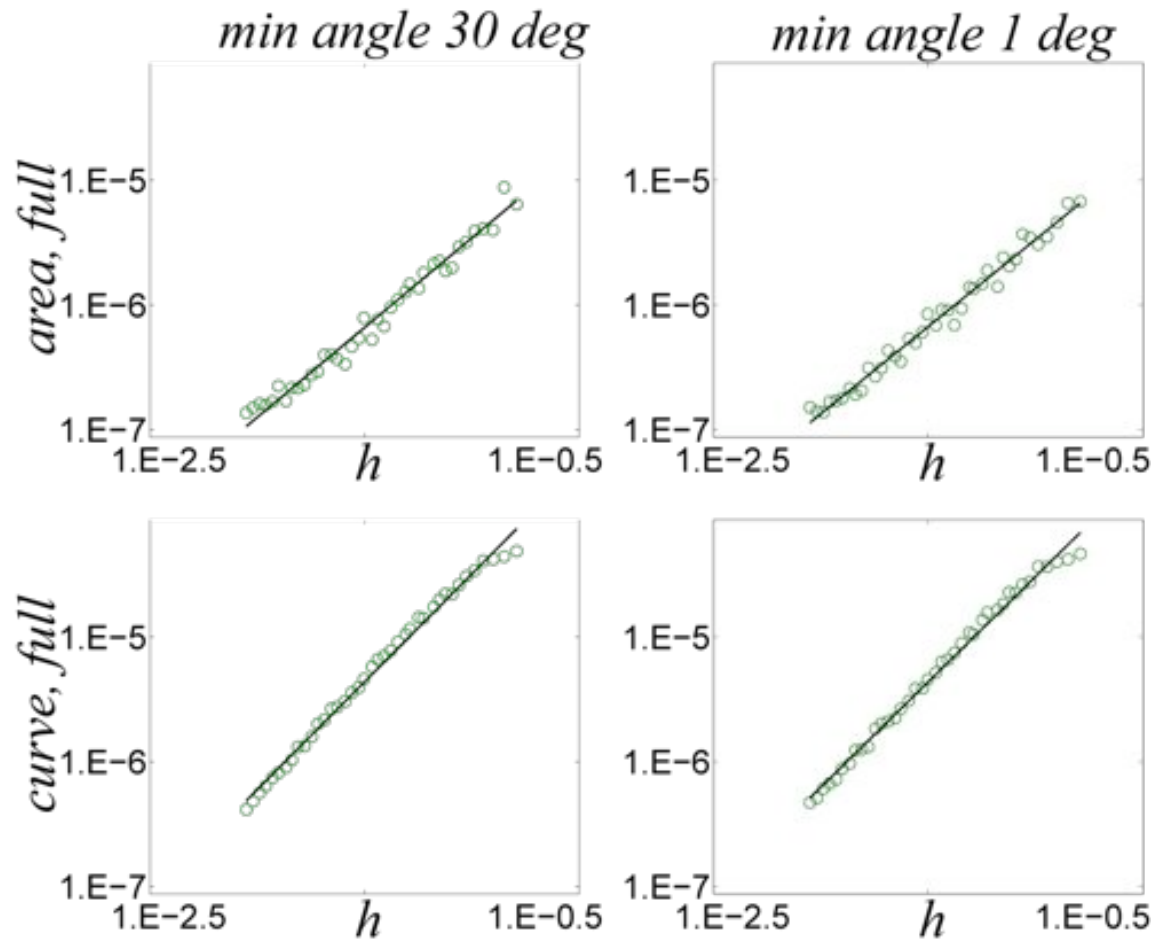
$$\text{error} = \|\mathbf{u} - \mathbf{u}_t\|$$

Over varying mesh resolution and irregularity

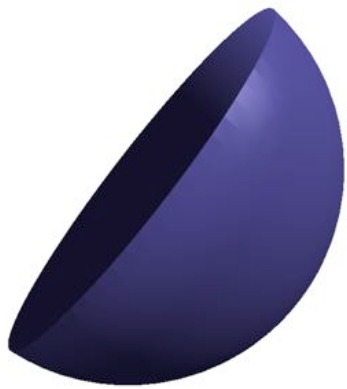


# Observe nearly optimal convergence for biharmonic

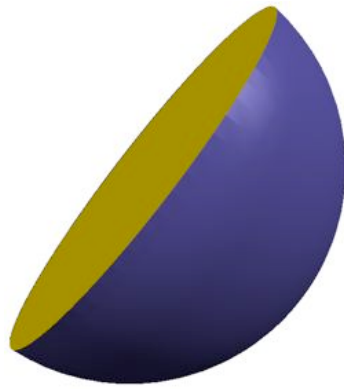
Boundary types don't have affect on convergence



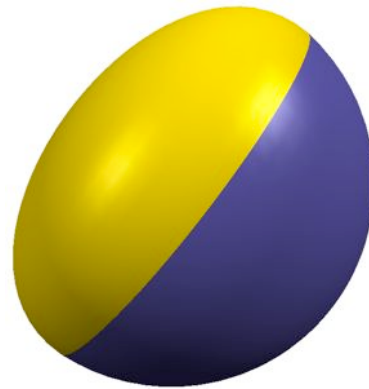
High-order PDEs are more suitable for completing surfaces



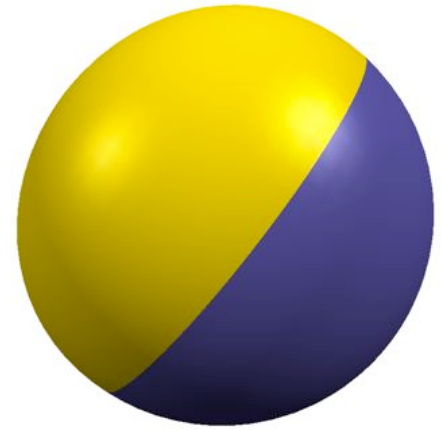
original



$\Delta u$



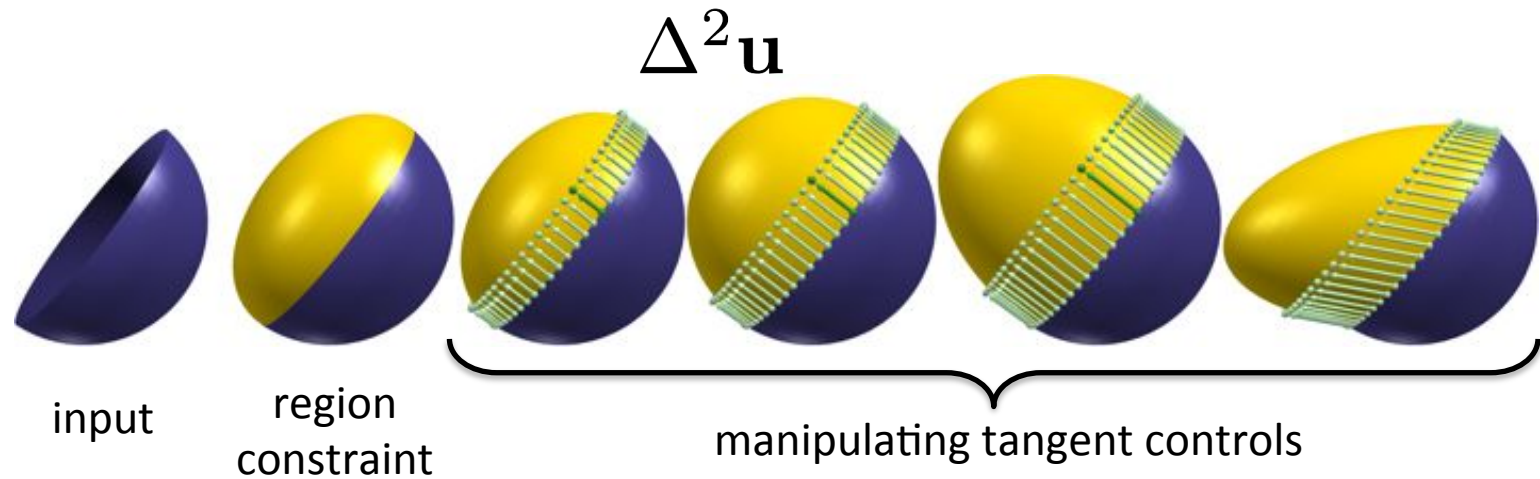
$\Delta^2 u$



$\Delta^3 u$



# High-order PDEs are more suitable for completing surfaces





# High-order PDEs are more suitable for completing surfaces

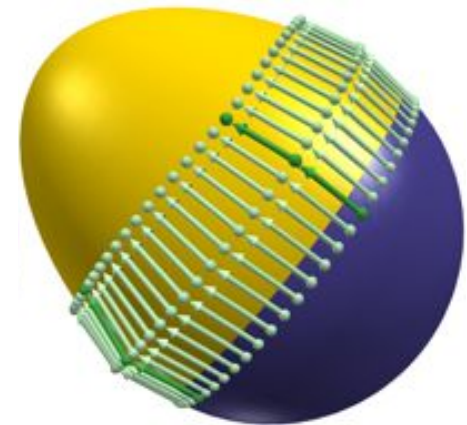
$$\Delta^3 u$$



input

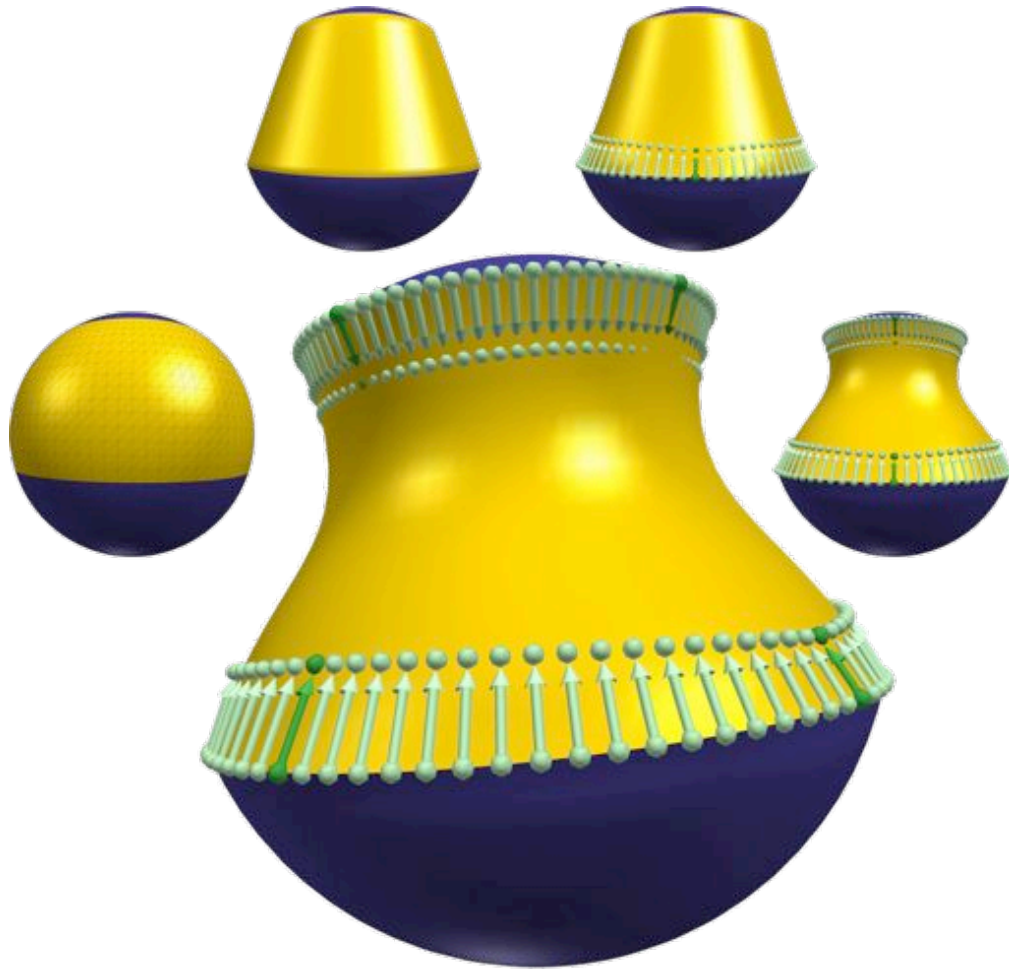


region  
constraint

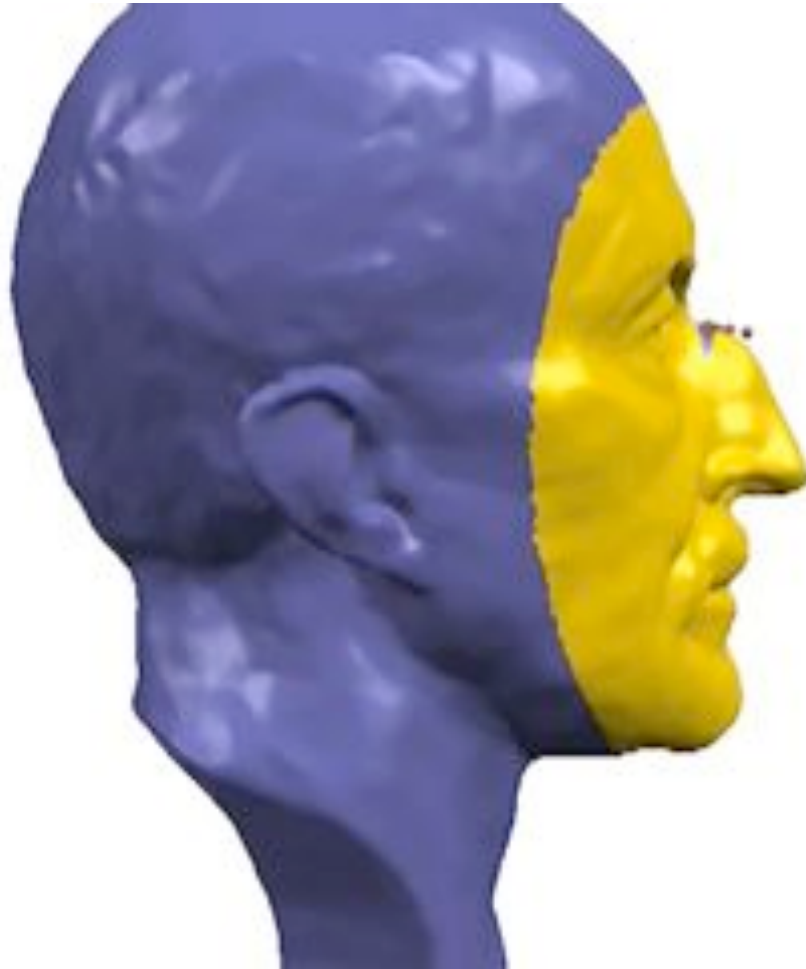


manipulating curvature  
controls

Specifying derivatives adds greater control to shape manipulation



Specifying curvatures adds even greater control to shape manipulation



Curve boundaries well suited for  
draw-and-drag manipulation



# We provide a discretization technique for high-order energies or PDEs

Reduce to low order using new constrained variables

Use same constraint structure to enforce region conditions

Convergence high-order PDEs, with discretization independence

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Future Work:

Improve convergence of triharmonic solution

Effect of non-flat metric

We gratefully acknowledge our  
funding

This work was supported in part by an NSF  
award IIS- 0905502.



# Mixed Finite Elements for Variational Surface Modeling

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