



CHARMS: A Simple Framework for Adaptive Simulation

SIGGRAPH 2002

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Outline

- ***Background***
- Motivation (Element vs. Basis Refinement)
- Implementation
 - Definitions
 - Data Structures
 - Algorithms
- Example Applications
- Conclusion

Adaptive Solvers

- Focus computational **resources**
- Improve **scalability**
- Improve **accuracy**
- Generally difficult to **implement**

Finite Difference Method

- Approximate the solution domain by a **discrete grid of uniformly spaced nodes**
- System of **algebraic equations** with references to **adjacent nodes**
- **Adaptive** discretization is generally very **difficult**

[<http://csep1.phy.ornl.gov/CSEP/BF/NODE8.html>]

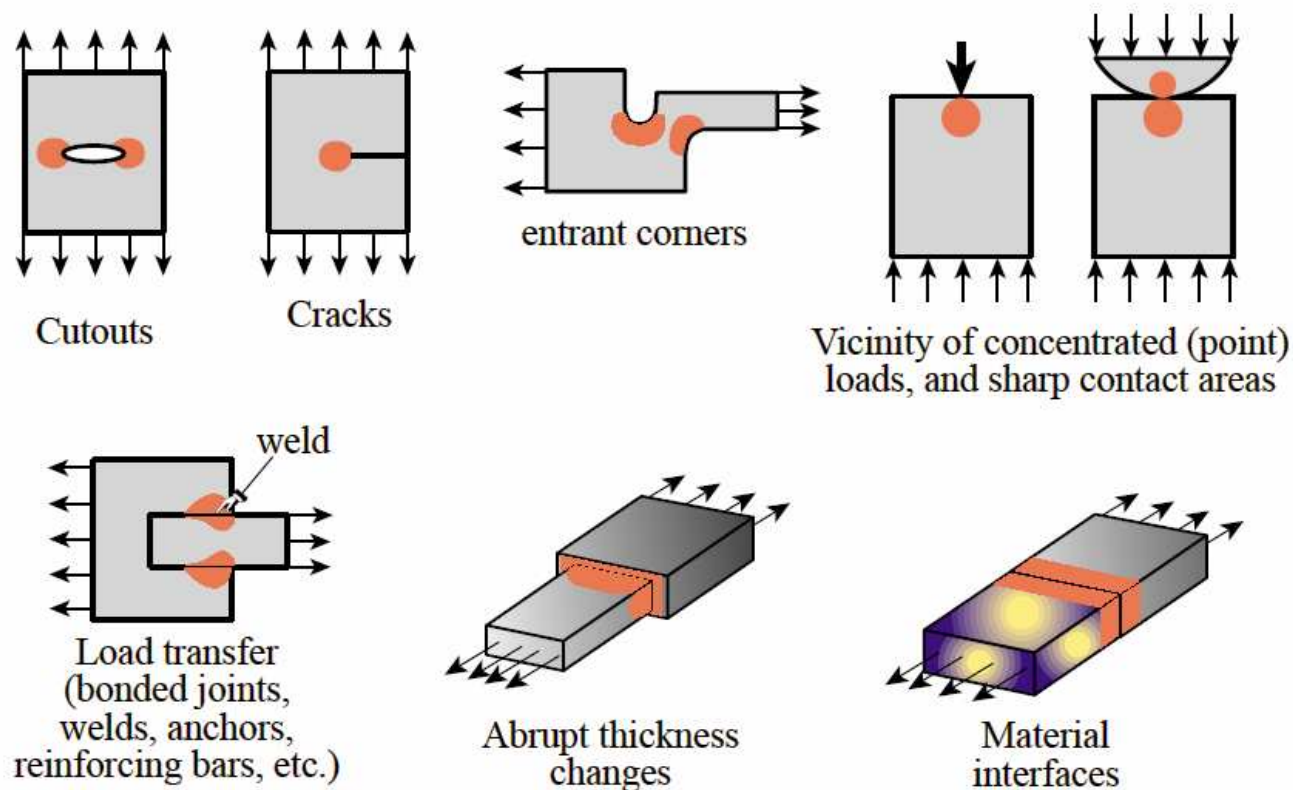
Finite Element Method

- More **robust, accurate** and with more **mathematical background**
- Discretize the solution domain by a number of **uniform or non-uniform finite elements** connected by nodes
- An **interpolation function** is used to approximate the change of the dependent variable

[<http://csep1.phy.ornl.gov/CSEP/BF/NODE8.html>]

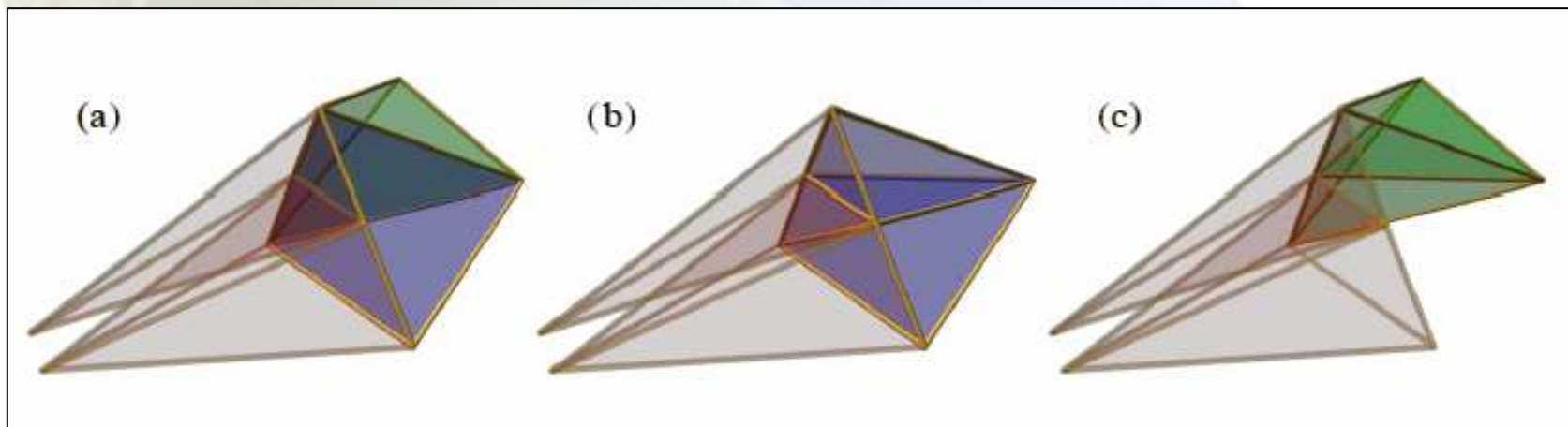
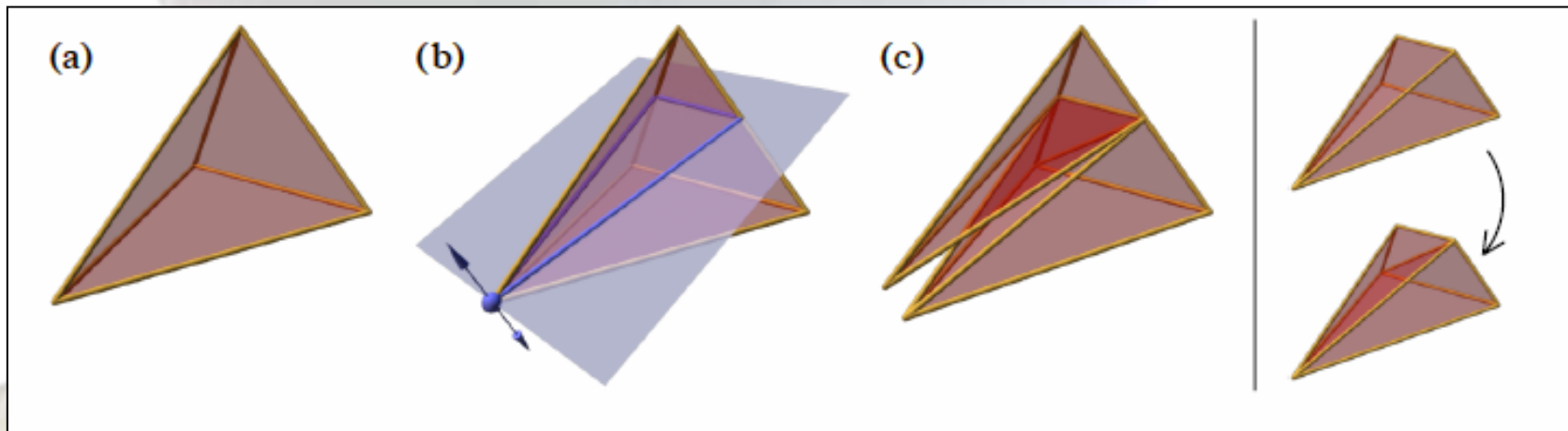
Finite Element Modeling

Where Finer Meshes Should be Used



[<http://titan.colorado.edu/courses.d/IFEM.d>]

Finite Element Refinement



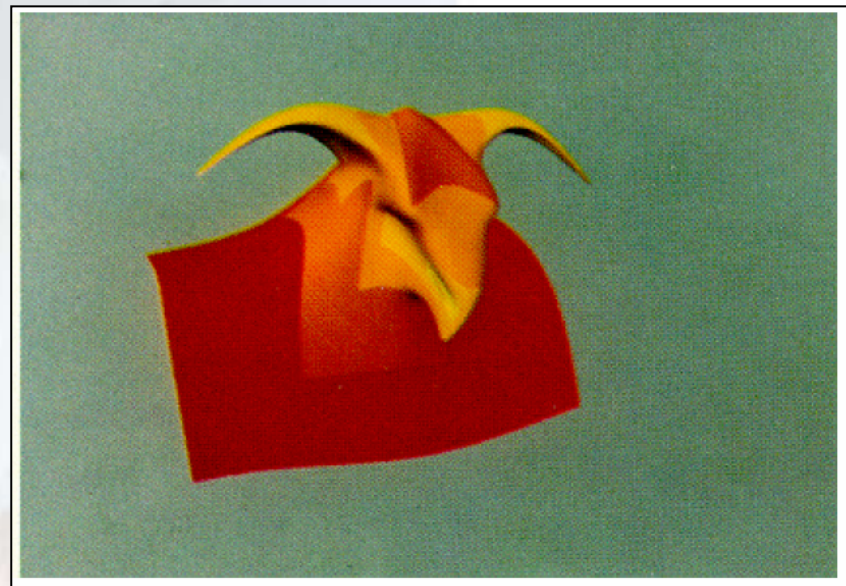
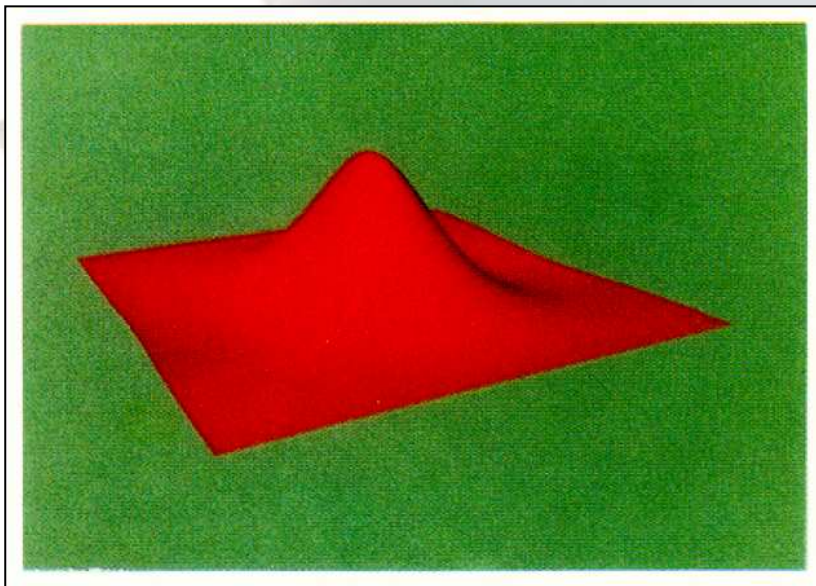
[O'Brien and Hodgins, SIGGRAPH 99]

Previous Mesh Refinement Algorithms

- Split elements in **isolation**
 - Leads to **incompatibility**
- Element type **dependant**
- Lack of a **general approach**
- Implementation **complexity**

Previous Mesh Refinement Algorithms

- Usage of **hierarchical splines** in an FE solver



[Forsey and Bartels, SIGGRAPH 88]

C.H.A.R.M.S.

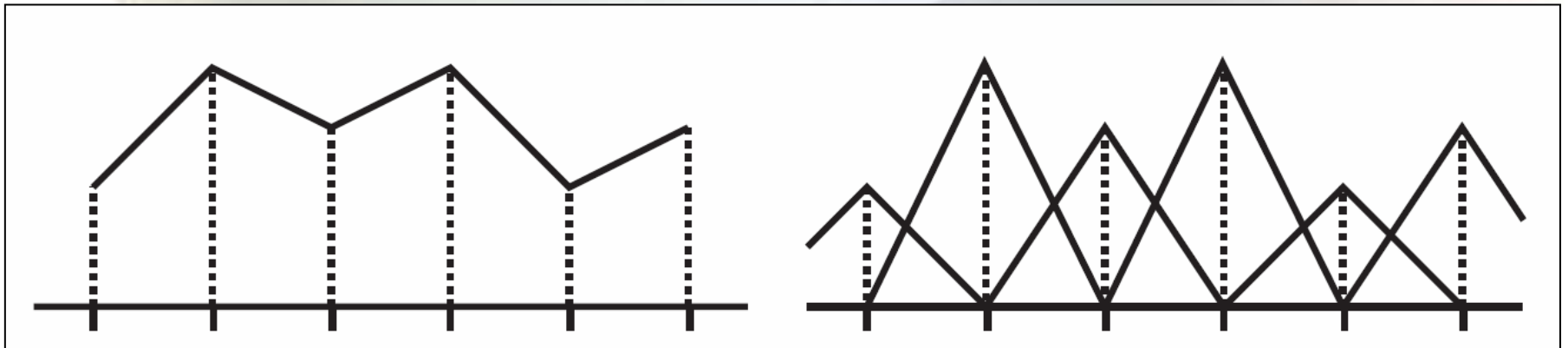
- **Conforming, Hierarchical, Adaptive Refinement Methods**
- Basic principle: **Refine basis functions**, not elements
- **Independent of:**
 - **Domain dimension** (2D and 3D)
 - **Element type** (triangle, quad, tetrahedron, etc)
 - **Basis function order**
- **Simple algorithms** for refinement and un-refinement

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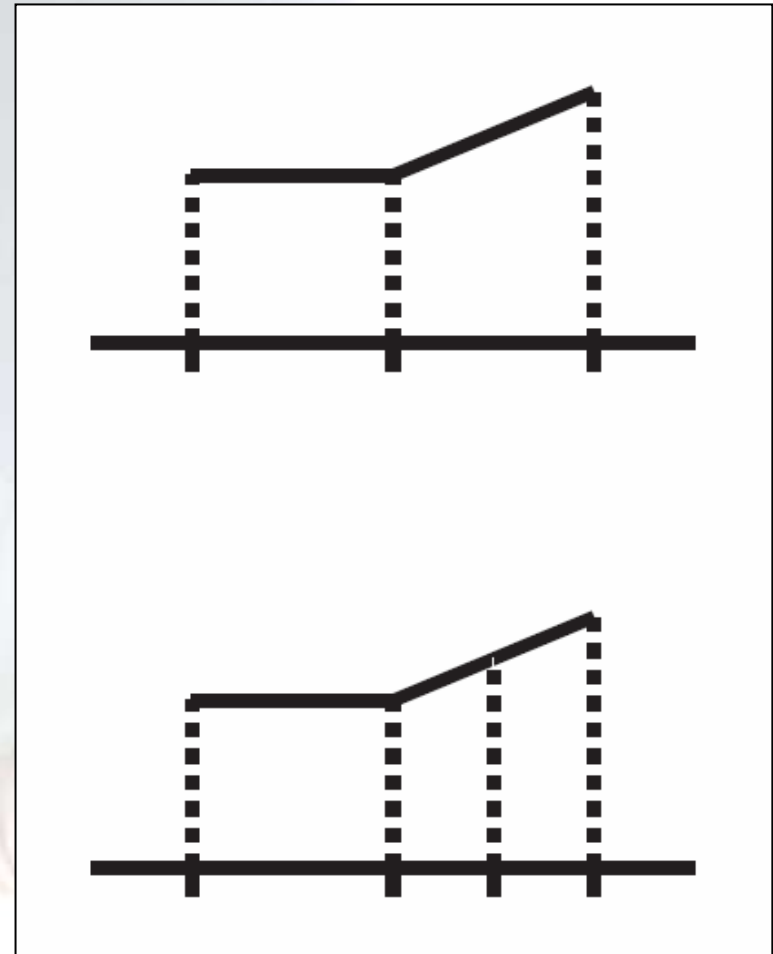
Element vs. Basis Refinement

- **Piecewise linear approximation in 1D:**
 - **Finite Element:** Linear interpolation between endpoints
 - **Basis Function:** Linear combination of linear B-spline functions



Element Refinement

- **Refinement:** Element bisection
- **Un-refinement:** Merge a pair of elements



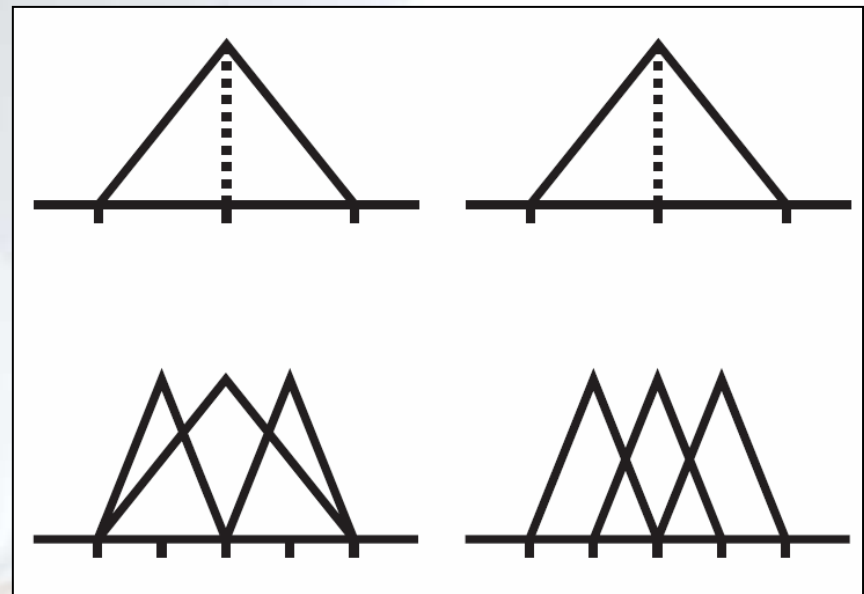
The background of the slide features three pillows. One is a light blue-grey color and is positioned at the top. Below it, to the left, is a white pillow. To the right of the white pillow is a light pinkish-beige pillow. The pillows are slightly out of focus and overlap each other.

Basis Refinement

- **Refinement:** Add finer basis functions to reduce error
- **Un-refinement:** Remove the introduced functions

Basis Refinement

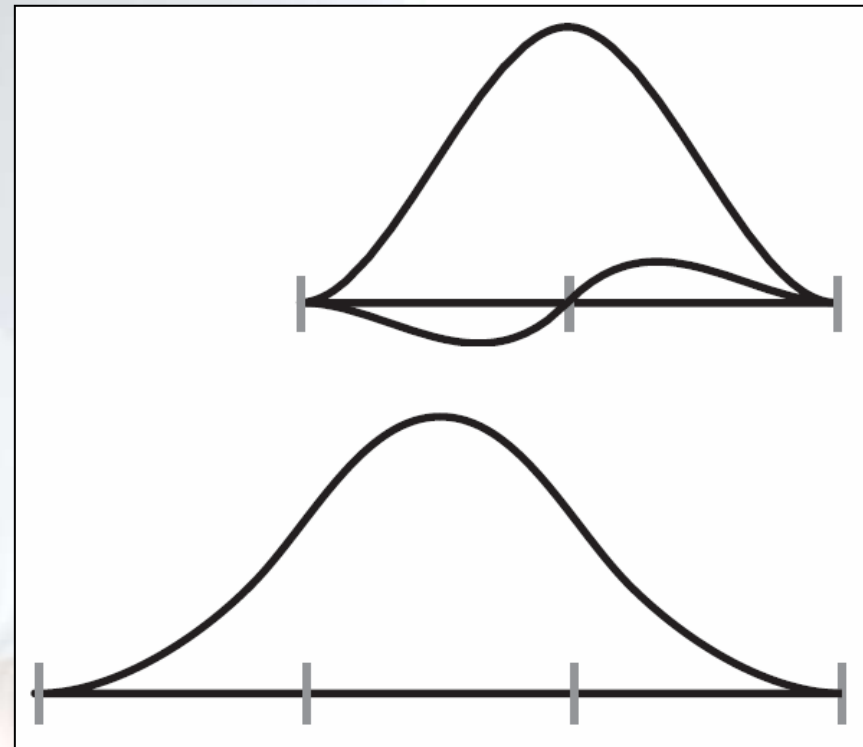
- **Hierarchical:** Add finer basis function in the middle of an element
- **Quasi-hierarchical:** Replace a basis function by three finer ones



Element vs. Basis Refinement

Higher order approximation in 1D:

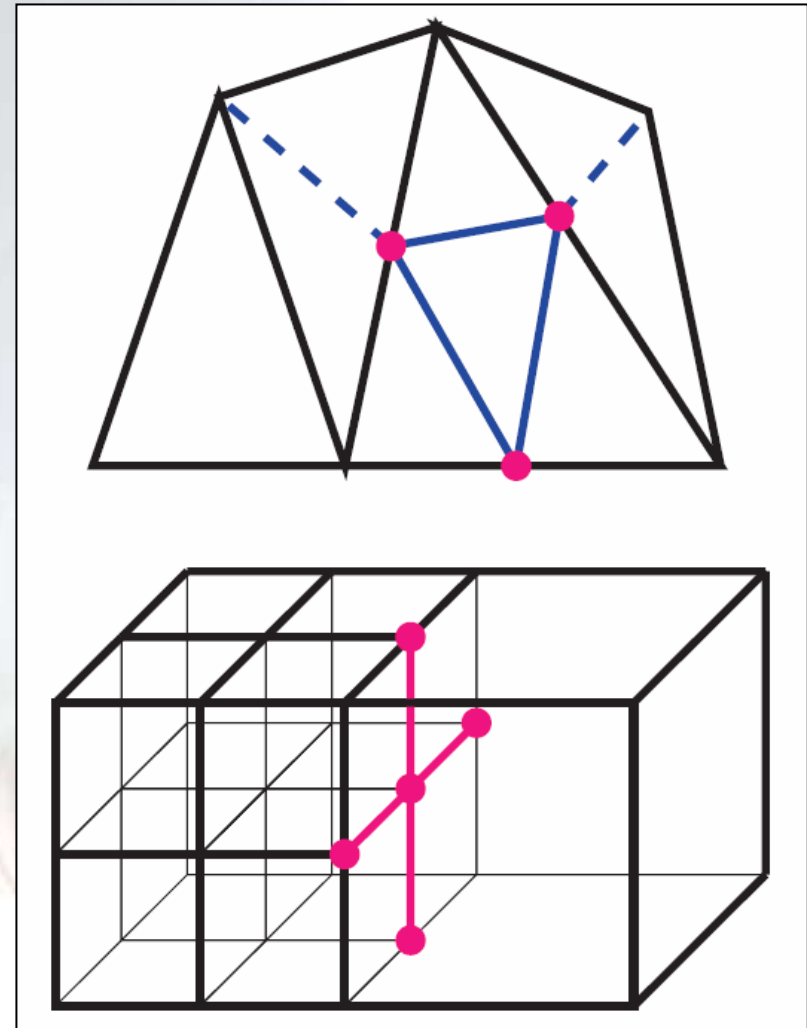
- **Finite Element:**
 - **Hermite cubic splines:** Can work on elements in isolation but **increases the DOFs** of our solution space
 - **Quadratic B-splines:** Cannot work on elements in isolation because **basis function overlaps** more than one element
- **Basis Function:**
 - Both can be refined



Element vs. Basis Refinement

Piecewise linear
approximation in **2D**:

- **Finite Element:**
 - Quadrisect big triangles
 - Leads to T-vertices
 - Fix by adding conforming edges
- **Basis Function:**
 - Quadrisect globally
 - Get nodal basis functions



Element vs. Basis Refinement

- **Element refinement** becomes **impossible** as the number of dimensions or approximation order is **increased**
- **Basis refinement** applies to any **refinable function space** (Refinable functions: coarser basis can be represented as a **linear combination** of finer basis functions)

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One Basic Framework

IntegratePDE

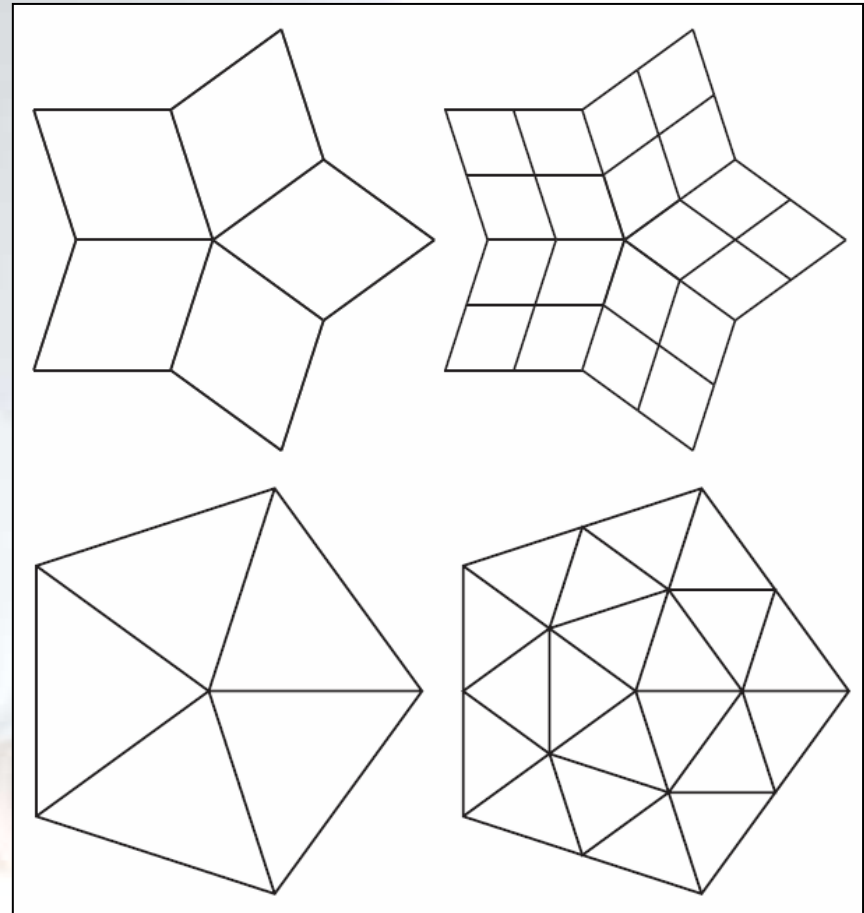
```
1  While  $t < t_{end}$   
2    predict: measure error and construct sets  $\mathcal{B}^+$  and  $\mathcal{B}^-$   
3    adapt:  
4       $\mathcal{B} := \mathcal{B} \cup \mathcal{B}^+ \setminus \mathcal{B}^-$   
5      maintain basis: remove redundant functions from  $\mathcal{B}$   
6    solve:  $\mathbf{R}_t(\mathbf{u}_t) = \mathbf{0}$   
7     $t := t + \Delta t$ 
```

Definitions

- **Topological entities** of a mesh:
 - **Vertices**, $V = \{ v_i \}$
 - **Edges**, $E = \{ e_j \}$
 - **Faces**, $F = \{ f_k \}$
 - **Cells**, $C = \{ c_l \}$
- **Mesh**: triangle, quad, tetrahedra and hexahedra
- **Element**: faces or cells

Definitions

- **Coefficients** used to associate the mesh with **basis** functions
- **Coefficients** may live at any of the **topological entities**, usually at the vertices
- **Topological refinement operator**: Splits topological entities to **refine a mesh**



Definitions

- **Coefficient refinement operator:**
 - Computes coefficients for finer mesh
 - Based on coefficients from coarser mesh
 - Linear
 - Finitely supported
- **Subdivision scheme:** pairing of topological and coefficient refinement operators

Three pillows are visible in the background, slightly out of focus. One is light blue, one is light green, and one is light pink. They are arranged in a way that they appear to be floating or resting on a white surface.

Definitions

- **Even coefficients:** live on vertices the finer mesh inherits from the coarser mesh
- **Odd coefficients:** live on newly created vertices

Definitions

- **Refinement relation:** a basis function from a coarser level can be written as a **linear combination** of basis functions from the next finer level

$$\phi_i^{(j)}(x) = \sum_k a_{ik}^{(j+1)} \phi_k^{(j+1)}(x)$$

Definitions

- **Children** of a basis function:

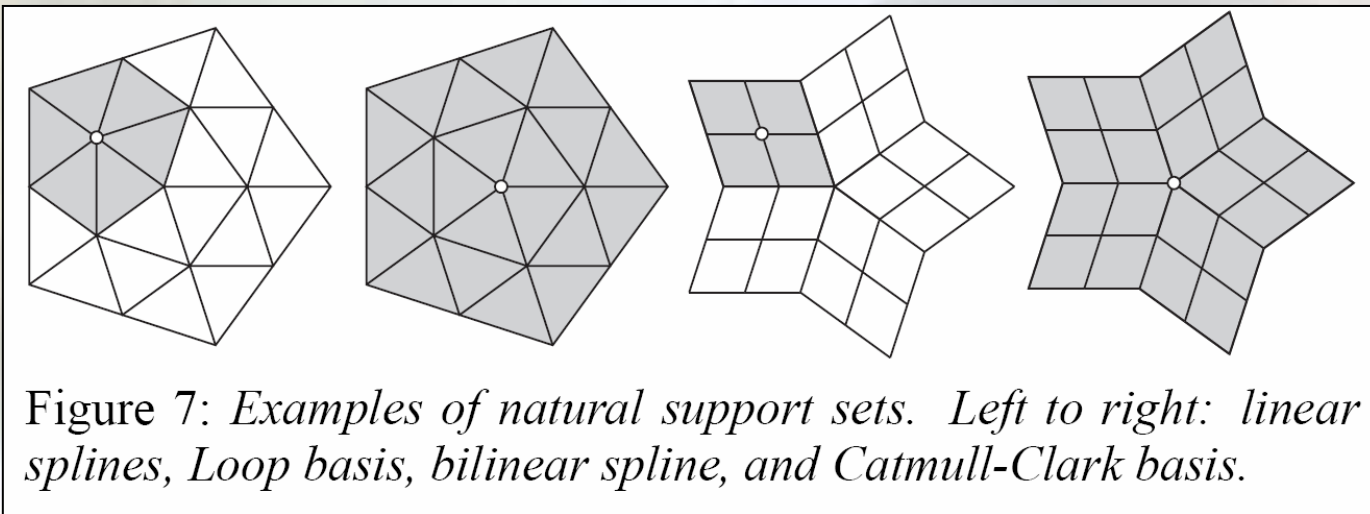
$$\mathcal{C}(\phi_i^{(j)}) = \{\phi_k^{(j+1)} \mid a_{ik}^{(j+1)} \neq 0\}$$

- **Parents** of a basis function:

$$\mathcal{C}^*(\phi_i^{(j)}) = \{\phi_k^{(j-1)} \mid \phi_i^{(j)} \in \mathcal{C}(\phi_k^{(j-1)})\}$$

Definitions

- **Natural support set** $[S(\varphi_i^{(j)})]$:
 - Minimal set of elements at level j that contain the parametric support of the basis function
- **Adjoint** $[S^*(\varepsilon_j)]$:
 - Set of basis whose natural support contain ε_j



Definitions

- **Descendants of an element $[D(\varepsilon_i^j)]$:**
 - **Elements at levels $> j$** which have non-zero intersection with the given element
- **Adjoint $[D^*(\varepsilon_i^j)]$:**
 - **Ancestor relation**

Data Structures

- Set of **active basis functions**: B
- Set of **active integration elements**: ε
- Set of active functions that overlap an element:
 - **Same level**: $B^s(\varepsilon)$
 - **Ancestor levels**: $B^a(\varepsilon)$

Data Structures

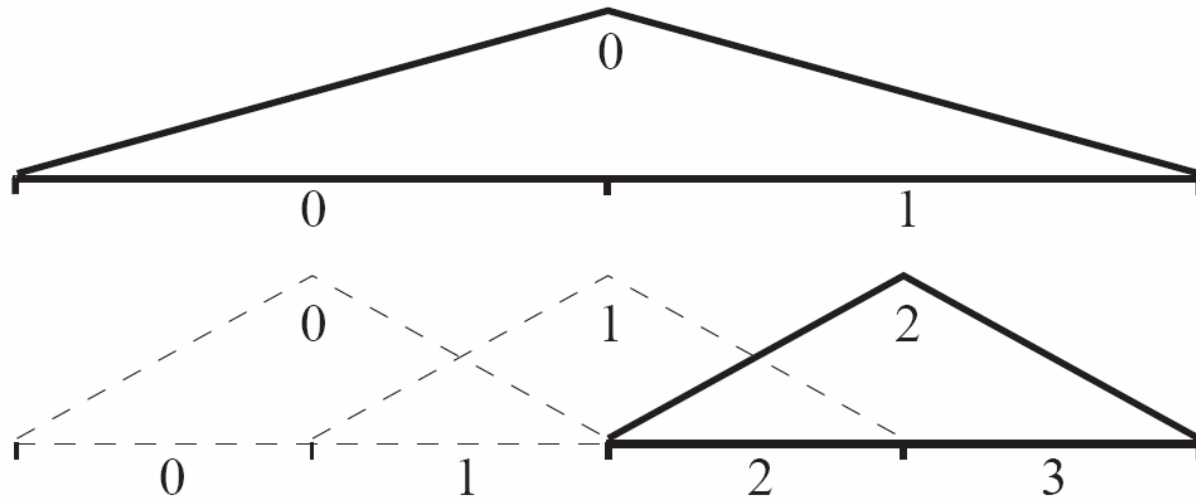


Figure 8: *Illustrative example of the data structures. Shown in bold are a pair of active basis functions on mesh levels 0 and 1. The associated data structures are: $\mathcal{B} = \{\phi_0^{(0)}, \phi_2^{(1)}\}$, $\mathcal{E} = \{\varepsilon_0^0, \varepsilon_2^1, \varepsilon_3^1\}$, $\mathcal{S}(\phi_0^{(0)}) = \{\varepsilon_0^0, \varepsilon_1^0\}$, $\mathcal{S}(\phi_2^{(1)}) = \{\varepsilon_2^1, \varepsilon_3^1\}$, $B^s(\varepsilon_0^0) = \{\phi_0^{(0)}\}$, $B^a(\varepsilon_0^0) = \emptyset$, $B^s(\varepsilon_2^1) = \{\phi_2^{(1)}\}$, $B^a(\varepsilon_2^1) = \{\phi_0^{(0)}\}$, $B^s(\varepsilon_3^1) = \{\phi_2^{(1)}\}$, $B^a(\varepsilon_3^1) = \{\phi_0^{(0)}\}$.*

Algorithms

- Compute the **stiffness matrix** (for the FE solver) by **iterating over active elements** and **computing local interactions**

ComputeStiffness(\mathcal{E})

1 **ForEach** $\varepsilon \in \mathcal{E}$ **do**

2 **ForEach** $\phi \in B^s(\varepsilon)$ **do**

3 $k_{\phi\phi} += \text{Integrate}(\phi, \phi, \varepsilon)$

4 **ForEach** $\psi \in B^s(\varepsilon) \setminus \{\phi\}$ **do**

5 $k_{\phi\psi} += \text{Integrate}(\phi, \psi, \varepsilon)$

6 $k_{\psi\phi} += \text{Integrate}(\psi, \phi, \varepsilon)$

7 **ForEach** $\psi \in B^a(\varepsilon)$ **do**

8 $k_{\phi\psi} += \text{Integrate}(\phi, \psi, \varepsilon)$

9 $k_{\psi\phi} += \text{Integrate}(\psi, \phi, \varepsilon)$

Algorithms

- Over the solution process, basis functions are **activated** and **deactivated**

Activate(ϕ)

```
1   $\mathcal{B} \cup = \{\phi\}$ 
2  ForEach  $\varepsilon \in \mathcal{S}(\phi)$  do
3     $B^s(\varepsilon) \cup = \{\phi\}$ 
4    // upon activation initialize ancestor list
5    If  $\varepsilon \notin \mathcal{E}$  then  $B^a(\varepsilon) \cup = \text{Ancestor}(\varepsilon); \mathcal{E} \cup = \{\varepsilon\}$  fl
6    // add to ancestor lists of active descendants
7    ForEach  $\gamma \in (\mathcal{D}(\varepsilon) \cap \mathcal{E})$  do  $B^a(\gamma) \cup = \{\phi\}$ 
```

Ancestor(ε)

```
1   $\rho := \emptyset$ 
2  ForEach  $\gamma \in \mathcal{D}^*(\varepsilon) \cap \mathcal{E}$  do
3     $\rho \cup = B^s(\gamma) \cup B^a(\gamma)$ 
4  return  $\rho$ 
```


Algorithms

Deactivate(ϕ)

```
1   $\mathcal{B} \setminus = \{\phi\}$ 
2  ForEach  $\varepsilon \in \mathcal{S}(\phi)$  do
3     $B^s(\varepsilon) \setminus = \{\phi\}$ 
4    // deactivate element?
5    If  $B^s(\varepsilon) = \emptyset$  then  $\mathcal{E} \setminus = \{\varepsilon\}$ 
6    // update ancestor lists of active descendants
7    ForEach  $\gamma \in \mathcal{D}(\varepsilon) \cap \mathcal{E}$  do  $B^a(\gamma) \setminus = \{\phi\}$ 
```

Algorithms

- Assuming we have an appropriate **error estimator** we can have **adaptive solver strategies** on top of **activate**

HierarchicalRefine(ϕ)

```
1  ForEach  $\psi \in \mathcal{C}(\phi)$  do  
2    If  $\psi \notin \mathcal{B} \wedge \text{Odd}(\psi)$  then Activate( $\psi$ ) ;  $u_\psi := 0$  fi
```

HierarchicalUnrefine(ϕ)

```
1  ForEach  $\psi \in \mathcal{C}(\phi)$  do  
2    If  $\psi \notin \mathcal{B} \wedge \text{Odd}(\psi)$  then Deactivate( $\psi$ )
```

QuasiHierarchicalRefine(ϕ)

```
1  Deactivate( $\phi$ )  
2  ForEach  $\psi \in \mathcal{C}(\phi)$  do  
3    If  $\psi \notin \mathcal{B}$  then Activate( $\psi$ ) ;  $u_\psi := 0$  fi  
4     $u_\psi += a_{\phi,\psi} u_\phi$ 
```

QuasiHierarchicalUnrefine(ϕ)

```
1  Activate( $\phi$ ) ; initialize  $u_\phi$   
2  ForEach  $\psi \in \mathcal{C}(\phi)$  do  
3    If  $\psi \notin \mathcal{B}$  then Deactivate( $\psi$ )
```

Algorithms

- Things to add to complete a simulator:
 - **Standard solvers** for the resulting algebraic systems
 - Appropriate **error estimators**
 - A **numerical integration** routine

Outline

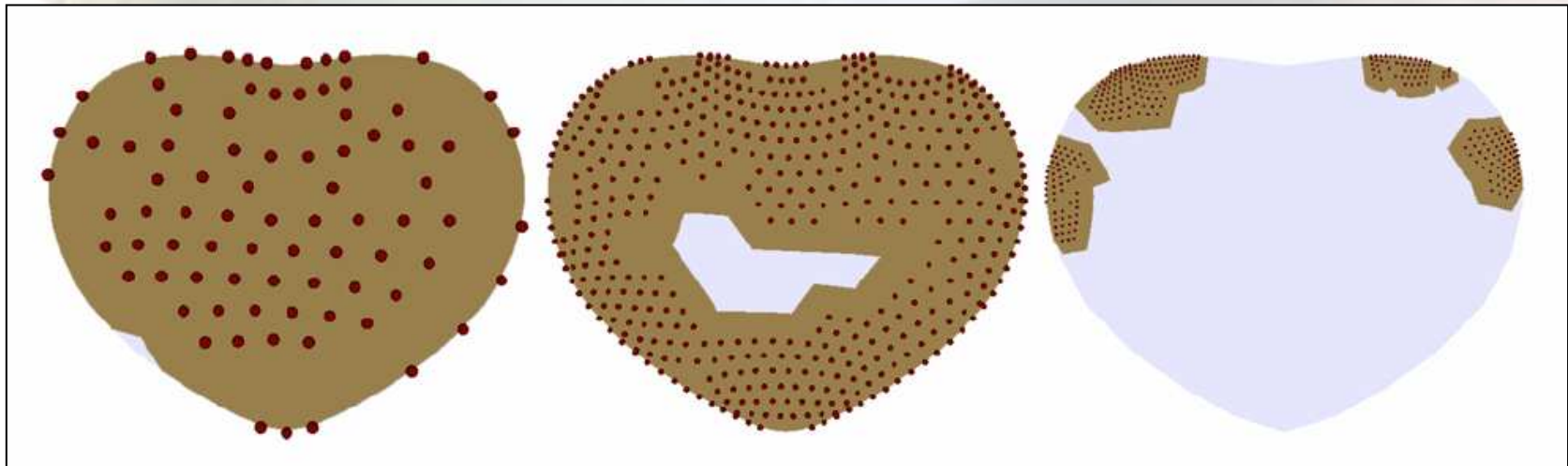
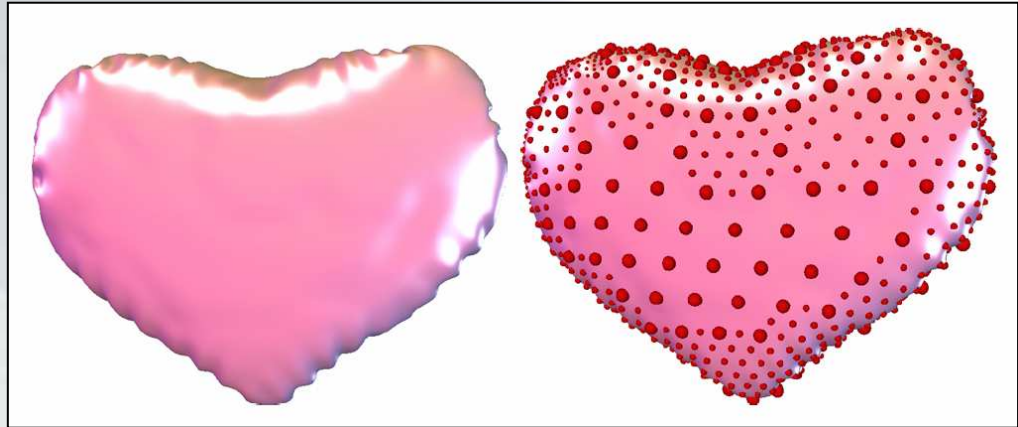
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Example Applications

- Application domains:
 - **Animation**
 - **Modeling**
 - **Engineering**
 - **Medical simulation/visualization**

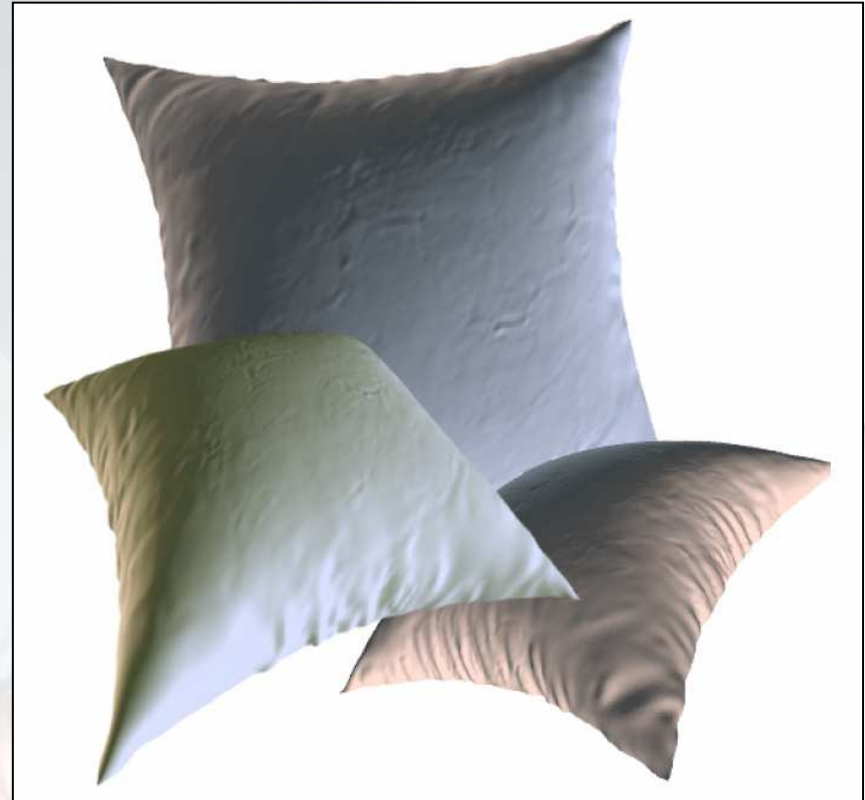
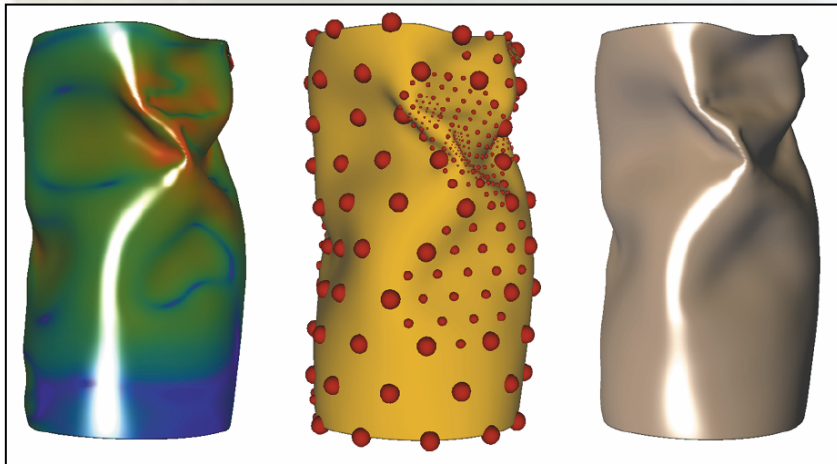
Example Application: Thin-Shells

- Inflating balloon
- Poking balloon

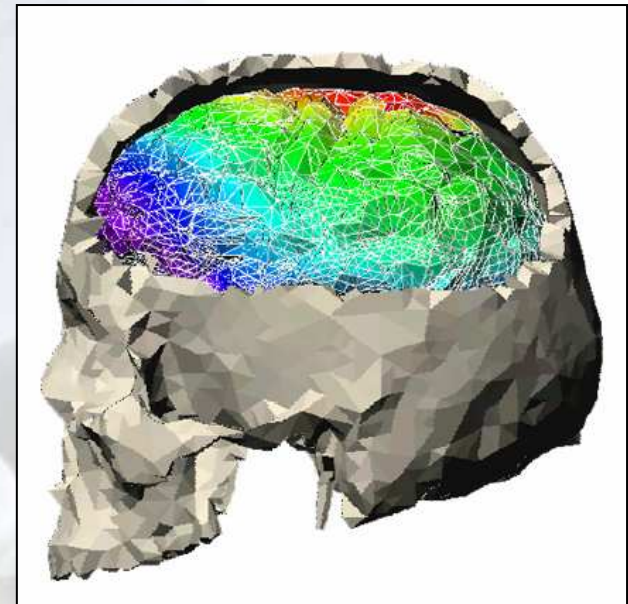
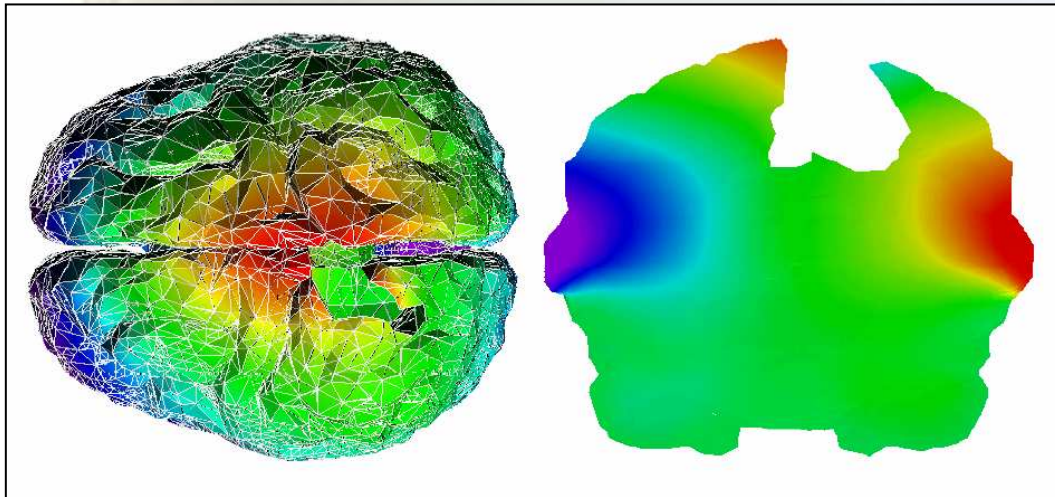
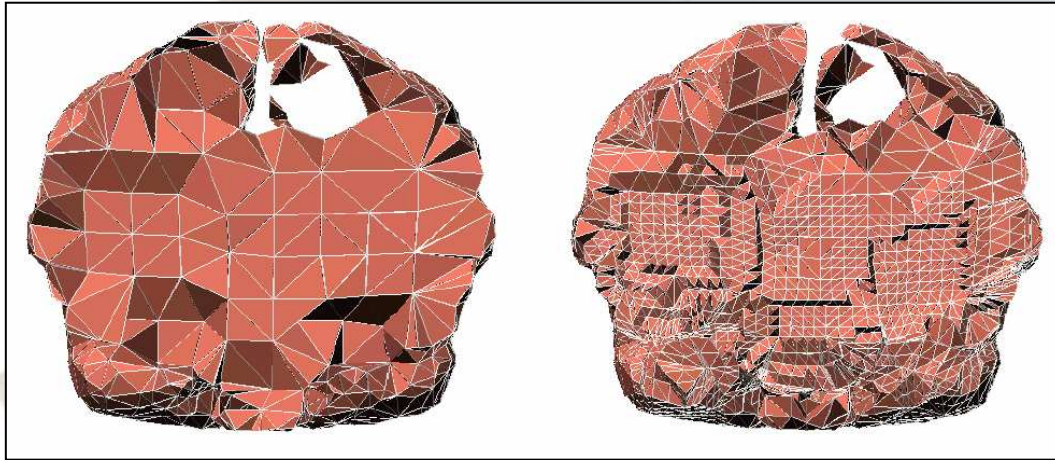


Example Application: Thin-Shells

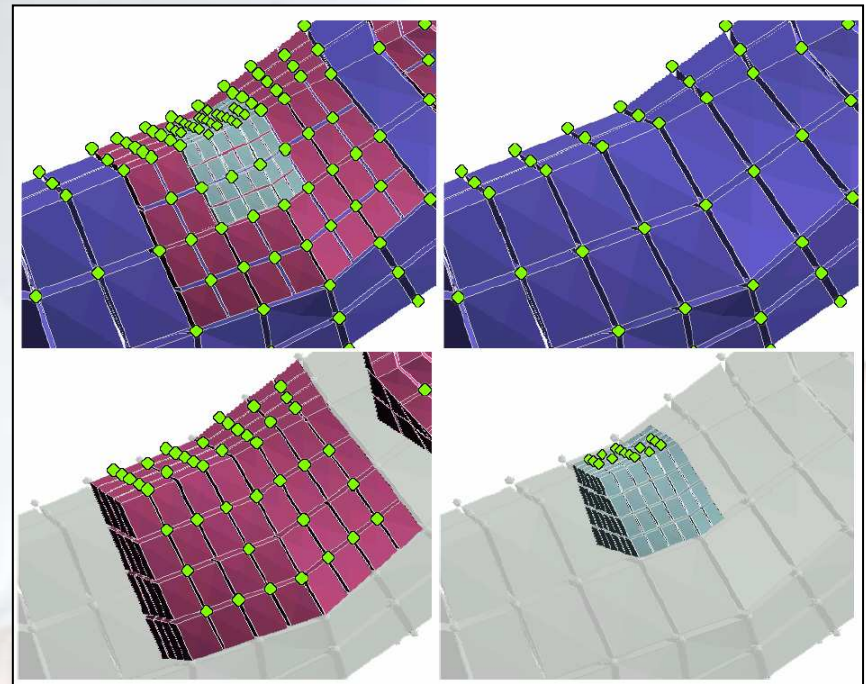
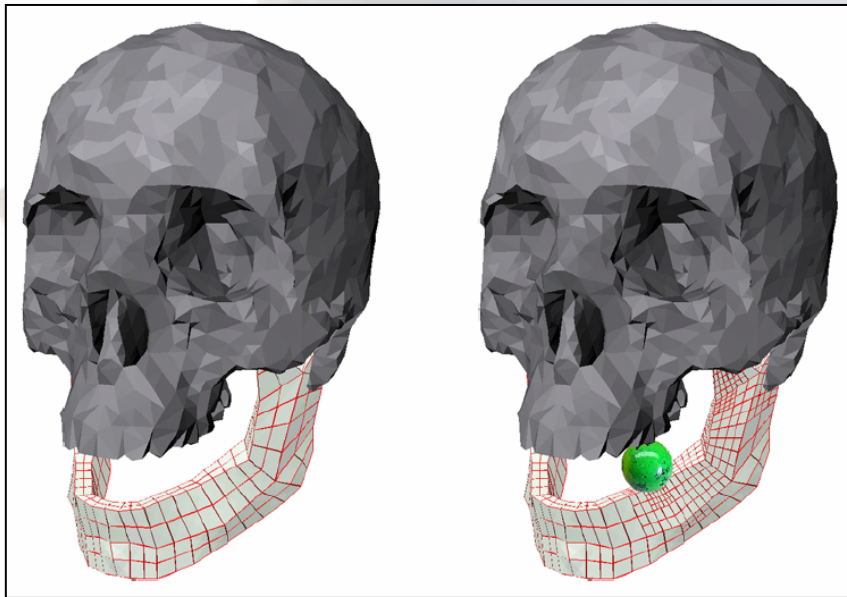
- Pillows
- Crushing cylinder



Example Application: Surgery Aid



Example Application: Human Jaw



Conclusion

- **Simple framework** for constructing **adaptive solvers** for PDEs
- **Applications** in CG, engineering and bio-medical computing
- Uses refinability of **basis functions**
- **Easy implementation**
- No element-wise **compatibility** issues
- Avoids popping in **animation** during refinement