

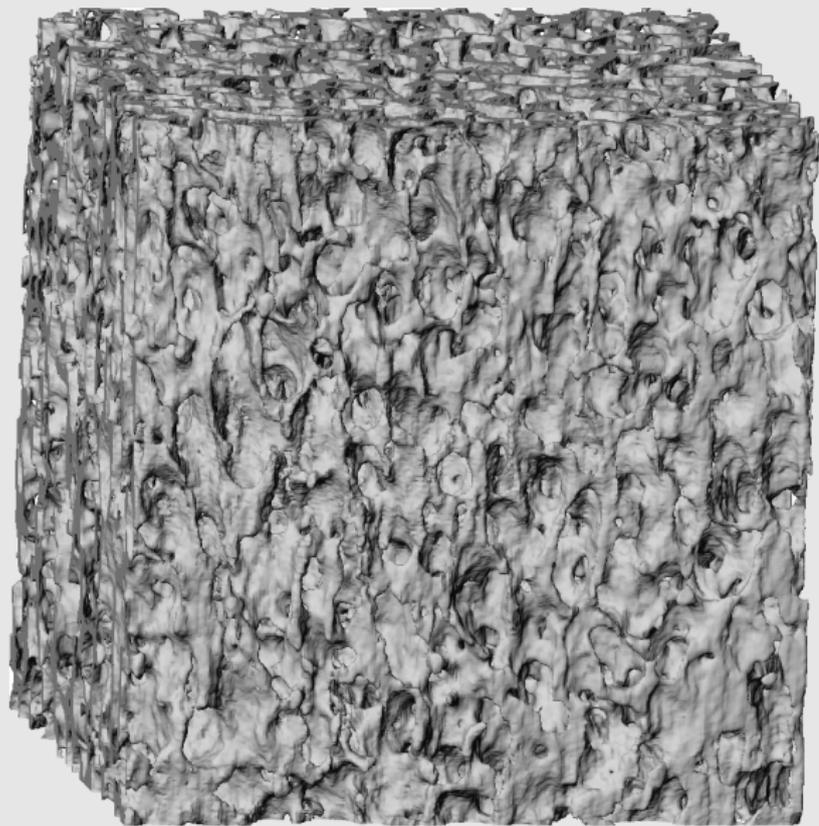
# Composite Finite Elements for Complicated Microstructures

Lars Ole Schwen

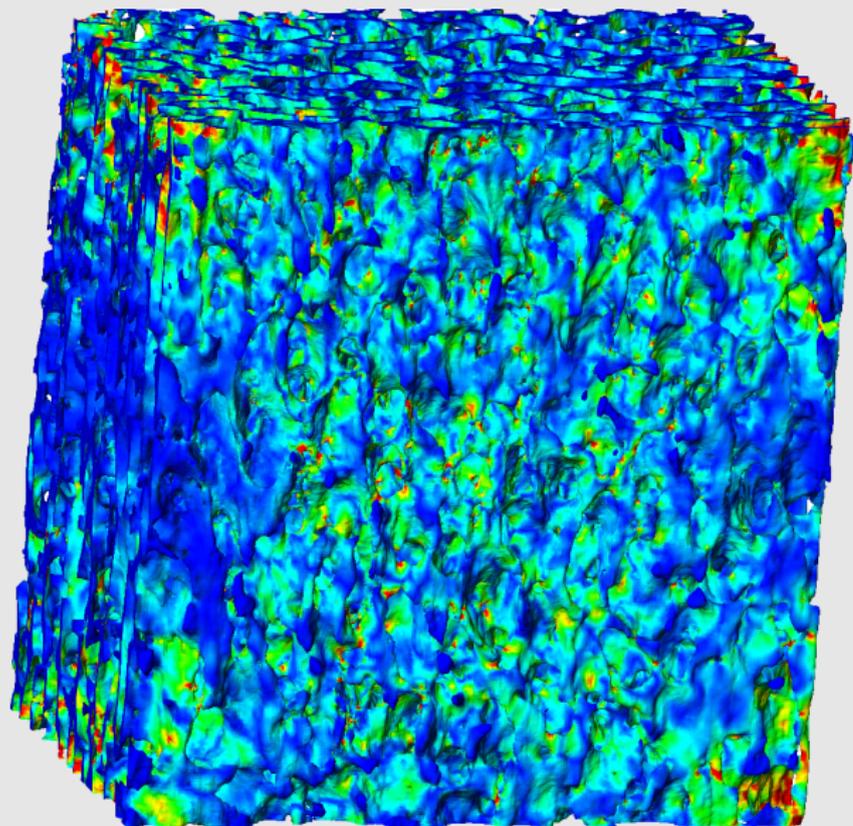
Institute for Numerical Simulation, University of Bonn

CdE-Seminar Siegburg, 2006-11-11

# Goal: Complicated Microstructure



# Goal: Complicated Microstructure, Elastically Deformed



# Outline

## Finite Elements in 1D

Steady State Heat Conduction

Error Estimates

Steps for a Finite Element Computation

## Finite Elements in 2D and 3D

Classification of Grids

Structured Grids

Unstructured Grids

Comparison

## Composite Finite Elements

Geometry Extraction from Images

Construction of CFE Grids

CFE Basis Functions

## Outlook



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# Finite Elements

- ▶ used to numerically solve partial differential equations
- ▶ powerful method
- ▶ efficient computations



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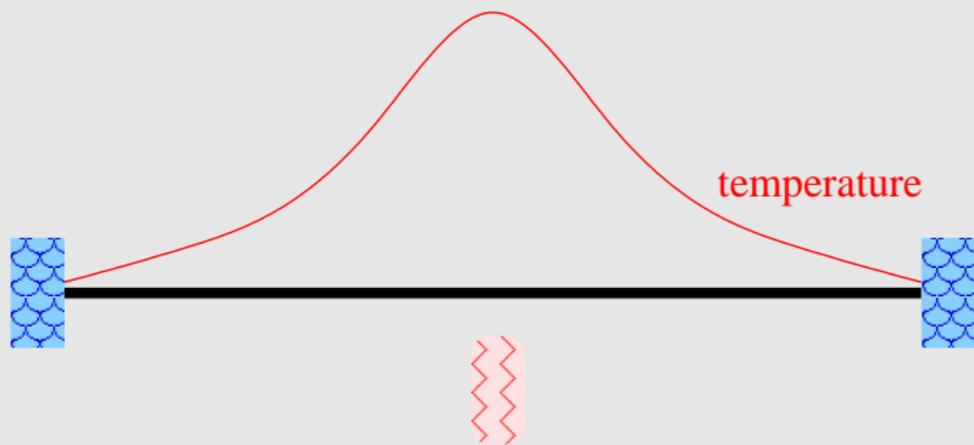
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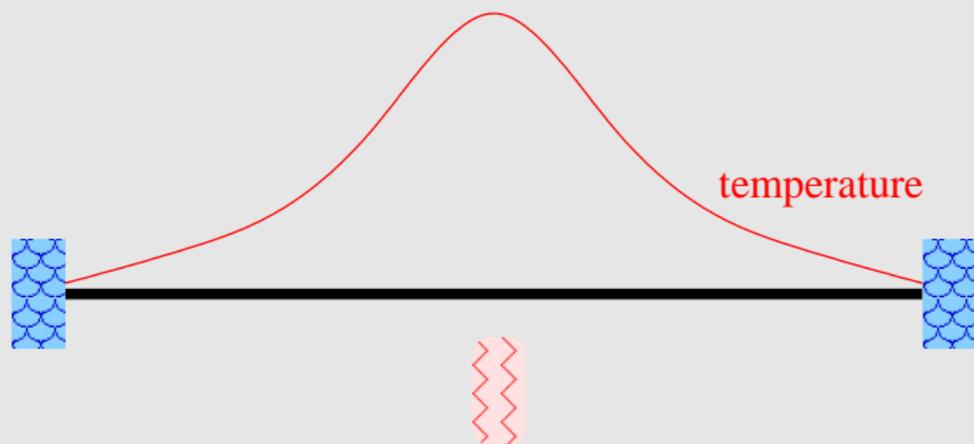
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# Steady State Heat Conduction



# Steady State Heat Conduction



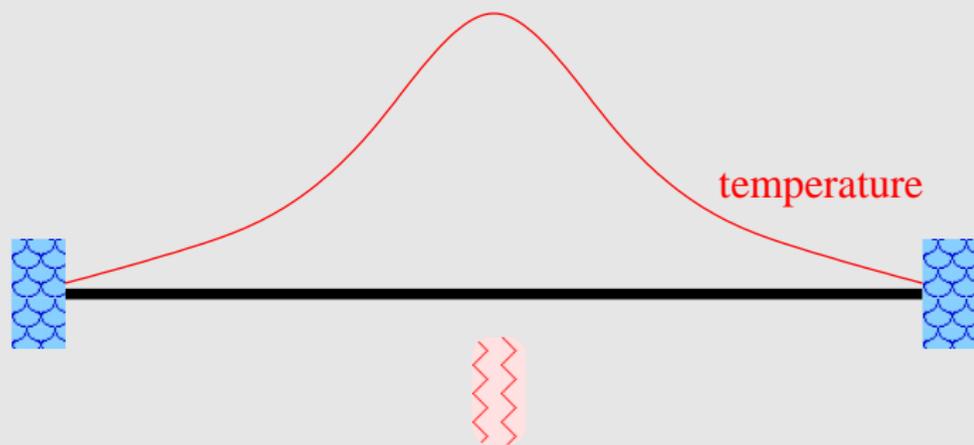
Find  $u : \Omega = [0, 1] \rightarrow \mathbb{R}$  so that

$$-u''(x) = f(x) \quad \text{in } (0, 1)$$

$$u(0) = 0$$

$$u(1) = 0$$

# Steady State Heat Conduction



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$$-u''(x) = f(x) \quad \text{in } (0, 1)$$

$$u(0) = 0$$

$$u(1) = 0$$

Do we need  $u \in C^2(\Omega)$ ?

# Weak Equation

$$-u''(x) = f(x)$$



# Weak Equation

$$\begin{aligned} & -u''(x) = f(x) \\ \iff & \int_{\Omega} -u''\psi = \int_{\Omega} f\psi \quad \forall \psi \in H_0^1(\Omega) \end{aligned}$$

# Weak Equation

$$-u''(x) = f(x)$$

$$\iff \int_{\Omega} -u''\psi = \int_{\Omega} f\psi \quad \forall \psi \in H_0^1(\Omega)$$

$$\iff \int_{\Omega} u'\psi' + [u'(1)\psi(1) - u'(0)\psi(0)] = \int_{\Omega} f\psi \quad \forall \psi \in H_0^1(\Omega)$$

# Weak Equation

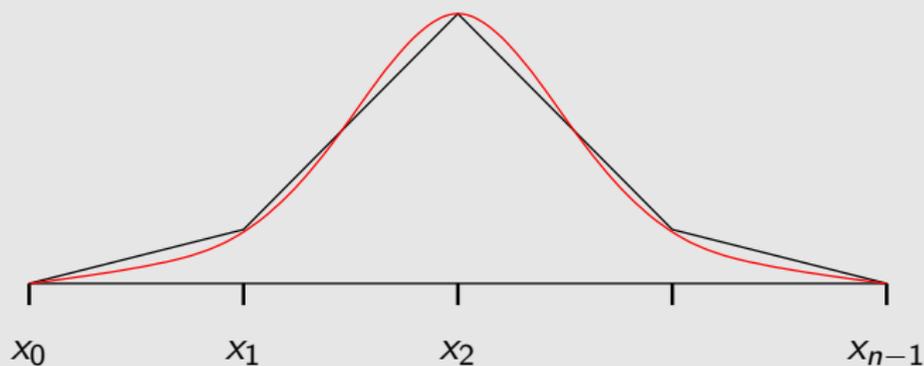
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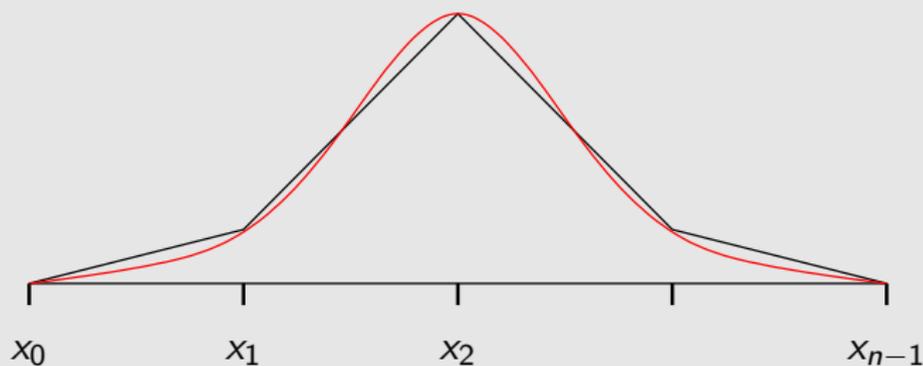
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# Discretization



Want to approximate  $u \approx u_h = \mathcal{I}[U]$

# Discretization



Want to approximate  $u \approx u_h = \mathcal{I}[U]$  with

- ▶  $U \in \mathbb{R}^n$ ,
- ▶  $U_i = u(x_i)$
- ▶  $\mathcal{I}$  piecewise linear interpolation

# Discretization

Interpolation:

$$u_h(x) = \mathcal{I}[U](x) = \sum_{j=0}^{n-1} U_j \cdot \phi_j(x)$$



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with

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- ▶  $\phi_j$  piecewise linear
- ▶  $\sum_{j=0}^{n-1} \phi_j(x) = 1 \forall x \in \Omega$

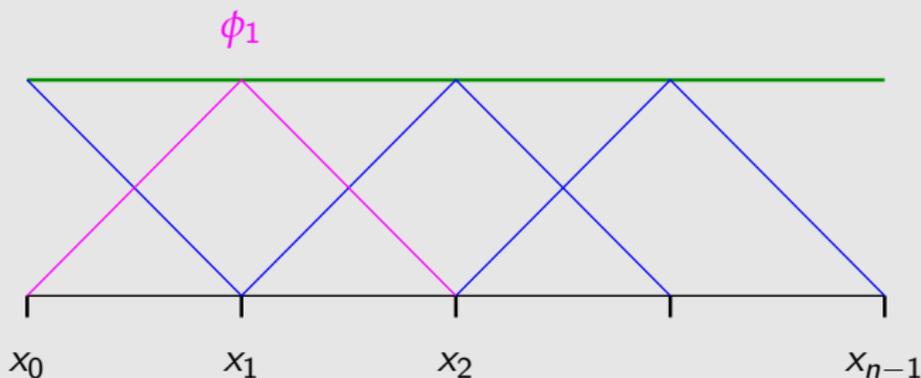
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# Discrete Equation

$$\int_{\Omega} u' \psi' = \int_{\Omega} f \psi \quad \forall \psi \in H_0^1(\Omega)$$

Discretize  $u$  and  $f$ , take basis functions  $\psi$  of corresponding finite-dimensional subspace of  $H_0^1(\Omega)$  only

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$$\sum_{j=0}^{n-1} U_j L_{ji} = \sum_{j=0}^{n-1} F_j M_{ji} \quad \forall i = 1, \dots, n-2$$

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$$\sum_{j=0}^{n-1} U_j L_{ji} = \sum_{j=0}^{n-1} F_j M_{ji} \quad \forall i = 1, \dots, n-2$$

plus boundary conditions ( $i = 0, i = n-1$ ):

$$L \cdot U = M \cdot F$$

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# Errors

- ▶ model, material parameters, ...:



# Errors

- ▶ model, material parameters, ... : not our problem



# Errors

- ▶ model, material parameters, ... : not our problem
- ▶ weak problem



# Errors

- ▶ model, material parameters, ... : not our problem
- ▶ weak problem
- ▶ discretization



# Errors

- ▶ model, material parameters, ... : not our problem
- ▶ weak problem
- ▶ discretization
- ▶ inexact solution of system



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# Steps for a Finite Element Computation

1. geometry:
2. grid:
3. basis Functions:
4. system of Equations:
5. interpretation of Result:

# Steps for a Finite Element Computation

1. geometry: rod
2. grid: equidistant points
3. basis Functions: hat functions
4. system of Equations: e. g. solved by CG
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# Steps for a Finite Element Computation

1. geometry: rod
2. grid: equidistant points
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We'll focus on 2 and 3.

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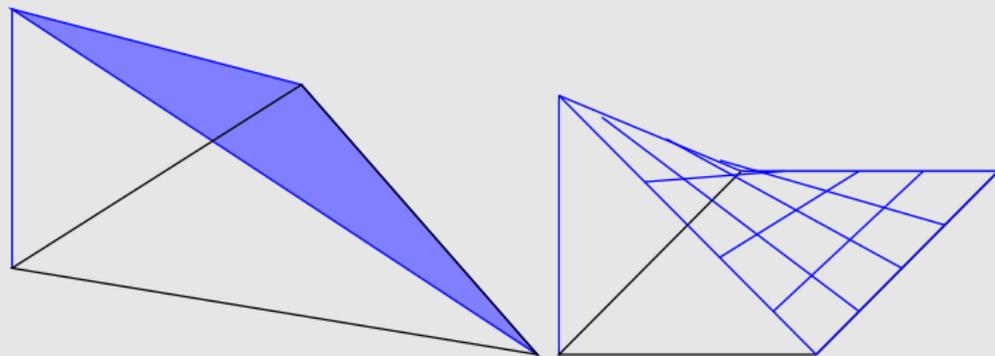
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# Generalization of “linear”

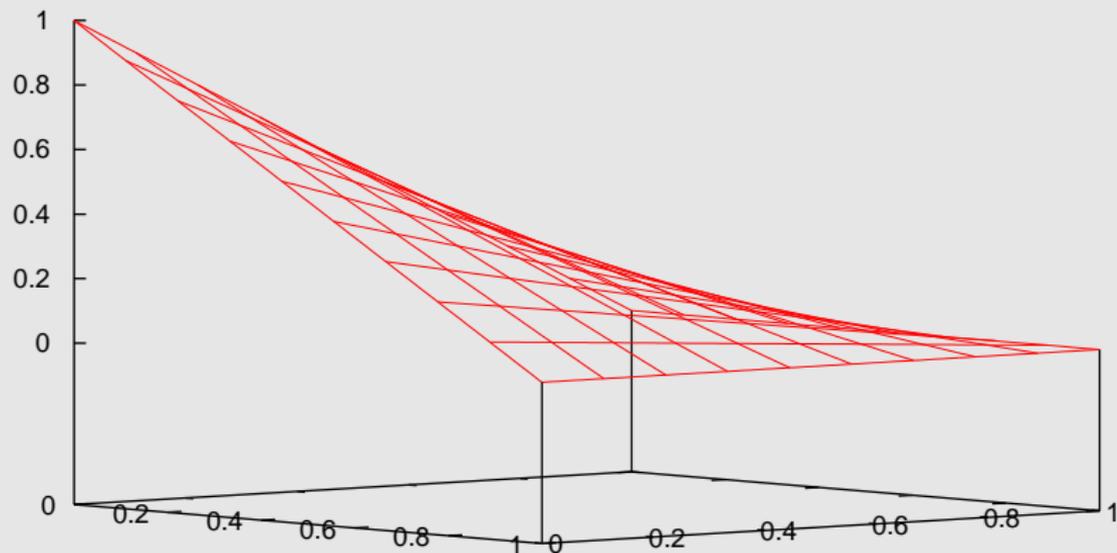
Two possibilities

- ▶ linear basis functions on triangles (tetrahedra, ...)
- ▶ multilinear bf on rectangles (cuboids, ...)



# Bilinear Basis Function

$$(1-x)^*(1-y)$$



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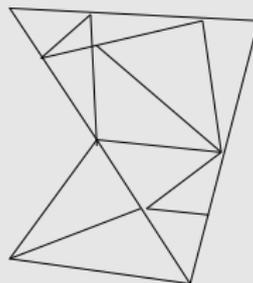
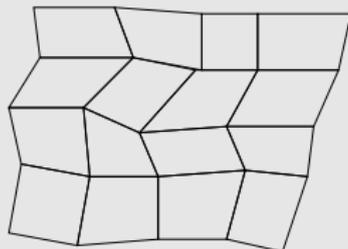
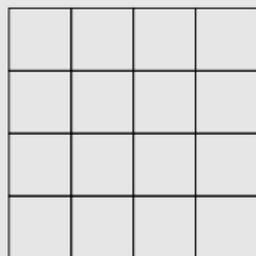
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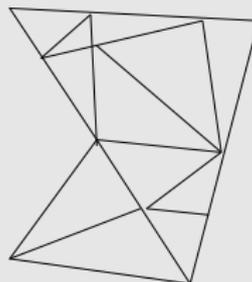
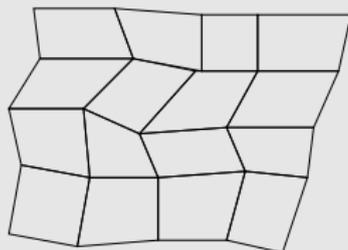
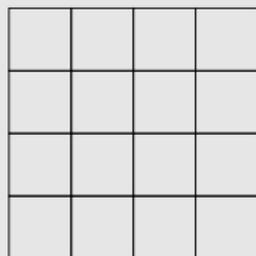
# Classification of Grids

- ▶ uniform grids: equal grid cells



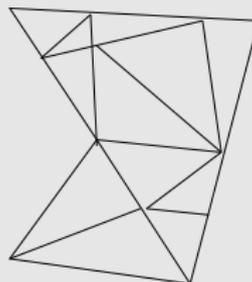
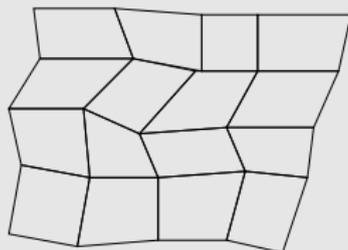
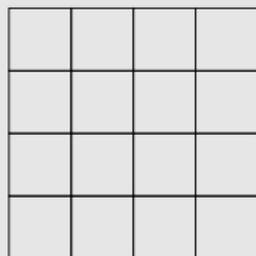
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- ▶ uniform grids: equal grid cells
- ▶ structured grids: same topology at each point



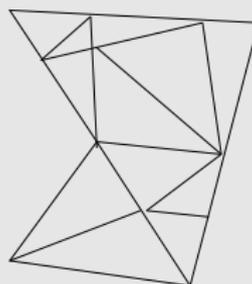
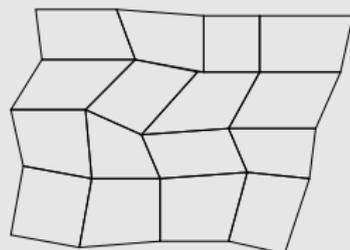
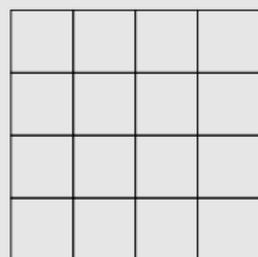
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- ▶ uniform grids: equal grid cells
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- ▶ unstructured grids



# Classification of Grids

- ▶ uniform grids: equal grid cells
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increasing geometric flexibility but increasing complexity

# Characteristics of Grids

1. how to generate?
2. geometrically useful?
3. how to describe?
4. how to refine?
5. how to coarsen?
6. numerically “nice”? “nice” system of equations?



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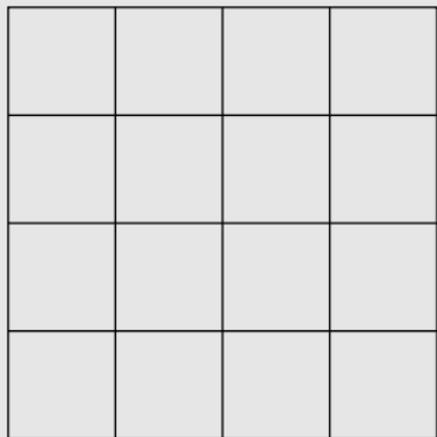
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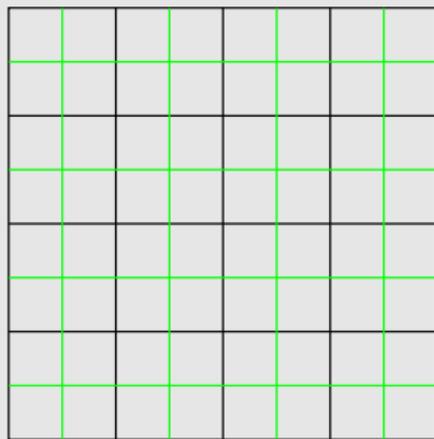
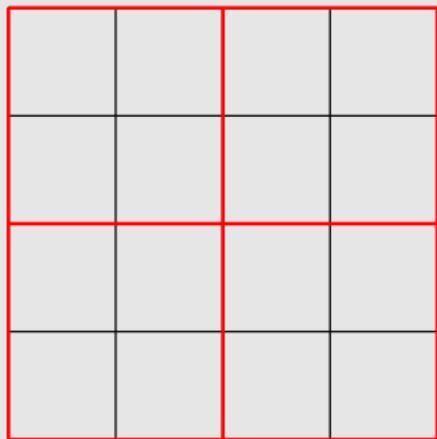
# Structured Grids



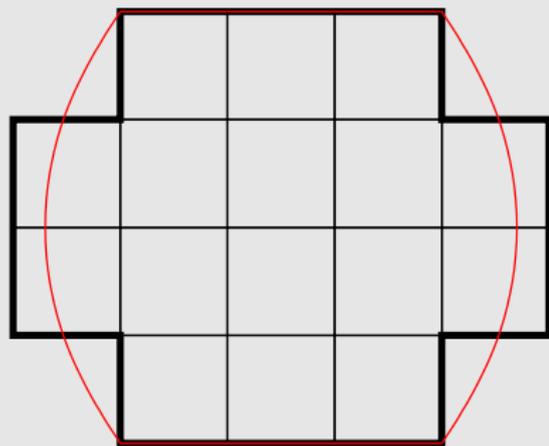
- ▶ easily generated and described implicitly
- ▶ sparse and structured system of equations



# Structured Grids: Coarsening and Refinement



## Structured Grids: Geometrically useful?



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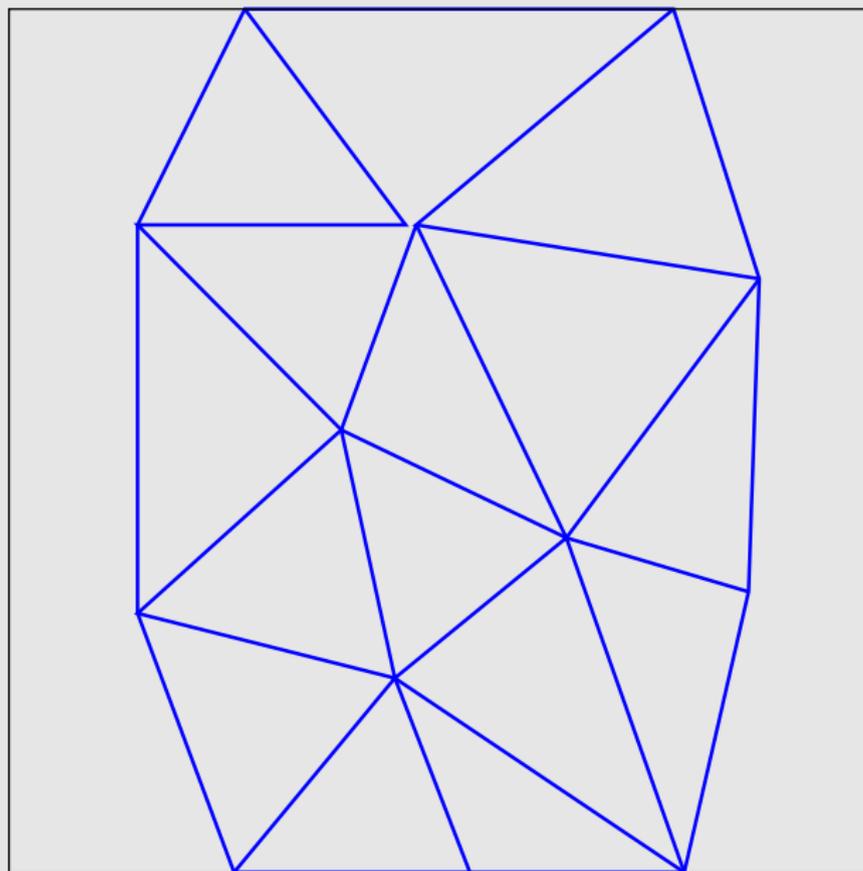
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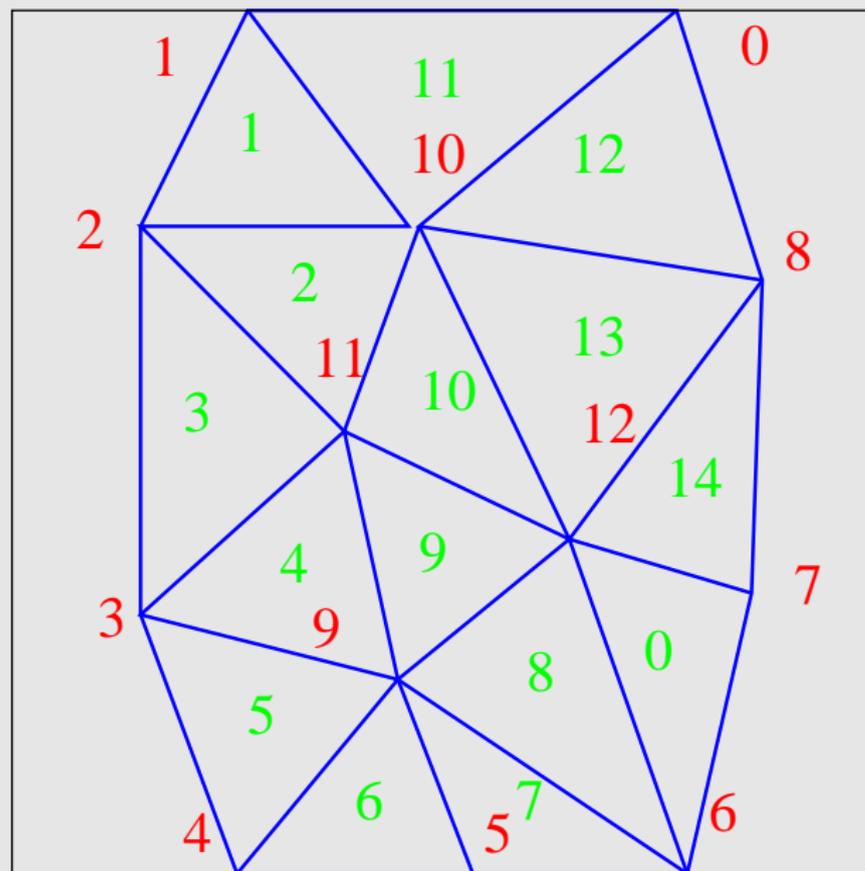
## Outlook



# Unstructured Grids



# Unstructured Grids: Storage



# Unstructured Grids: Storage

Node	x	y
0	0.8	1.0
1	0.3	1.0
2	0.2	0.75
3	0.2	0.25
4	0.3	0.0
5	0.5	0.0
6	0.8	0.0
7	0.85	0.4
8	0.9	0.65
9	0.45	0.2
10	0.5	0.7
11	0.4	0.55
12	0.65	0.4



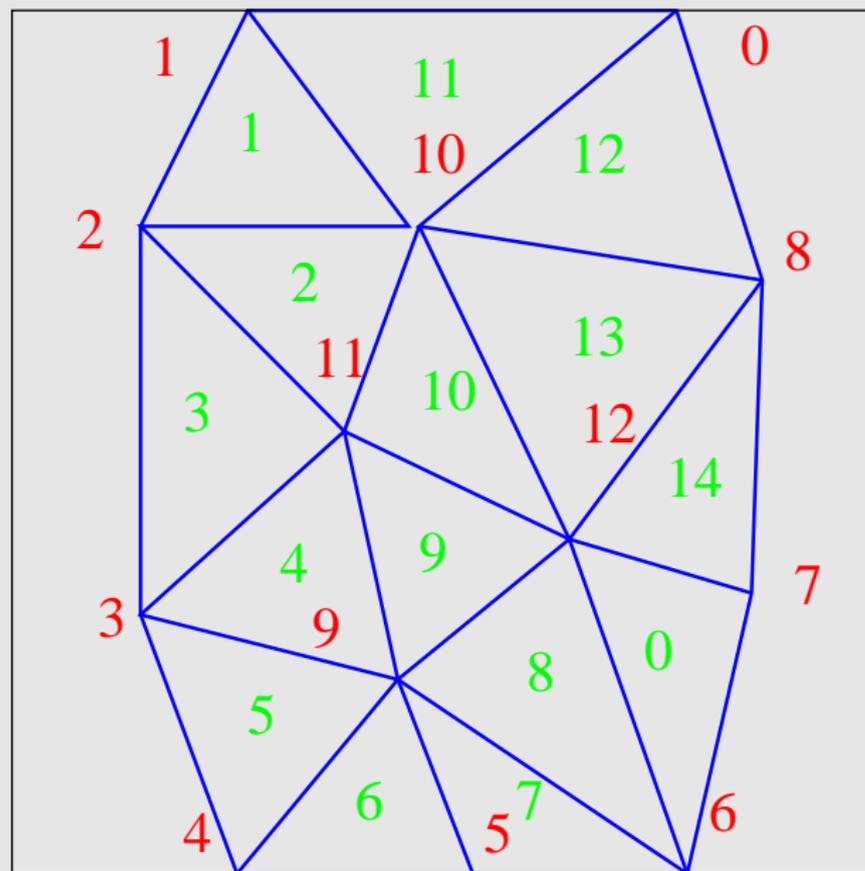
# Unstructured Grids: Storage

Node	x	y
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1	0.3	1.0
2	0.2	0.75
3	0.2	0.25
4	0.3	0.0
5	0.5	0.0
6	0.8	0.0
7	0.85	0.4
8	0.9	0.65
9	0.45	0.2
10	0.5	0.7
11	0.4	0.55
12	0.65	0.4

$\Delta$	P 0	P 1	P 2
0	6	7	12
1	1	2	10
2	2	11	10
3	2	3	11
4	3	9	11
5	3	4	9
6	9	4	5
7	5	6	9
8	12	9	6
9	11	9	12
10	11	12	0
11	10	0	1
12	0	10	8
13	12	8	10
14	12	7	8



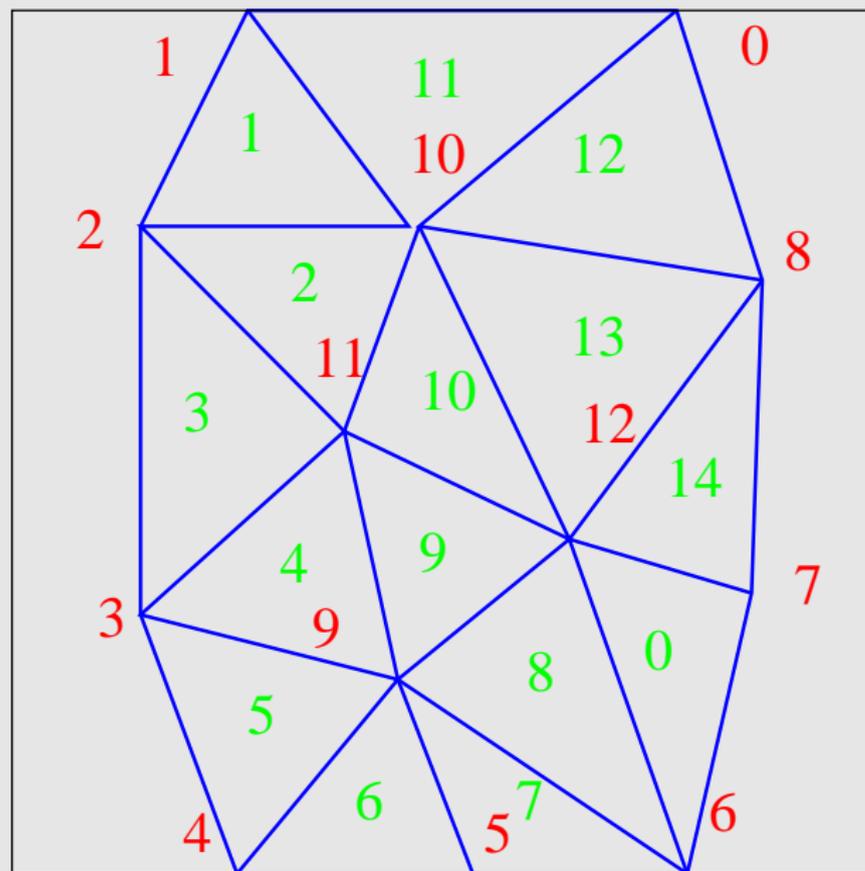
# Implicite Information: Adjacent Triangles?



# Implicit Information: Adjacent Triangles

Node	$\Delta 0$	$\Delta 1$	$\Delta 2$	$\Delta 3$	$\Delta 4$	$\Delta 5$
0	11	12				
1	11	1				
2	1	3	2			
3	3	4	5			
4	5	6				
5	7	6				
6	0	8	7			
7	14	0				
8	12	13	14			
9	4	5	6	7	8	9
10	1	2	10	13	12	11
11	2	3	4	9	10	
12	9	8	0	14	13	10

# Implicit Information: Node Neighbors?



## Implicit Information: Node Neighbors

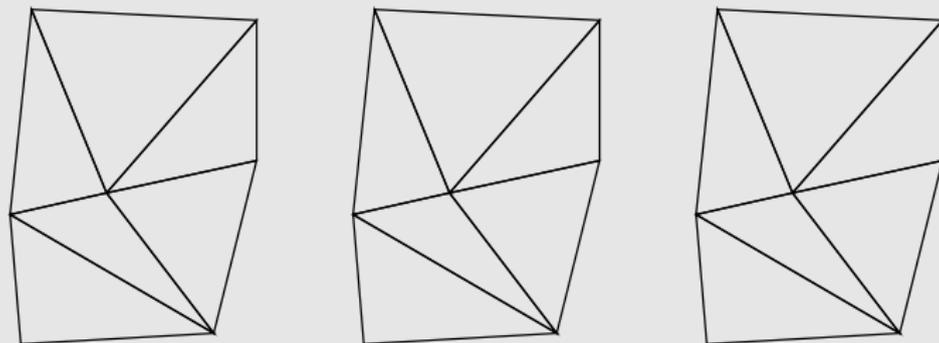
Node = N 0	N 1	N 2	N 3	N 4	N 5	N 6
0	1	10	8			
1	2	10	0			
2	1	3	11	10		
3	4	9	11	2		
4	3	5	9			
5	4	6	9			
6	7	12	9	5		
7	6	8	12			
8	0	10	12	7		
9	4	5	6	12	11	3
10	1	2	11	12	8	0
11	2	3	9	12	10	
12	11	9	6	7	8	10

# Matrix Structure

$$\begin{bmatrix} * & * & & & & & & & * & & * \\ * & * & * & & & & & & & & * \\ & & * & * & * & & & & & & * & * \\ & & & * & * & * & & & & & * & * \\ & & & & * & * & * & & & & * & * \\ & & & & & * & * & * & & & * & * \\ & & & & & & * & * & * & & * & * \\ * & & & & & & & * & * & & * & * \\ & & & * & * & * & * & & & * & * & * \\ * & * & * & & & & & & * & & * & * & * \\ & & & * & * & & & & & * & * & * & * \\ & & & & & & * & * & * & * & * & * & * \end{bmatrix}$$



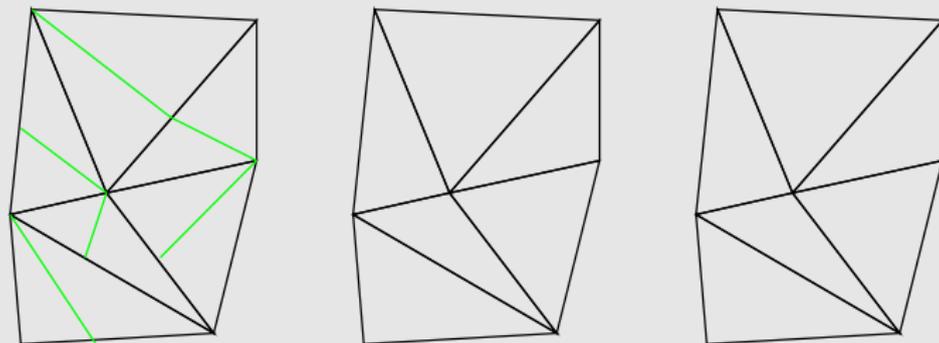
# Unstructured Grids: Refinement



Three canonical methods for refinement:

- ▶ bisection
- ▶ trisection
- ▶ quadrissection

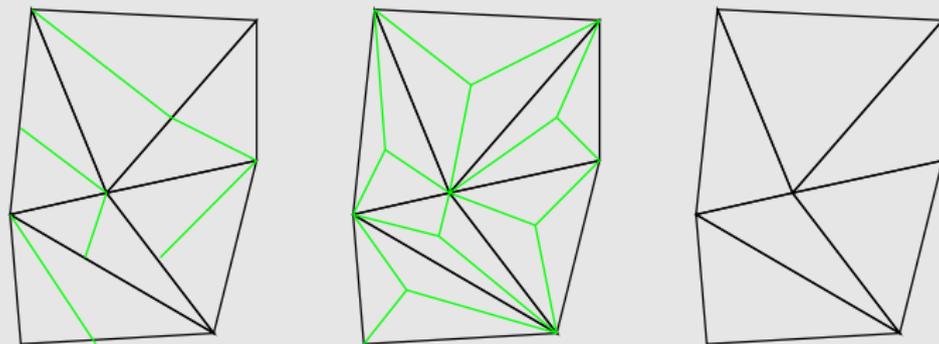
# Unstructured Grids: Refinement



Three canonical methods for refinement:

- ▶ bisection: may get hanging nodes, leads to acute angles
- ▶ trisection
- ▶ quadrisection

# Unstructured Grids: Refinement

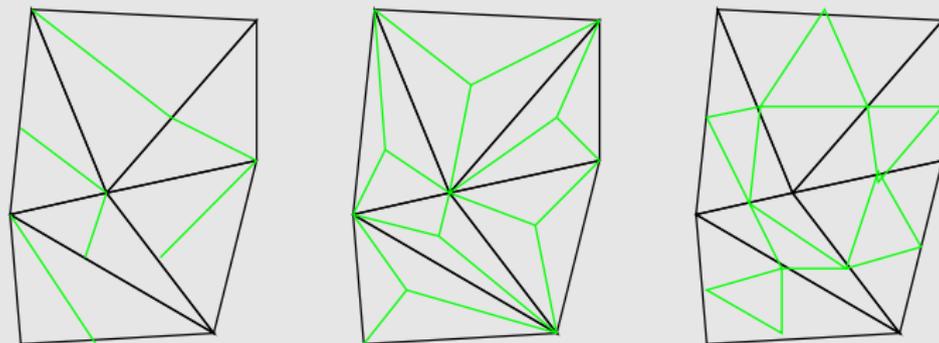


Three canonical methods for refinement:

- ▶ bisection: may get hanging nodes, leads to acute angles
- ▶ trisection using barycenter: leads to acute angles
- ▶ quadrisection



# Unstructured Grids: Refinement

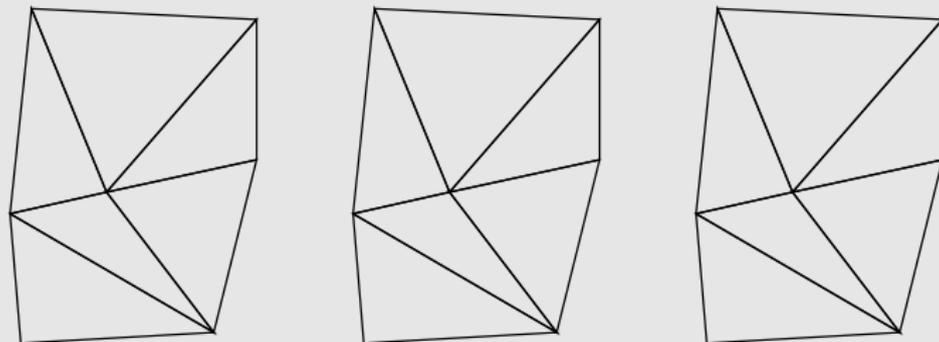


Three canonical methods for refinement:

- ▶ bisection: may get hanging nodes, leads to acute angles
- ▶ trisection using barycenter: leads to acute angles
- ▶ quadrissection using edge midpoints: get “similar” triangles



# Unstructured Grids: Coarsening



- ▶ no canonical method for coarsening
- ▶ can remove nodes and generate new triangles

# Quality Measures of Unstructured Grids

Different authors use different measures of non-degeneracy:

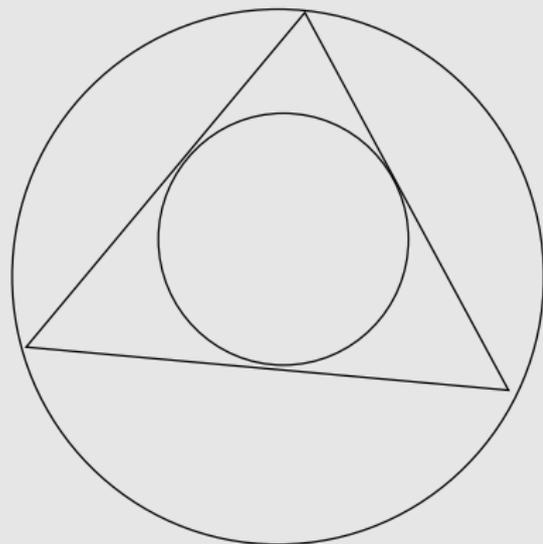
- ▶ angles bounded away from  $0^\circ$
- ▶ angles bounded away from  $90^\circ$



# Quality Measures of Unstructured Grids

Different authors use different measures of non-degeneracy:

- ▶ angles bounded away from  $0^\circ$
- ▶ angles bounded away from  $90^\circ$
- ▶ bounded ratio longest / shortest edge
- ▶ bounded ratio outer / inner radius



## Extension to 3D

- ▶ hexahedra (cubes) instead of squares



## Extension to 3D

- ▶ hexahedra (cubes) instead of squares
- ▶ tetrahedra instead of triangles (4 vertices)



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- ▶ refinement: midpoints of edges



## Extension to 3D

- ▶ hexahedra (cubes) instead of squares
- ▶ tetrahedra instead of triangles (4 vertices)
- ▶ refinement: midpoints of edges
- ▶ zoo of badly-shaped tetrahedra



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## Finite Elements in 2D and 3D

Classification of Grids

Structured Grids

Unstructured Grids

**Comparison**

## Composite Finite Elements

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Construction of CFE Grids

CFE Basis Functions

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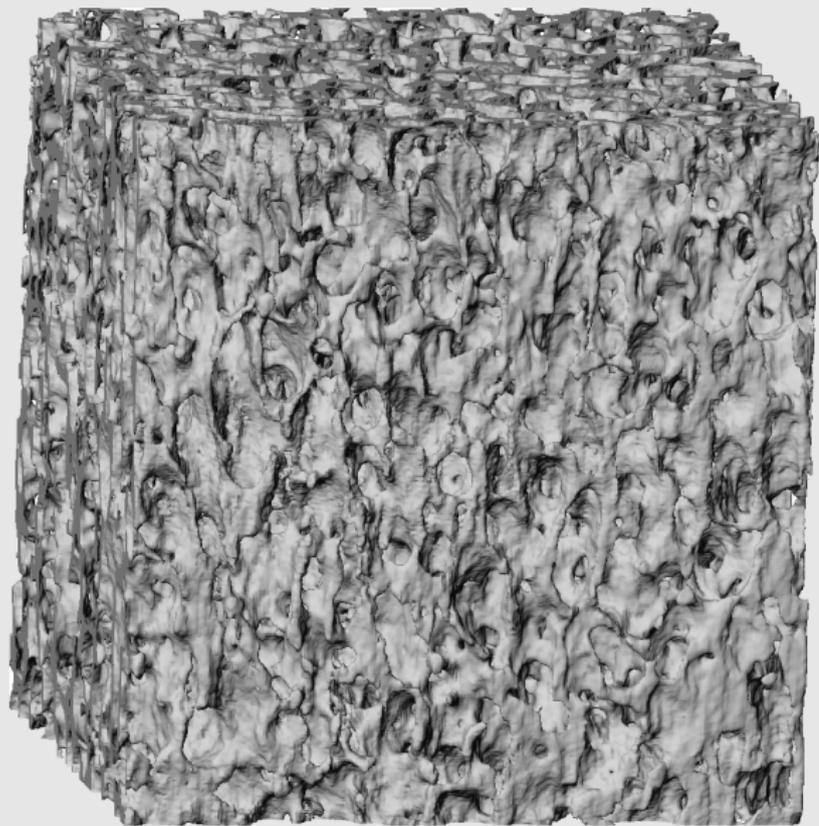


# Structured vs. Unstructured Grids

	<b>structured grids</b>	<b>unstructured grids</b>
basis functions	multilinear	linear
generate	easy	difficult
geometry	not flexible	flexible
description	cheap: implicate	expensive: explicite
refinement	easy	easy
coarsening	easy	difficult
numerically nice	sparse and structured	sparse but unstructured



# Goal: Complicated Microstructure



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We have seen:

- ▶ structured grids cannot represent complicated geometries
- ▶ unstructured grids can – but they are expensive



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We have seen:

- ▶ structured grids cannot represent complicated geometries
- ▶ unstructured grids can – but they are expensive

We have not seen:

- ▶ it is difficult to generate “good” unstructured grids



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# Composite Finite Elements: The Idea

For complicated geometry:

- ▶ classically, use complicated mesh with simple basis functions



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For complicated geometry:

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- ▶ CFE: use simple mesh with complicated basis functions

# Composite Finite Elements: The Idea

For complicated geometry:

- ▶ classically, use complicated mesh with simple basis functions
- ▶ CFE: use simple mesh with complicated basis functions
- ▶ both are immediately given by the image data ( $\mu$ CT scan)



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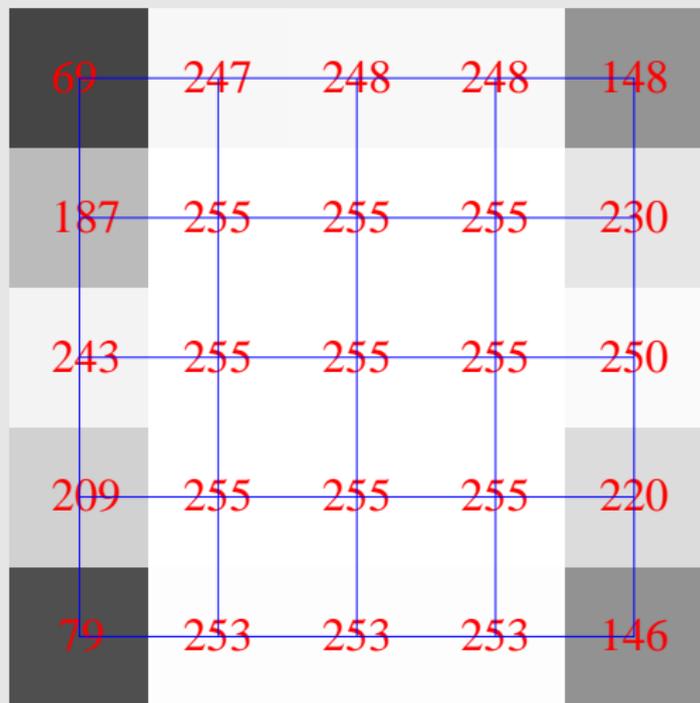
## Grey Images: CT-Scans

69	247	248	248	148
187	255	255	255	230
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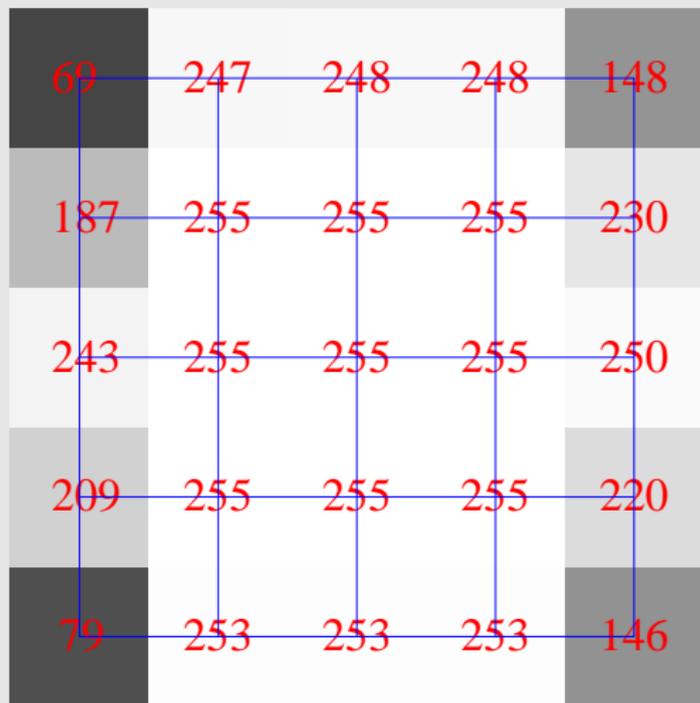
grey values represent X-ray attenuation



# A Natural Grid for Grey Images



## A Natural Grid for Grey Images



object boundary (240) can be recovered: keep these points



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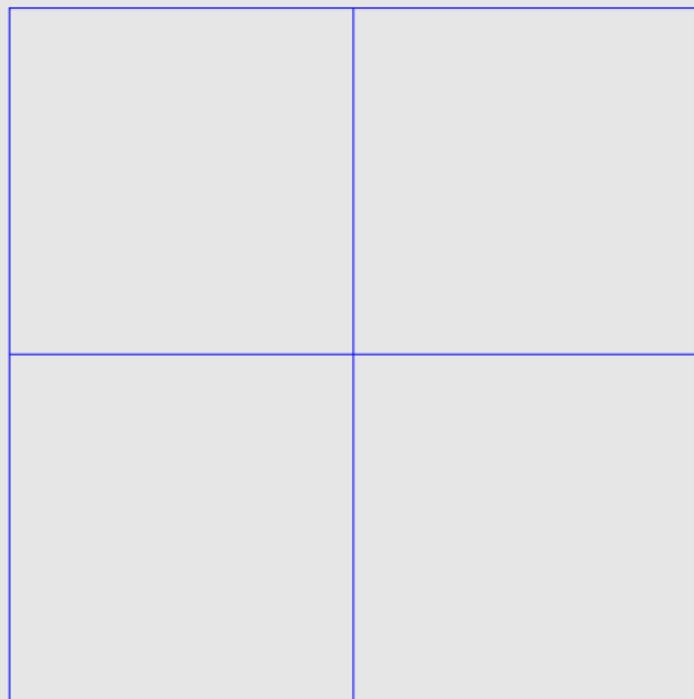
**Construction of CFE Grids**

CFE Basis Functions

## Outlook



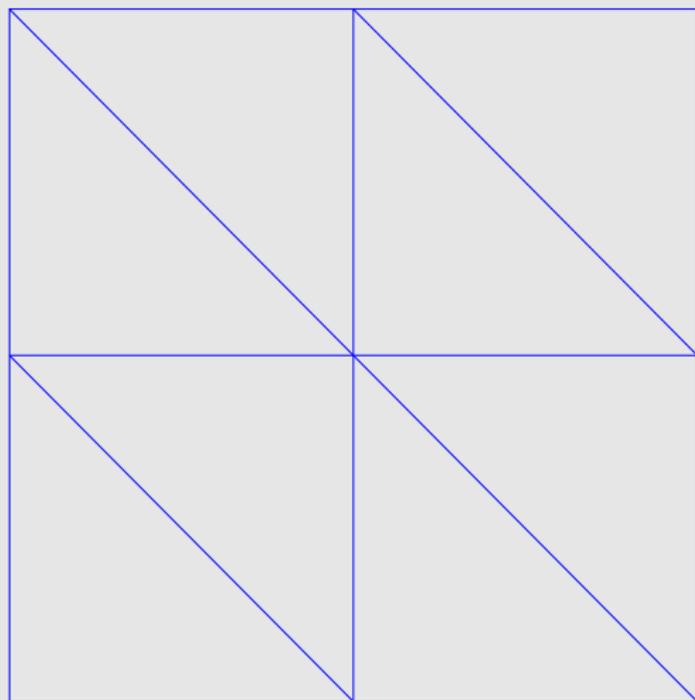
# Construction of CFE Grids



a grid consisting of squares



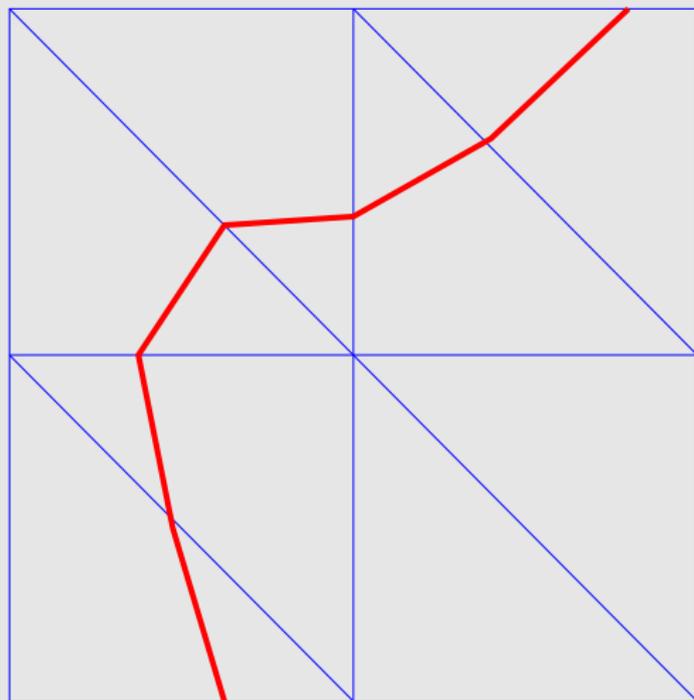
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squares cut in triangles



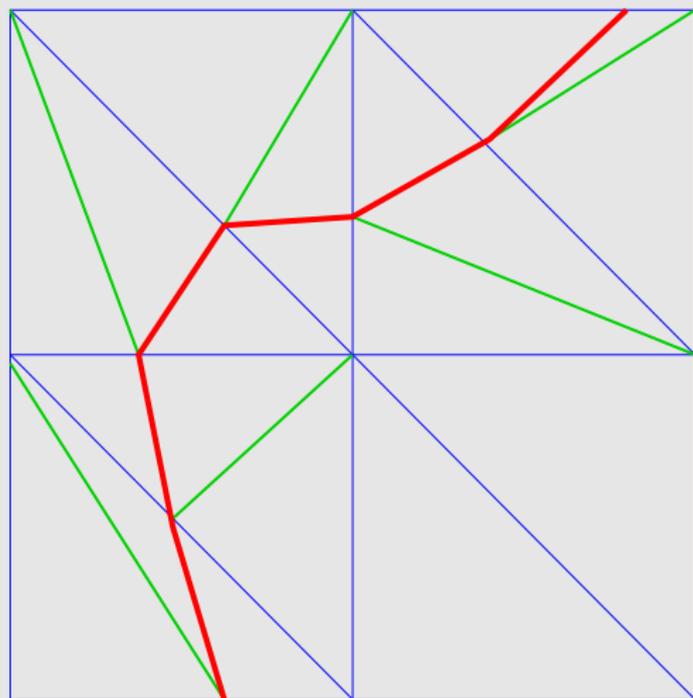
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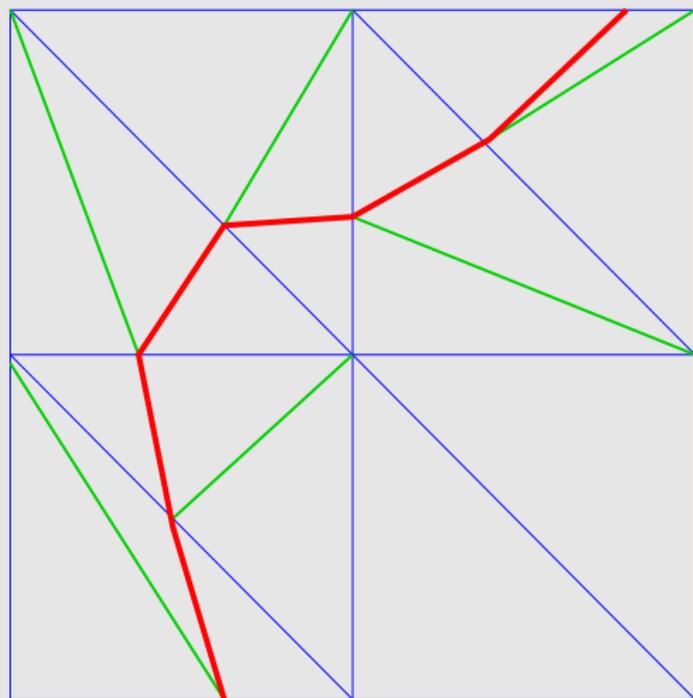
object boundary recovered from image



# Construction of CFE Grids



# Construction of CFE Grids



the “virtual grid” you don’t want to use



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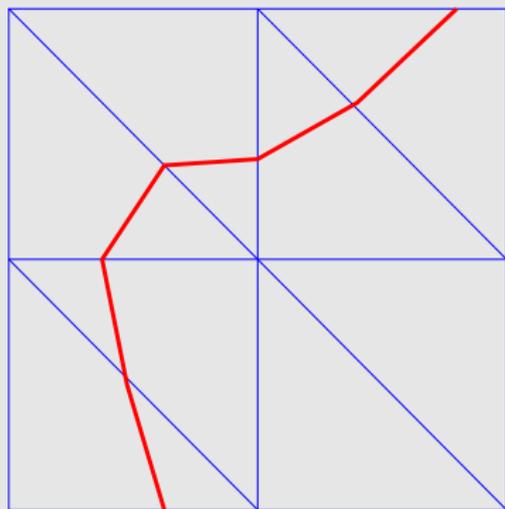
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**CFE Basis Functions**

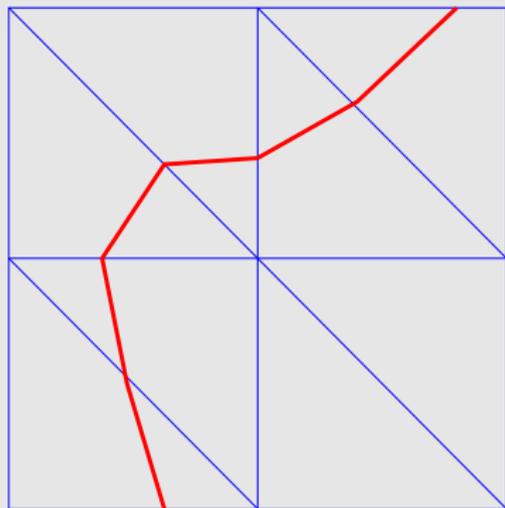
## Outlook



# CFE Basis Functions



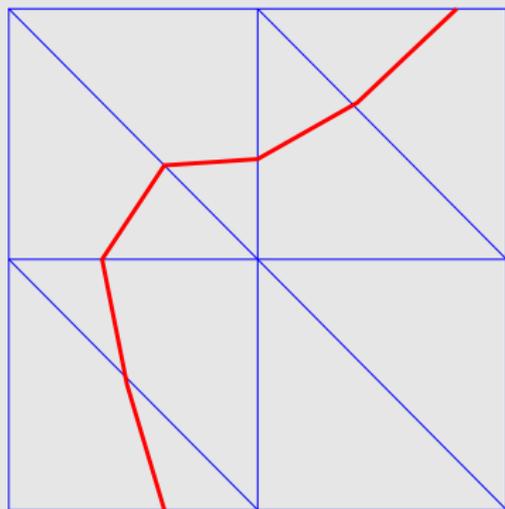
# CFE Basis Functions



- ▶ regular grid points only as degrees of freedom: simple neighborhood relations

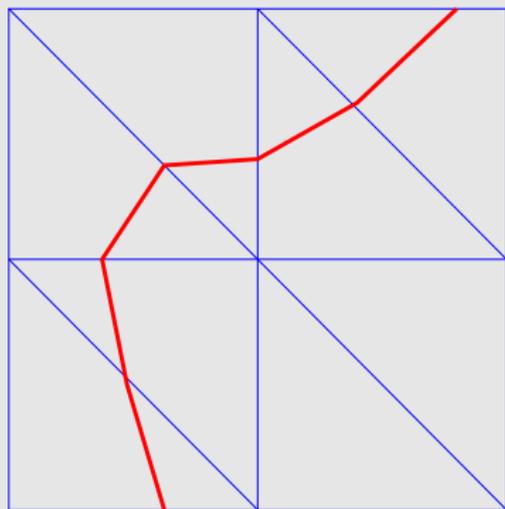


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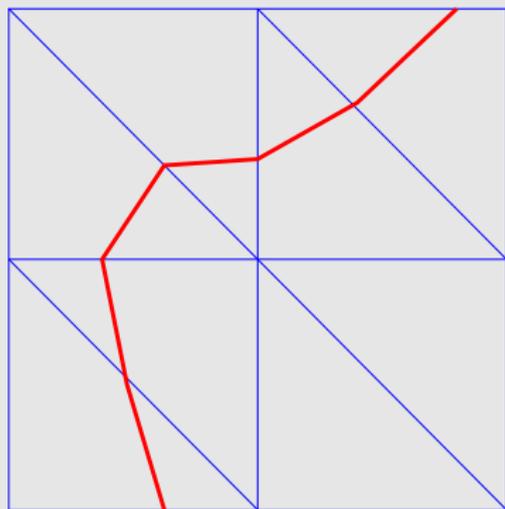
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- ▶ multigrid methods can be used as solvers, hence computation is more efficient



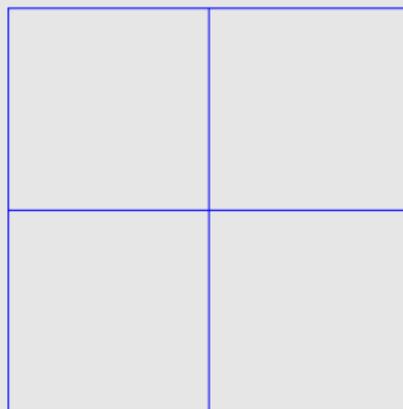
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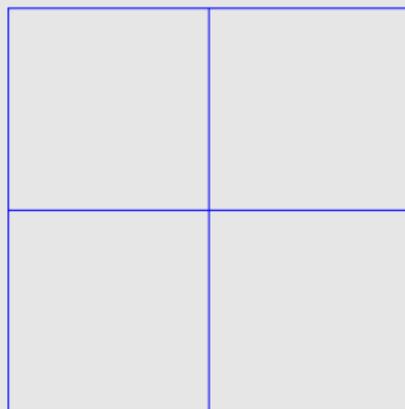
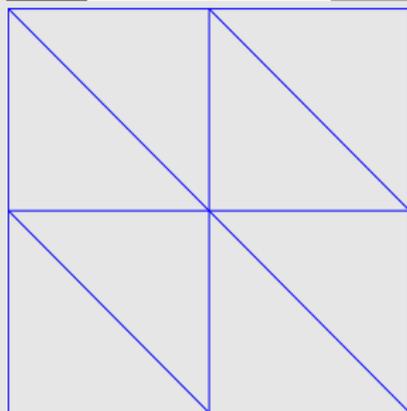
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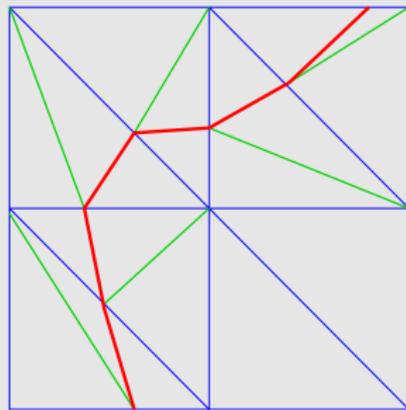
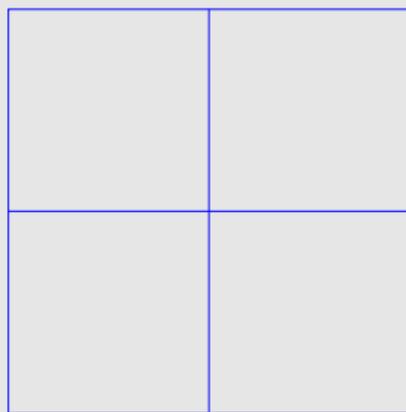
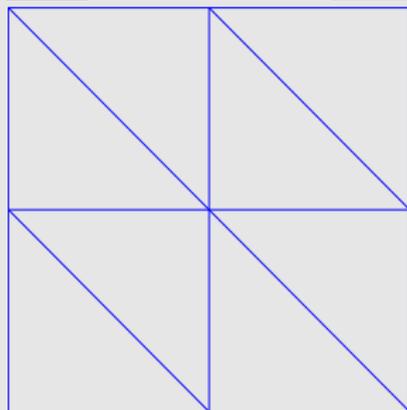
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# Outlook

- ▶ composite materials: jumping coefficients



# Outlook

- ▶ composite materials: jumping coefficients
- ▶ multigrid method: efficient solver



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- ▶ multigrid method: efficient solver
- ▶ elasticity: vector valued problem



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# Experimental Validation



# Experimental Validation



... und bei den Knochen vom Schwein nicht das »i« vergessen!

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- ▶ Wolfgang Hackbusch, Stefan Sauter: Composite Finite Elements for the approximation of PDEs on domains with complicated micro-structures, Numerische Mathematik 75:447–472, 1997
- ▶ Florian Liehr: Ein effizienter Löser für elastische Mikrostrukturen, Diplomarbeit Universität Duisburg-Essen, 2004
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