

# Object-oriented scientific computing

Pras Pathmanathan

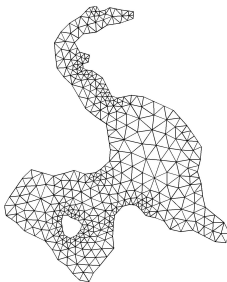
Summer 2012

## The finite element method

# Advantages of the FE method over the FD method

## Main advantages of FE over FD

- 1 Deal with Neumann boundary conditions in a natural (systematic) way
- 2 Deals with irregular geometries much more easily



## FEM stages

Solve:

$$\nabla^2 \mathbf{u} + \mathbf{f} = 0$$

subject to boundary conditions

$$\begin{aligned} \mathbf{u} &= \mathbf{u}^* && \text{on } \Gamma_1 \\ (\nabla \mathbf{u}) \cdot \mathbf{n} &= g && \text{on } \Gamma_2 \end{aligned}$$

- Set up the mesh and choose basis functions

- Compute the matrix  $K$  and vector  $\mathbf{b}$ :

$$\begin{aligned} K_{jk} &= \int_{\Omega} \nabla \phi_j \cdot \nabla \phi_k \, dV \\ b_j &= \int_{\Omega} f \phi_j \, dV + \int_{\Gamma_2} g \phi_j \, dS \end{aligned}$$

- Solve linear system  $KU = \mathbf{b}$  to impose Dirichlet BCs

- Solve linear system

This gives the solution  $u_h(\mathbf{x}) = U_1 \phi_1(\mathbf{x}) + \dots U_N \phi_N(\mathbf{x})$

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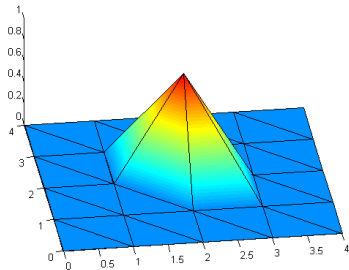
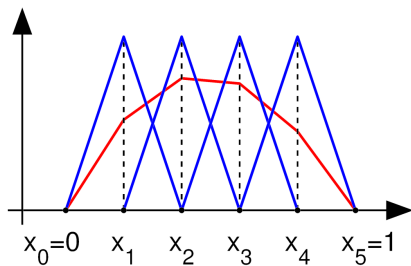
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# Basis functions



# Implementing Dirichlet boundary conditions

In practice, rather using the basis functions in  $\mathcal{V}_0^h$  (i.e. bases satisfying  $\phi_i = 0$  on  $\Gamma_1$ ), we use  $\mathcal{V}^h$ , i.e. all the basis functions corresponding to all nodes in the mesh.

We then impose (any) Dirichlet boundary conditions by altering the appropriate rows of the linear system, for example, for  $K\mathbf{U} = \mathbf{b}$ , if we want to impose  $U_1 = c$

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# Solving linear systems

Consider the general problem of solving the linear system

$$A\mathbf{x} = \mathbf{b}$$

where  $A$  is an  $n \times n$  matrix and  $\mathbf{b}$  an  $n$ -vector.

## Direct solvers

- One approach is to compute  $A^{-1}$  and calculate  $\mathbf{x} = A^{-1}\mathbf{b}$
- **Gaussian elimination** is an algorithm that is often used and is essentially equivalent to computing  $A^{-1}$
- These approaches get too costly (in time and memory) for large  $n$
- For  $n \leq 1000$  (probably even 5000) this may be the best approach

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## Iterative solvers

- Often  $A$  is **sparse**
- This means that computing  $A\mathbf{y}$  for given  $\mathbf{y}$  is cheap.
- Choose initial guess  $\mathbf{x}_0$
- An iterative solver takes in a current guess  $\mathbf{x}_n$  and provides an improved solution  $\mathbf{x}_{n+1}$ , just using matrix-vector products
- Common iterative solvers are *conjugate gradients* (for when  $A$  is symmetric and positive-definite) and *GMRES*.

## Preconditioning

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- Question is then: (i) does  $\mathbf{x}_n \rightarrow \mathbf{x}$  and (ii) how fast does  $\mathbf{x}_n \rightarrow \mathbf{x}$ ?
- For this we need to consider the condition number

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is equivalent to the original system  $\mathbf{A}\mathbf{x} = \mathbf{b}$ .

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- By choosing  $P$  appropriately, can obtain (massively) improved convergence—**preconditioning**

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## The finite element method: assembly

# Numerical quadrature

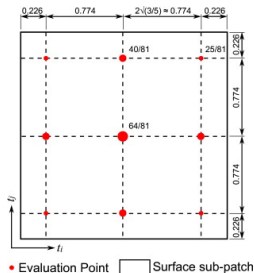
Suppose we want to compute

$$\int_{\text{unit square}} F(x, y) \, dx dy$$

We can use the approximation

$$\int_{\text{unit square}} F(x, y) \, dx dy \approx \sum_i w_i F(x_i, y_i)$$

where  $(x_i, y_i)$  are the *quadrature points*, and  $w_i$  the *weights*



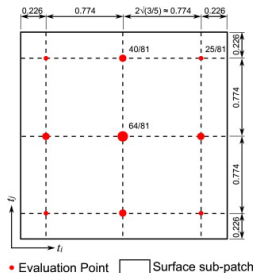
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## Computing a finite element matrix/vector by *assembly*

Consider computing the mass matrix  $M_{jk} = \int_{\Omega} \phi_j \phi_k \, dV$ , an  $N$  by  $N$  matrix say, and let's suppose (for clarity only) that we are in 2D.

We **do not** write out the full basis functions explicitly in computing this integral. Instead: firstly, we break the integral down into an integral over elements:

$$M_{jk} = \sum_{\mathcal{K}} \int_{\mathcal{K}} \phi_j \phi_k \, dV$$

Consider  $\int_{\mathcal{K}} \phi_j \phi_k \, dV$ . **Key point:** The only basis functions which are non-zero in the triangle are the 3 basis functions corresponding to the 3 nodes of the element.

Therefore: compute the **elemental contribution to the mass matrix**, a **3 by 3** matrix of the form  $\int_{\mathcal{K}} \phi_j \phi_k \, dV$  for **3 choices of  $j$  and  $k$  only**.

Then **add** elemental contribution to full  $N$  by  $N$  mass matrix.

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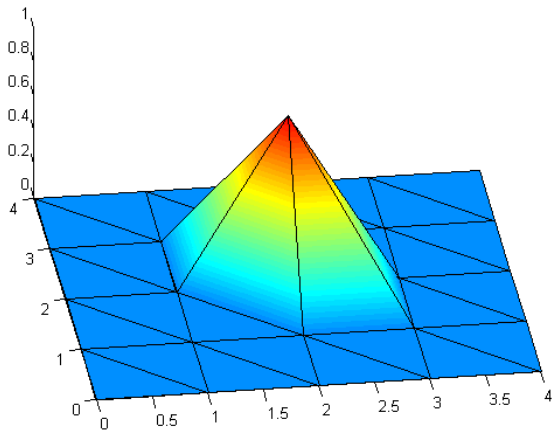
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# Assembly

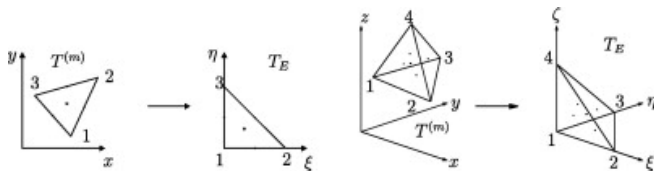


# Computing an elemental contribution

We have reduced the problem to computing small matrices/vectors, for example the 3 by 3 matrix

$$\int_{\kappa} \phi_j \phi_k \, dV$$

where  $\phi_j$ ,  $\phi_k$  are the 3 basis functions corresponding to the 3 nodes of the mesh.



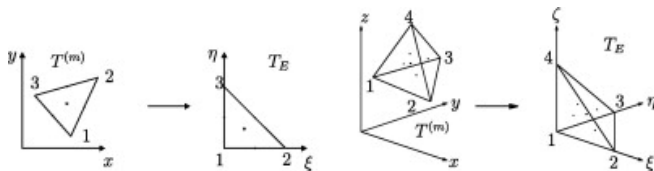
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## Reference element (also called the canonical element)

We now need to be able to compute

$$\int_{\mathcal{K}} \phi_j \phi_k \, dx dy = \int_{\mathcal{K}_{\text{ref}}} \phi_j \phi_k \, \det J \, d\xi d\eta$$

where  $J$  is the Jacobian of the mapping from the true element to the canonical element.

The basis functions on the reference triangle are easy to write down

$$\phi_1(\xi, \eta) = 1 - \xi - \eta$$

$$\phi_2(\xi, \eta) = \xi$$

$$\phi_3(\xi, \eta) = \eta$$

## Computing an elemental contribution

$J$  is also required if  $\nabla \phi_i$  is needed (for example, in computing the stiffness matrix), since  $\nabla \phi_i = J \nabla_{\xi} N_i$ .

Consider the mapping from an element with nodes  $\mathbf{x}_1, \mathbf{x}_2, \mathbf{x}_3$ , to the canonical element. The inverse mapping can in fact be easily written down using the basis functions.

$$\mathbf{x}(\xi, \eta) = \sum_{j=1}^3 \mathbf{x}_j N_j(\xi, \eta)$$

from which it is easy to show that  $J$  is the following function of nodal positions

$$J = \text{inv} \begin{bmatrix} x_2 - x_1 & x_3 - x_1 \\ y_2 - y_1 & y_3 - y_1 \end{bmatrix}$$

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$$J = \text{inv} \begin{bmatrix} x_2 - x_1 & x_3 - x_1 \\ y_2 - y_1 & y_3 - y_1 \end{bmatrix}$$

## FEM stages

Solve:

$$\nabla^2 \mathbf{u} + \mathbf{f} = 0$$

subject to boundary conditions

$$\begin{aligned} \mathbf{u} &= \mathbf{u}^* && \text{on } \Gamma_1 \\ (\nabla \mathbf{u}) \cdot \mathbf{n} &= g && \text{on } \Gamma_2 \end{aligned}$$

- 1 Set up the mesh and choose basis functions
- 2 Compute the matrix  $K$  and vector  $\mathbf{b}$ :

$$\begin{aligned} K_{jk} &= \int_{\Omega} \nabla \phi_j \cdot \nabla \phi_k \, dV \\ b_j &= \int_{\Omega} f \phi_j \, dV + \int_{\Gamma_2} g \phi_j \, dS \end{aligned}$$

- 3 Alter linear system  $K\mathbf{u} = \mathbf{b}$  to impose Dirichlet BCs
- 4 Solve linear system

This gives the solution  $\mathbf{u}_h(\mathbf{x}) = \mathbf{u}_1 \phi_1(\mathbf{x}) + \dots \mathbf{u}_N \phi_N(\mathbf{x})$

# FEM stages - full algorithm

Write

$$b_j = \int_{\Omega} f \phi_j dV + \int_{\Gamma_2} g \phi_j dS$$

as  $\mathbf{b} = \mathbf{b}^{\text{vol}} + \mathbf{b}^{\text{surf}}$

- ① Set up the computational mesh and choose basis functions
- ② Compute the matrix  $K$  and vector  $\mathbf{b}$ :
  - ① Loop over elements, for each compute the elemental contributions  $K_{\text{elem}}$  and  $\mathbf{b}_{\text{elem}}^{\text{vol}}$  (3 by 3 matrix and 3-vector)
    - For this, need to compute Jacobian  $J$  for this element, and loop over quadrature points
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## FEM for simple PDEs: Object-oriented implementation (general ideas)

Note that in the following:

- We consider *one possible* approach - the appropriate design will depend fundamentally on the precise nature of the solver required (eg, a solver for a particular equation versus a general solver of several)
- **Purple** represents an abstract class/method, **red** represents a concrete class or implemented method, **blue** represents a self-contained class (no inheritance).
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# Object-oriented design

What are the self-contained 'concepts' (objects) that form the overall simulation code, and what functionality should each of these objects have?

# Geometry

## Node

*Member var:* `mLocation`

▷ *a vector*

*Member var:* `mIsBoundaryNode`

▷ *a boolean (true/false)*

## Element

*Member var:* `mNodes`

▷ *(Pointers to) the 3 nodes (assuming a 2d simulation) of this element*

*Method:* `ComputeJacobian()`

*Method:* `ComputeJacobianDeterminant()`

## SurfaceElement

*Member var:* `mNodes`

▷ *(Pointers to) the 2 nodes of this element*

▷ *Also has corresponding methods to the Jacobian methods above*

# Geometry

## Mesh

mNodes

▷ *a list of Node objects*

mElements

▷ *a list of Element objects*

mBoundaryElements

▷ *a list of surface elements (SurfaceElement) on the boundary*

Method: ReadFromFile(filename)

Method: GenerateRegularMesh(width,height,stepsize)

Method: Refine()

## Note

- Here, boundary nodes/elements represent the *entire* boundary—‘mesh’ concept is self-contained and **not** dependent on PDE problem being solved.

# Boundary conditions

- There are various ways this could be implemented
- **Key point:** the implementation requires that
  - Dirichlet BCs be defined at boundary *nodes*
  - Neumann BCs be defined on boundary *elements* (ie element interiors)

## BoundaryConditions<DIM>

```
mDirichletBoundaryNodes  
mDirichletValues  
mNeumannBoundaryElements  
mNeumannValues
```

```
AddDirichletBoundaryCondition(node, dirichletBcValue)
```

```
AddNeumannBoundaryCondition(boundaryElement, neumannBcValue)
```

## A simple solver

Suppose we want to write a solver for Poisson's equation  $\nabla^2 u = f$  for general forcing terms  $f(\mathbf{x})$  and general boundary conditions. The solver class could be self-contained, and look like:

`PoissonEquationSolver:`

```
Solve(mesh, abstractForce, boundaryConditions)
```

# A simple solver

**PoissonEquationSolver:**

`Solve(mesh, abstractForce, boundaryConditions)`

The Solve method needs to:

- 1 Initialise a matrix  $K$  and vector  $\mathbf{b}$
- 2 Set up stiffness matrix  $K_{ij} = \int_{\Omega} \phi_i \phi_j \, dV$   
 Loop over elements  $T \in \mathcal{T}_h$  and assemble  $K_{ij}^T = \int_T \phi_i \phi_j \, dV$   
 For each element  $T$ , loop over nodes  $i, j \in \mathcal{N}_T$  and assemble  $K_{ij}^T$   
 For each pair of nodes  $i, j \in \mathcal{N}_T$ , assemble  $K_{ij} = K_{ij} + K_{ij}^T$
- 3 Similarly, loop over elements and assemble  $b_i^{\text{vol}} = \int_{\Omega} f \phi_i \, dV$
- 4 Loop over Neumann boundary elements (using boundaryConditions) and assemble  $b_i^{\text{surf}} = \int_{\Gamma_2} g \phi_i \, dS$
- 5 Alter the linear system  $K\mathbf{U} = \mathbf{b}^{\text{vol}} + \mathbf{b}^{\text{surf}}$  to take the Dirichlet BCs into account (using boundaryConditions again).
- 6 Solve the linear system

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- 1 Initialise a matrix  $K$  and vector  $\mathbf{b}$
- 2 Set up stiffness matrix  $K_{ij} = \int_{\Omega} \phi_i \phi_j \, dV$ 
  - Loop over elements of mesh ("mesh.GetNumElements()", "mesh.GetElement(i)")
  - Loop over nodes of element (using element's `GetNodes()` method)
  - Compute element stiffness matrix  $K_{ij}^{(e)}$  and assemble into  $K$
- 3 Similarly, loop over elements and assemble  $b_i^{\text{vol}} = \int_{\Omega} f \phi_i \, dV$
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## A simple solver

A (possible) more complete interface

**PoissonEquationSolver:**

```
PoissonEquationSolver(mesh, abstractForce, boundaryConditions)
Solve()
PlotSolution()
PlotForce()
ComputeQOI()
WriteSolutionToFile(filename)
```