## Part II continued - more details on general issues

Last time - Finite Differences
Higher orders - central, 1-sided, non-equispaced
Compact 4th order Poisson solver
Upwinding
Grids - non-Cartesian, stretched, staggered
Conservative

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Higher orders - central, 1-sided, non-equispaced
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This time - Finite Elements

## Finite Elements

Good for engineering problems with complex geometries

- 'just' need to triangulate domain

Good for elliptic, OK for parabolic, poor for hyperbolic
Good for accuracy \& conservative

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Good for elliptic, OK for parabolic, poor for hyperbolic
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Poor difficult programming on unstructured grid
Poor no efficient Poisson solver on unstructured grid
Poor difficult presenting results on unstructured grid
Use packages, do not program yourself

## Finite Elements $=$ Two ideas

1. Simple representation for unknown function over the finite element

- not point data of FD


## Finite Elements = Two ideas

1. Simple representation for unknown function over the finite element

- not point data of FD

2. Weak formulation of the governing equations

- variational statement


## Representations in 1D

a. Constant elements

$$
f(x)=f_{i}
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in $x_{i-1} \leq x<x_{i}$


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in $x_{i-1} \leq x<x_{i}$

b. Linear elements

$$
f(x)=f_{i-1} \frac{x_{i}-x}{x_{i}-x_{i-1}}+f_{i} \frac{x-x_{i-1}}{x_{i}-x_{i-1}}
$$

in $x_{i-1} \leq x<x_{i}$


## More representations in 1D

First map element to unit interval

$$
x(\xi)=x_{i-1}+\left(x_{i}-x_{i-1}\right) \xi \quad \text { for } 0 \leq \xi \leq 1
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$$

c. Quadratic elements

$$
f(x)=f_{i-1}(1-\xi)(1-2 \xi)+f_{i-\frac{1}{2}} 4 \xi(1-\xi)+f_{i} \xi(2 \xi-1)
$$

NB: $f^{\prime}$ discontinuous at boundaries

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NB: $f^{\prime}$ discontinuous at boundaries
d. Cubic elements

Obvious generalisation, but better:

$$
\begin{aligned}
f(x)= & f_{i-1}(1-\xi)^{2}(1+2 \xi)+f_{i-1}^{\prime}(1-\xi)^{2} \xi \\
& +f_{i} \xi^{2}(3-2 \xi)+f_{i}^{\prime} \xi^{2}(1-\xi)
\end{aligned}
$$

Now only $f^{\prime \prime}$ discontinuous at boundaries - see splines later

## basis functions

In all cases, write:

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For the constant elements, the basis functions are

$$
\phi_{i}(x)= \begin{cases}1 & \text { in } \quad x_{i-1} \leq x<x_{i} \\ 0 & \text { otherwise }\end{cases}
$$



## Basis functions for linear elements

$$
\phi_{i}(x)= \begin{cases}\frac{x-x_{i-1}}{x_{i}-x_{i-1}} & \text { in } \quad x_{i-1} \leq x \leq x_{i} \\ \frac{x_{i+1}-x}{x_{i+1}-x_{i}} & \text { in } \quad x_{i} \leq x \leq x_{i+1} \\ 0 & \text { otherwise }\end{cases}
$$

with obvious modifications for the end elements.


## Basis functions for cubic elements

$$
\begin{gathered}
\phi_{i}(x)= \begin{cases}\frac{\left(x_{i+1}-x\right)^{2}\left(x_{i+1}+2 x-3 x_{i}\right)}{\left(x_{i+1}-x_{i}\right)^{3}} & \text { in } x_{i} \leq x<x_{i+1} \\
\frac{\left(x-x_{i-1}\right)^{2}\left(3 x_{i}-2 x-x_{i-1}\right)}{\left(x_{i}-x_{i-1}\right)^{3}} & \text { in } x_{i-1} \leq x<x_{i} \\
0 & \text { otherwise }\end{cases} \\
\tilde{\phi}_{i}(x)= \begin{cases}\frac{\left(x-x_{i}\right)\left(x_{i+1}-x\right)^{2}}{\left(x_{i+1}-x_{i}\right)^{2}} & \text { in } x_{i} \leq x<x_{i+1} \\
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\ell_{12}(x, y)=\frac{\left(x-x_{1}\right)\left(y_{2}-y_{1}\right)-\left(x_{2}-x_{1}\right)\left(y-y_{1}\right)}{\left(x_{3}-x_{1}\right)\left(y_{2}-y_{1}\right)-\left(x_{2}-x_{1}\right)\left(y_{3}-y_{1}\right)}
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$$

Then

$$
f(\mathbf{x})=f_{1} \ell_{23}(\mathbf{x})+f_{2} \ell_{31}(\mathbf{x})+f_{3} \ell_{12}(\mathbf{x})
$$

Representation continuous over domain

## more representations in 2D

c. Quadratic elements Values at vertices and mid-points

$$
\begin{aligned}
f(\mathbf{x})= & f_{1} \ell_{23}(\mathbf{x})\left(2 \ell_{23}(\mathbf{x})-1\right) \\
& +f_{2} \ell_{31}(\mathbf{x})\left(2 \ell_{31}(\mathbf{x})-1\right) \\
& +f_{3} \ell_{12}(\mathbf{x})\left(2 \ell_{12}(\mathbf{x})-1\right) \\
& +f_{23} 4 \ell_{12}(\mathbf{x}) \ell_{31}(\mathbf{x})+f_{31} 4 \ell_{23}(\mathbf{x}) \ell_{12}(\mathbf{x})+f_{12} 4 \ell_{31}(\mathbf{x}) \ell_{23}(\mathbf{x})
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Local nature $\rightarrow$ sparse coupling matrices for PDEs

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Bilinear, taking values at vertices

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f(\mathbf{x})=f_{1} \xi \eta+f_{2}(1-\xi) \eta+f_{3} \xi(1-\eta)+f_{4}(1-\xi)(1-\eta)
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Continuous over domain.

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Biquadratic - sum of 9 terms, each product of quadratic in separate coordinates, taking values at vertices and midpoints.

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Continuous and continuous tangential derivative at boundaries.

## Variational statement of Poisson problem

$$
\nabla^{2} f=\rho \text { in volume } V
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with boundary condition, say $f=g$ on surface $S$, with $\rho(\mathbf{x})$ and $g(\mathbf{x})$ given.

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Rayleigh-Ritz variational formulation:

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with boundary condition, say $f=g$ on surface $S$, with $\rho(\mathbf{x})$ and $g(\mathbf{x})$ given.

Rayleigh-Ritz variational formulation: out of all those functions $f(\mathbf{x})$ that satisfy BCs, the one that minimises

$$
I(f)=\int_{V}\left(\frac{1}{2}|\nabla f|^{2}+\rho f\right) d V
$$

also satisfies the Poisson problem.

## Substitute FE representation

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The weak formulation of the PDE ( $f$ can be non- $C^{2}$ )

## Details in 1D

$$
\frac{d^{2} f}{d x^{2}}=\rho \quad \text { in } a<x<b, \quad \text { with } f(a)=A \text { and } f(b)=B
$$ where $\rho(x), A$ and $B$ given.

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Unknown $f(x)$ represented (BCs built in)

$$
f(x)=A \phi_{0}(x)+B \phi_{N}(x)+\sum_{i=1}^{N-1} f_{i} \phi_{i}(x)
$$

## more details in 1D

At interior pts

$$
K_{i j}=\int \nabla \phi_{i} \cdot \nabla \phi_{j}= \begin{cases}2 / h & \text { if } i=j \\ -1 / h & \text { if } i=j \pm 1 \\ 0 & \text { otherwise }\end{cases}
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$$
\text { by } \nabla \phi_{i}=0,+1 / h,-1 / h, 0
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by $\nabla \phi_{i}=0,+1 / h,-1 / h, 0$
Take given $\rho(x)$ to be piecewise constant, then forcing

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r_{i}=\int \rho(x) \phi_{i}=h \rho_{i}
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So equation governing unknown amplitudes $f_{i}$ becomes

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- same for the point values in the finite difference approach.


## more details in 1D

Remark If evaluate $r_{i}$ more accurately

$$
r_{i}=\int \rho(x) \phi_{i}(x)=\rho_{i}+\frac{h^{3}}{12} \rho_{i}^{\prime \prime}+O\left(h^{5}\right)
$$

So obtain $f_{i}$ to $O\left(h^{4}\right)$.

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i.e. FE approach naturally conservative.

