AMCS 394E: Contemp. Topics in Computational Science. Computing with the finite element method

David I. Ketcheson and Manuel Quezada de Luna



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Approximation of PDEs:

- * Why do we go from a strong to a weak formulation?
- * How do we get a finite dimensional approx. of the weak form?
- * How do we go from a finite dimensional approx. of the weak form to a linear algebra problem?

Example:

Consider the following equation:

$$u - \Delta u = 0,$$
 $\forall x \in \Omega,$ $u = u_D,$ $\forall x \in \Gamma_D,$ $\partial_{\mathbf{n}} u = b(x),$ $\forall x \in \Gamma_N.$

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What is the weak formulation?

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where

$$V = \{ v \in H^1(\Omega) \mid v = 0 \text{ if } x \in \Gamma_D \}.$$

What is the discrete weak formulation?

$$\int_{\Omega} \mathbf{u}_{h} \varphi d\mathbf{x} + \int_{\Omega} \nabla \mathbf{u}_{h} \cdot \nabla \varphi d\mathbf{x} = \int_{\partial \Omega} \mathbf{b} \varphi d\mathbf{s}, \quad \forall \varphi \in \mathbf{V}_{h}$$

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Consider and plug $\phi = \phi_i$ and $u_h = \sum_j U_j \varphi_j$ into the equation.

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- * Let's consider a discretization of Ω .
- * Let's compute the matrices and RHS.

Second example:

Let's consider the 1D equation (from the first week):

$$\partial_t u + a \partial_x u - \mu \partial_{xx} u = r(x), \quad \forall x \in \Omega = (0, 1),$$

with $\mu > 0$.

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Get the finite element spatial semi-discretization:

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- * Consider piecewise linear continuous finite elements.
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- * Compare this versus the finite difference formulation.

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- * To compute the matrices, for a given node *i*, we considered all *j*-shape functions.
- * We performed the integration based on a reference element.

We approximate the integrals via quadratures. That is (for 1D),

$$\int_{-1}^{1} f(x) dx \approx \sum_{q=1}^{N_q} w_q f(x_q),$$

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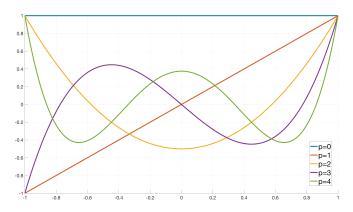
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- * Gauss-Legendre quadrature is exact for polynomials of degree up to $2N_{\alpha}-1$.

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Verify that I can integrate third order polynomials with $N_q = 2$.

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How to compute the element based integrals?

For each element, proceed as follows:

* Compute all quantities with respect to the reference element.

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How to compute the element based integrals?

- * Compute all quantities with respect to the reference element.
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- * Loop on *i*-DoFs.
- * Loop on *j*-DoFs and more indices if needed.

The FE loop looks as follows:

for
$$K = 1$$
 to N_{el} do

end for

The FE loop looks as follows:

for K = 1 to N_{el} do Compute quantities wrt reference element.

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```
for K=1 to N_{el} do Compute quantities wrt reference element. for q=1 to N_q do
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for K=1 to N_{el} do

Compute quantities wrt reference element.

for q=1 to N_q do

for i=1 to DoFs per element do

Compute element based vectors.
```

end for

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for K = 1 to N_{el} do
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  for q = 1 to N_q do
    for i = 1 to DoFs per element do
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      for j = 1 to DoFs per element do
      end for
    end for
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        Compute element based matrices.
      end for
    end for
    Assemble from local to global operators.
  end for
end for
```