

Bachelor Thesis

Building Blocks for Finite Element computations in IPPL

Lukas Bühler

Tuesday 30th January, 2024



- ① Introduction
- ② Framework & Implementation
- ③ Results & Conclusion

Outline

- 1 Introduction
- 2 Framework & Implementation
- 3 Results & Conclusion

Introduction

Currently, IPPL supports electrostatic PIC simulations.

Development of a full electromagnetic (EM) solver is ongoing.

The Finite Element Method (FEM) is one of the numerical methods used in EM solvers.

Goal: Implement the building blocks for the FEM in IPPL.

EM Solver Schemes

Common in EM solvers: Finite Difference Time Domain (FDTD) scheme.
(2nd-order accuracy)

- Space discretization with Finite Differences.
- Time discretization with Finite Differences.

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Finite Element Time Domain (FETD)

- Space discretization using FEM.
- Time discretization with other schemes, Runge-Kutta methods.

Advantages of FEM vs. Finite Differences

Advantages of using FEM compared to Finite Differences

- More complex geometries

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- ... or both (hp -refinement).

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- More complex geometries
- Higher-order elements: Using higher-order basis functions (p -refinement)
Improve accuracy without affecting runtime, scalability and memory footprint.
- Still possible to do mesh refinement (h -refinement).
- ... or both (hp -refinement).
- Even smaller memory footprint with a matrix-free assembly algorithm.
⇒ Better performance on GPUs.

Finite Element Method (FEM)

The Finite Element Method is used to solve PDEs.

Steps:

- ① Discretization (Meshing) of the domain with elements.
- ② Approximating the solution of the PDE on the elements.
- ③ Assembling the approximated solutions of the elements in a LSE.

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$$\mathbf{A}\boldsymbol{\mu} = \boldsymbol{\varphi} \quad (1)$$

The LSE then needs to be solved.

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We use the Conjugate Gradient (CG) method to iteratively solve the LSE. This allows us to use a matrix-free assembly method.

Motivation for Matrix-free Method

Ljungkvist, 2017: Matrix-free finite element algorithms have many benefits on modern manycore processors and GPUs compared to sparse matrix-vector products. [1]

Settgast et. al, 2023: The matrix-free approach, in the context of the CG method, compares favorably even for low-order FEM. [2]

Conjugate Gradient (CG) Method

The CG method is an iterative method to approximate the solution of a LSE.

$\mathbf{x} \leftarrow$ initial guess, (usually $\mathbf{0}$)

$\mathbf{b} \leftarrow \boldsymbol{\varphi}$

$\mathbf{p} \leftarrow \mathbf{A}\mathbf{x}$

$\mathbf{r} \leftarrow \mathbf{b} - \mathbf{p}$

while $\|\mathbf{r}\|_2 < \epsilon$ **do**

$\mathbf{z} \leftarrow \mathbf{A}\mathbf{p}$

$\alpha \leftarrow \frac{\mathbf{r}^\top \mathbf{r}}{\mathbf{p}^\top \mathbf{z}}$

$\mathbf{x} \leftarrow \mathbf{x} + \alpha \mathbf{p}$

$\mathbf{r}_{\text{old}} \leftarrow \mathbf{r}$

$\mathbf{r} \leftarrow \mathbf{r} - \alpha \mathbf{z}$

$\beta \leftarrow \frac{\mathbf{r}^\top \mathbf{r}}{\mathbf{r}_{\text{old}}^\top \mathbf{r}_{\text{old}}}$

$\mathbf{p} \leftarrow \mathbf{r} + \beta \mathbf{p}$

end

Conjugate Gradient (CG) Method

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 $x \leftarrow$  initial guess, (usually  $\mathbf{0}$ )
 $b \leftarrow \varphi$ 
 $p \leftarrow \mathbf{A}x$  // Stiffness matrix used here
 $r \leftarrow b - p$ 
while  $\|r\|_2 < \epsilon$  do
     $z \leftarrow \mathbf{A}p$  // Stiffness matrix used here

     $\alpha \leftarrow \frac{r^\top r}{p^\top z}$ 

     $x \leftarrow x + \alpha p$ 
     $r_{\text{old}} \leftarrow r$ 
     $r \leftarrow r - \alpha z$ 

     $\beta \leftarrow \frac{r^\top r}{r_{\text{old}}^\top r_{\text{old}}}$ 

     $p \leftarrow r + \beta p$ 
end
  
```

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FEMPoissonSolver

The FEMPoissonSolver is a proof of concept FEM solver.

It solves the Poisson equation for a given right-hand side function.

$$\begin{aligned} -\Delta u &= f & u &\in \Omega, \\ u &= 0 & u &\in \partial\Omega. \end{aligned} \tag{2}$$

Currently uses:

- Homogeneous Dirichlet boundary conditions
- IPPL uniform meshes
- 1st-order Lagrangian finite elements
- Gauss-Jacobi quadrature

Solver and Assembly

What FEMPoissonSolver does:

- ➊ Precompute the transformations, the quadrature weights and quadrature nodes
- ➋ Define the “eval” lambda function (for the Poisson equation)
- ➌ Use the CG solver with the matrix-free assembly function (evaluateAx) to solve the problem

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For the Poisson equation:

$$\text{eval}(i, j, k) := (\mathbf{D}\Phi_K(\hat{\mathbf{q}}_k))^{-\top} \nabla \hat{b}^j(\hat{\mathbf{q}}_k) \cdot (\mathbf{D}\Phi(\hat{\mathbf{q}}_k))^{-\top} \nabla \hat{b}^i(\hat{\mathbf{q}}_k) | \det \mathbf{D}\Phi_K(\hat{\mathbf{q}}_k)|$$

Assembly Prerequisites

Strong form:

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(Element) stiffness matrix and load vector:

$$\mathbf{A} = [a(b_h^J, b_h^I)]_{I,J=1}^N, \quad \boldsymbol{\varphi} = [\ell(b_h^I)]_{I=1}^N, \quad (4)$$

$$\mathbf{A}_K = [a(b_K^j, b_K^i)]_{i,j=1}^M, \quad \boldsymbol{\varphi}_K = [\ell(b_K^i)]_{i=1}^M, \quad (5)$$

with $b_K^i := b_h^i|_K$, for element K ,

N number of global basis functions, M number of local shape functions.

Matrix-free Assembly Derivation (evaluateAx)

Input: x

$z \leftarrow 0$

for Element K in Mesh do

 // 1. Compute the Element matrix A_K

 DOFs $_K \leftarrow \{4, 5, 8, 7\}$, DOFs $_{\hat{K}} \leftarrow \{0, 1, 2, 3\}$

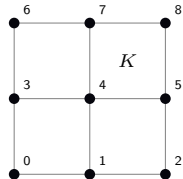
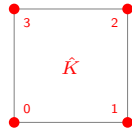
 ...

 // 2. Compute $z = Ax$ contribution with A_K

 ...

end

return z



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Input: \mathbf{x}

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for Element K in Mesh do

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$\text{DOFs}_K \leftarrow \{4, 5, 8, 7\}$, $\text{DOFs}_{\hat{K}} \leftarrow \{0, 1, 2, 3\}$

for $i, j \in \text{DOFs}_{\hat{K}}$ do

$I = \text{DOFs}_K[i]$, $J = \text{DOFs}_K[j]$

$$(\mathbf{A}_K)_{i,j} = \int_K \nabla b_K^J(\mathbf{x}) \cdot \nabla b_K^I(\mathbf{x}) d\mathbf{x}$$

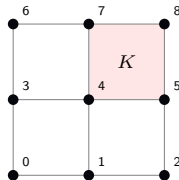
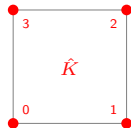
end

// 2. Compute $\mathbf{z} = \mathbf{A}\mathbf{x}$ contribution with \mathbf{A}_K

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$I = \text{DOFs}_K[i]$, $J = \text{DOFs}_K[j]$

$$(\mathbf{A}_K)_{i,j} = \int_{\hat{K}} \Phi_K^* \nabla b_K^J \cdot \Phi_K^* \nabla b_K^I |\det \mathbf{D}\Phi_K| d\hat{\mathbf{x}}$$

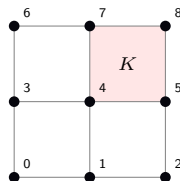
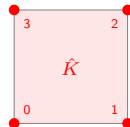
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for $i, j \in \text{DOFs}_{\hat{K}}$ do

$$(\mathbf{A}_K)_{i,j} = \int_{\hat{K}} (\mathbf{D}\Phi_K)^{-\top} \nabla \hat{b}^j \cdot (\mathbf{D}\Phi_K)^{-\top} \nabla \hat{b}^i |\det \mathbf{D}\Phi_K| d\hat{\mathbf{x}}$$

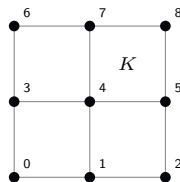
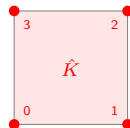
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for $i, j \in \text{DOFs}_{\hat{K}}$ do

$$(\mathbf{A}_K)_{i,j} \approx \sum_k^{N_{\text{Int}}} \hat{\omega}_k (\mathbf{D}\Phi_K(\hat{\mathbf{q}}_k))^{-\top} \nabla \hat{b}^j(\hat{\mathbf{q}}_k) \cdot (\mathbf{D}\Phi(\hat{\mathbf{q}}_k))^{-\top} \nabla \hat{b}^i(\hat{\mathbf{q}}_k) |\det \mathbf{D}\Phi_K(\hat{\mathbf{q}}_k)|$$

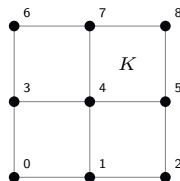
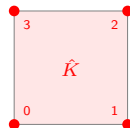
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end

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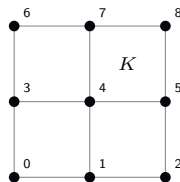
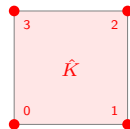
$I = \text{DOFs}_K[i]$, $J = \text{DOFs}_K[j]$

$\mathbf{z}_I \leftarrow \mathbf{z}_I + (\mathbf{A}_K)_{i,j} \cdot \mathbf{x}_J$

end

end

return \mathbf{z}



Matrix-free Assembly Algorithm (Poisson equation)

```

Input:  $\varpi$ , eval( $i, j, k$ )
 $\mathbf{z} \leftarrow \mathbf{0}$  // Resulting vector to return
for Element  $K$  in Mesh do
    localDOFs  $\leftarrow$  getLocalDOFsForElement( $K$ )
    globalDOFs  $\leftarrow$  getGlobalDOFsForElement( $K$ )
    // 1. Compute the Element matrix  $\mathbf{A}_K$ 
    for  $i \in \text{localDOFs}$  do
        for  $j \in \text{localDOFs}$  do
             $(\mathbf{A}_K)_{i,j} \approx$ 

$$\sum_k^{N_{\text{Int}}} \hat{\omega}_k \underbrace{(\mathbf{D}\Phi_K(\hat{\mathbf{q}}_k))^{-\top} \nabla \hat{b}^j(\hat{\mathbf{q}}_k) \cdot (\mathbf{D}\Phi_K(\hat{\mathbf{q}}_k))^{-\top} \nabla \hat{b}^i(\hat{\mathbf{q}}_k) |\det \mathbf{D}\Phi_K(\hat{\mathbf{q}}_k)|}_{=:\text{eval}(i,j,k)}$$

        end
    end
    // 2. Compute  $\mathbf{z} = \mathbf{A}\varpi$  contribution with  $\mathbf{A}_K$ 
    for  $i \in \text{localDOFs}$  do
         $I = \text{globalDOFs}[i]$ 
        for  $j \in \text{localDOFs}$  do
             $J = \text{globalDOFs}[j]$ 
             $\mathbf{z}_I \leftarrow \mathbf{z}_I + (\mathbf{A}_K)_{i,j} \cdot \varpi_J$ 
        end
    end
end
return  $\mathbf{z}$ 

```

Software Architecture

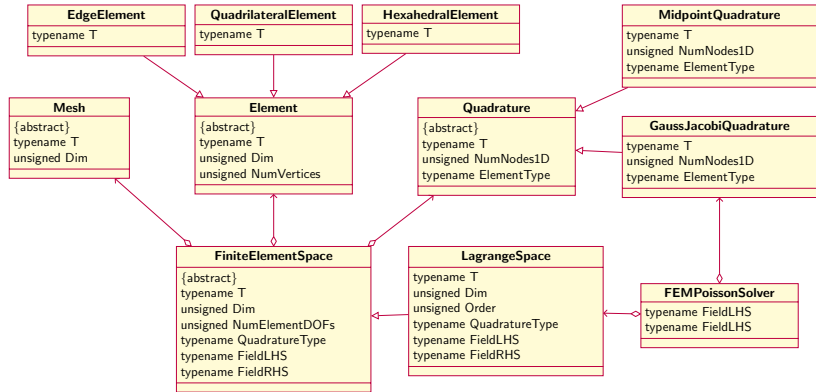


Figure: Software architecture of the FEM framework, showing the classes with their template arguments.

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Sinusoidal Problem

Problem:

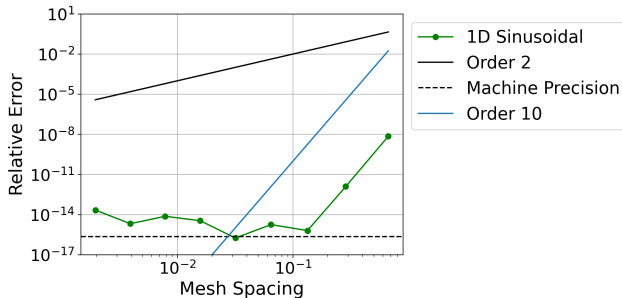
$$\begin{aligned} -\Delta u &= \pi^2 \sin(\pi x), & x \in [-1, 1], \\ u(x) &= 0, & x \in \{-1, 1\}. \end{aligned} \tag{6}$$

Exact solution:

$$u(x) = \sin(\pi x). \tag{7}$$

Mesh spacing: $h = \frac{2}{n-1}$.

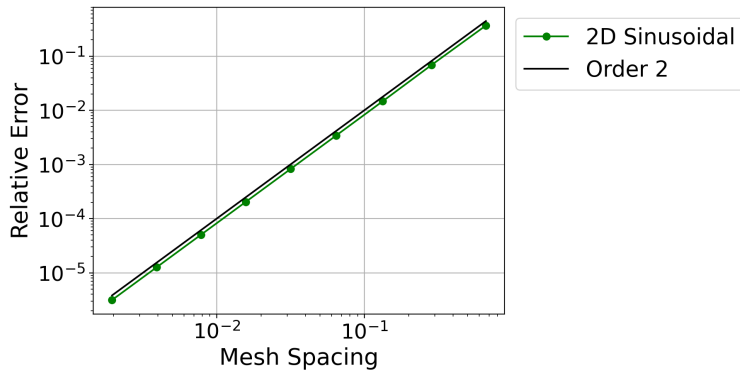
Results



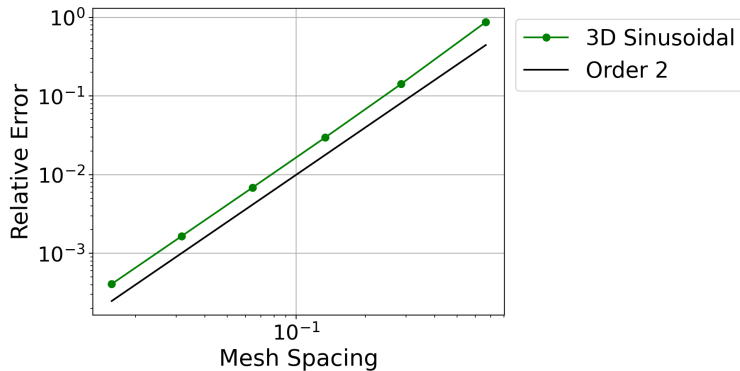
Expected convergence is order 2.

The trapezoidal quadrature rule converges rapidly when applied to analytic functions on periodic intervals. [3]

Results



Results



Conclusion

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 - Matrix-free Assembly Algorithm, with local evaluations, interfacing with the CG algorithm
 - Proof of concept solver implemented (FEMPoissonSolver)
- ⇒ A working beginning of a FEM framework in IPPL

Future Work

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- Adding support for more boundary conditions
 - non-homogeneous Dirichlet boundary conditions
 - (periodic boundary conditions)
- Parallelization, GPU support, scaling studies
- Adding more elements and finite element spaces
 - Nédélec
 - Raviart-Thomas

Bibliography

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