

# FASTMath Unstructured Mesh Technologies

E. Boman<sup>1</sup>, V. Dobrev<sup>2</sup>, D.A. Ibanez<sup>1</sup>, K.E. Jansen<sup>3</sup>, T. Kolev<sup>2</sup>, J.Merson<sup>4</sup>, **O. Sahni4, M.S. Shephard4, G.M. Slota4, C.W. Smith4 , V. Tomov2**

> **1Sandia National Laboratories 2Lawrence Livermore National Laboratory 3University of Colorado 4Rensselaer Polytechnic Institute**



### **Finite elements are a good foundation for large-scale simula1ons on current and future architectures**

- § Backed by well-developed theory
- Naturally support unstructured and curvilinear grids.
- § *Finite elements naturally connect different physics*



- § *High-order finite elements on high-order meshes*
	- increased accuracy for smooth problems
	- sub-element modeling for problems with shocks
	- bridge unstructured/structured grids
	- bridge sparse/dense linear algebra
	- HPC utilization, FLOPs/bytes increase with the order
- § *Need new (interesting!) R&D for full benefits*
	- meshing, discretizations, solvers, AMR, UQ, visualization, …



**8<sup>th</sup> order Lagrangian simulation** *of shock triple-point interaction* 



*Core-Edge tokamak EM wave propagation* 



## **Modular Finite Element Methods (MFEM)**

### *Flexible discretizations on unstructured grids*

- § Triangular, quadrilateral, tetrahedral, hexahedral, prism; volume, surface and topologically periodic meshes
- Bilinear/linear forms for: Galerkin methods, DG, HDG, DPG, IGA, ...
- Local conforming and non-conforming AMR, mesh optimization
- **Hybridization and static condensation**

### *High-order methods and scalability*

- § Arbitrary-order H1, H(curl), H(div)- [and L2 elements](http://mfem.org/examples)
- **•** Arbitrary order curvilinear meshes
- § MPI scalable to millions of cores + GPU accelerated
- **Enables development from laptops to exascale machines.**

### *Solvers and preconditioners*

- § Integrated with: HYPRE, SUNDIALS, PETSc, SLEPc, SUPERLU, VisIt, …
- AMG solvers for full de Rham complex on CPU+GPU, geometric MG
- **Time integrators: SUNDIALS, PETSc, built-in RK, SDIRK, ...**

### *Open-source software*

- § Open-source (GitHub) with 114 *contributors*, 50 *clones/day*
- Part of FASTMath, ECP/CEED, xSDK, OpenHPC, E4S, ...
- 75+ example codes & miniapps: mfem.org/examples



mfem  $(v4.7, M<sub>5</sub>)$ 











#### § Mesh

```
// 2. Read the mesh from the given mesh file. We can handle triangular,
64
       \overline{11}quadrilateral, tetrahedral, hexahedral, surface and volume meshes with
65\prime\primethe same code.
66Mesh *mesh;
67ifstream imesh(mesh file);
       if (limesh)
68
690172345677890
       \mathcal{L}cerr << "\nCan not open mesh file: " << mesh file << '\n' << endl;
          return 2:
       mesh = new Mesh(imesh, 1, 1);
       imesh.close();
       int \dim = mesh-Dimensional);
       // 3. Refine the mesh to increase the resolution. In this example we do
       \frac{1}{2}'ref levels' of uniform refinement. We choose 'ref levels' to be the
       \overline{11}largest number that gives a final mesh with no more than 50,000
       \prime\primeelements.
81<br>82<br>83<br>84
           int ref levels =
              (int)floor(log(50000./mesh->GetNE())/log(2.)/dim);
           for (int 1 = 0; 1 < ref_{levels; 1++})
85mesh->UniformRefinement();
86
```
#### § Finite element space



#### § Linear solve



#### § Visualization

160

- // 10. Send the solution by socket to a GLVis server. 152  $153$ if (visualization) 154  $\frac{154}{155}$ char vishost[] = "localhost"; 156 int visport =  $19916$ ; 157 socketstream sol\_sock(vishost, visport); 158 sol\_sock.precision(8); 159 sol sock << "solution\n" << \*mesh << x << flush;
	-



- works for any mesh & any H1 order
- **•** builds without external dependencies



Mesh **The State** 

```
63
       // 2. Read the mesh from the given mesh file. We can handle triangular,
64
             quadrilateral, tetrahedral, hexahedral, surface and volume meshes with
       \prime\prime65
       \prime\primethe same code.
66
       Mesh *mesh;
67
       ifstream imesh(mesh file);
68
       if (!imesh)
69
       €
70
          cerr << "\nCan not open mesh file: " << mesh file << '\n' << endl;
71return 2:
72
       F
73
       mesh = newMesh(imesh, 1, 1);74
       imesh.close();
75
       int dim = mesh-Dimensional):
76
77
       // 3. Refine the mesh to increase the resolution. In this example we do
78
       \prime\prime'ref levels' of uniform refinement. We choose 'ref levels' to be the
79
       \prime\primelargest number that gives a final mesh with no more than 50,000
80
             elements.
       \prime\prime81
       ſ
82
          int ref levels =
83
              (int) floor(log(50000./mesh->GetNE())/log(2.)/dim);84
          for (int l = 0; l < ref levels; l++)85
             mesh->UniformRefinement();
86
       Y
```


Finite element space  $\mathcal{L}_{\mathcal{A}}$ 





#### Initial guess, linear/bilinear forms  $\mathcal{C}^{\mathcal{A}}$





Linear solve  $\mathcal{L}_{\mathcal{A}}$ 



Visualization  $\mathbb{R}^n$ 





### **Example 1 – parallel Laplace equation**

 $(2)$ 



**Parallel data decomposition in BLASTINI** 

§ Parallel mesh





**•** Parallel finite element space Darallol finito alamant

 $(1)$ 

122 ParFiniteElement



**•** Parallel initial guess, linear/bilinear forms Parallel Initial gi

```
|130|ParLinearForm *b = new ParLinearForm(fespace);
\vert 138
         ParGridFunction x(fespace);
147ParBilinearForm *a = new ParBilinearForm(fespace);
```
§ Parallel assembly

// 10. Define the parallel (hypre) matrix and vectors representing  $a(.,.)$ 155 156  $b(.)$  and the finite element approximation. 157 HypreParMatrix \*A = a->ParallelAssemble();  $HyperParVector *B = b->ParallelAssemble();$ 158 159  $HyperParVector *X = x.ParallelAverage();$ 

$$
A = P^T a P \qquad B = P^T b \qquad x = PX
$$

#### § Parallel linear solve with AMG

- // 11. Define and apply a parallel PCG solver for AX=B with the BoomerAMG 164
- 165 preconditioner from hypre.
- 166  $HyperSolver *amp = new HyperBoomerAMG(*A);$ 167
- HyprePCG \*pcg = new HyprePCG(\*A);  $pcg - SetTol(1e-12);$ 168
- 169 pcg->SetMaxIter(200);
- 170 pcg->SetPrintLevel(2);
- 171 pcg->SetPreconditioner(\*amg);
- 172  $pcg->Mult(*B, *X);$

#### § Visualization

// 14. Send the solution by socket to a GLVis server. 194  $\frac{195}{196}$ if (visualization)  $197$ char vishost[] = "localhost";  $int \; \text{vispost} = 19916;$ 198<br>199<br>200 socketstream sol sock(vishost, visport);<br>sol\_sock << "parallel " << num\_procs << " " << myid << "\n";  $201$  $sol$  sock.precision $(8)$ ; 202 sol\_sock << "solution\n" << \*pmesh << x << flush; 203



- highly scalable with minimal changes
- § build depends on *hypre* and METIS





### **Example 1 – parallel Laplace equation**

```
// 5. Define a parallel mesh by a partitioning of the serial mesh. Refine
101
102
        \prime\primethis mesh further in parallel to increase the resolution. Once the
103
              parallel mesh is defined, the serial mesh can be deleted.
        \prime\primeParMesh *pmesh = new ParMesh (MPI COMM WORLD, *mesh);
104
105
        delete mesh:
106
        \left\{ \right.107
           int par ref levels = 2;
108
           for (int l = 0; l < par ref levels; l++)pmesh-YIniformRefinement();
109
110
122ParFiniteElementSpace *fespace = new ParFiniteElementSpace(pmesh, fec);
       ParLinearForm *b = new ParLinearForm(fespace);
130ParGridFunction x(fespace);
138
147ParBilinearForm *a = new ParBilinearForm(fespace);
155
        // 10. Define the parallel (hypre) matrix and vectors representing a(.,.)156
               b(.) and the finite element approximation.
        ^{\prime\prime}157HyperParMatrix *A = a->ParallelAssemble();
158
        HyperParVector *B = b->ParallelAssemble();
159
        HyperParVector *X = x.ParallelAverage();// 11. Define and apply a parallel PCG solver for AX=B with the BoomerAMG
164165
               preconditioner from hypre.
        \prime\prime166
        Hypresolver *amq = new HypreBoomerAMG(*A);167
        HyperPCG *pcq = new HyperPCG(*A);168
        pcq->SetTol(1e-12);169
        pcg->SetMaxIter(200);
170
        pcq->SetPrintLevel(2);
171
        pcg->SetPreconditioner(*amg);
172
        pcq->Mult(*B, *X);sol sock << "parallel " << num procs << " " << myid << "\n";
200
201
           sol sock.precision(8);
           sol sock << "solution\n" << *pmesh << x << flush;
202
```


## **MFEM example codes: mfem.org/examples**

- § 40+ example codes, most with both serial + parallel versions
- § Tutorials to learn MFEM features
- Starting point for new applications
- **Show integration with many external packages**
- Miniapps: more advanced, ready-to-use physics solvers





**Example Codes and Miniapps** 

Example 1: Laplace Probler

Example 2: Linear Elasticity

 $-\text{div}(a)$  in  $\theta = 0$ 

### **Demo**

### https://xsdk-project.github.io/MathPackagesTraining2024/ lessons/mfem\_convergence/





### **Some large-scale simulation codes powered by MFEM**



**Inertial confinement fusion (BLAST)**



**Topology optimization for** additive manufacturing (LiDO)



**MRI modeling (Harvard Medical)** 





**Core-edge tokamak EM wave propagation (SciDAC, RPI)** 



**Heart modeling (Cardioid) Adaptive MHD island**<br> **Adaptive MHD island**<br> **Coalescence (SciDAC, LANL)** 



### **BLAST models shock hydrodynamics using high-order FEM in both Lagrangian and Remap phases of ALE**



### **High-order finite elements lead to more accurate, robust**  and reliable hydrodynamic simulations





## **High-order finite elements have excellent strong scalability**

*Strong scaling, p-refinement*

*Strong scaling, fixed #dofs*



*Finite element partial assembly FLOPs increase faster than runtime*



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## **Conforming & Nonconforming Mesh Refinement**

■ Conforming refinement



Nonconforming refinement



Natural for quadrilaterals and hexahedra $\mathcal{L}^{\mathcal{L}}$ 



### **MFEM's unstructured AMR infrastructure**

### **Adaptive mesh refinement on library level:**

- Conforming local refinement on simplex meshes
- *Non-conforming refinement for quad/hex meshes*
- h-refinement with fixed p

### **General approach:**

- any high-order finite element space, H1, H(curl), H(div), …, on any high-order curved mesh
- $-2D$  and  $3D$
- arbitrary order hanging nodes
- anisotropic refinement
- derefinement
- serial and parallel, including parallel load balancing
- independent of the physics (easy to incorporate in applications)





*Shaper miniapp*



### **General nonconforming constraints** Simple example: first order *H*(*curl*) (edge elements)



*Constraint: e = f = d/2*

#### Constraint: *e* = *f* = *d/*2 *Indirect constraints*



 $\alpha$  in  $\beta$ ... *More complicated in 3D…*

Some methods enforce 2:1 ratio between

 $Uich$  and  $q$  alements *High-order elements*



#### *Constraint: local interpolation matrix*

$$
s = Q \cdot m, \quad Q \in \mathbb{R}^{9 \times 9}
$$



### **Variational Restriction Nonconforming variational restriction**

General constraint:

$$
y = Px, \quad P = \left[ \begin{array}{c} I \\ W \end{array} \right].
$$

*x* – conforming space DOFs,

*y* – nonconforming space DOFs (unconstrained + slave),

 $dim(x) \leq dim(y)$ 

*W* – interpolation for slave DOFs

Constrained problem:

$$
P^TAPx=P^Tb,
$$

$$
y = Px.
$$



### **Nonconforming variational restriction**





### **Nonconforming variational restriction**



Regular assembly of A on the elements of the (cut) mesh





### **Nonconforming variational restriction**



Conforming solution  $y = P x$ 



### **AMR = smaller error for same number of unknowns**







*Anisotropic adaptation to shock-like fields in 2D & 3D*



### **Parallel dynamic AMR, Lagrangian Sedov problem**



*Adaptive, viscosity-based refinement and derefinement. 2nd order Lagrangian Sedov* *Parallel load balancing based on spacefilling curve partitioning, 16 cores*



### **Parallel AMR scaling to ~400K MPI tasks**



- weak+strong scaling up to ~400K MPI tasks on BG/Q
- **measure AMR only components**: interpolation matrix, assembly, marking, refinement & rebalancing (no linear solves, no "physics")



## **Fundamental finite element operator decomposition**

The assembly/evaluation of FEM operators can be decomposed into **parallel**, **mesh topology**, **basis**, and **geometry/physics** components:



\* *libCEED,* github.com/ceed/libceed

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### **Example of a fast high-order operator**

#### Poisson Example. Variational Form: *Poisson problem in variational form*

Find 
$$
u \in Q_p \subset \mathcal{H}_0^1
$$
 s.t.  $\forall v \in Q_p$ ,

$$
\int_{\Omega}\nabla u\cdot\nabla v=\int_{\Omega}fv
$$

#### <sup>r</sup>*<sup>v</sup> ·* <sup>r</sup>*u dV* <sup>=</sup> <sup>X</sup>  $\boldsymbol{\mathsf{Stiff}}$ ness matrix (unit coefficient) <sup>r</sup>*v<sup>e</sup> ·* <sup>r</sup>*u<sup>e</sup> dV* <sup>=</sup> <sup>X</sup>

$$
\int_{\Omega} \nabla \varphi_i \nabla \varphi_j = \sum_{E} \int_{E} \nabla \varphi_i \nabla \varphi_j
$$
\n
$$
= \sum_{E} \sum_{k} \alpha_k J_E^{-1}(q_k) \hat{\nabla} \hat{\varphi}_i(q_k) J_E^{-1}(q_k) \hat{\nabla} \hat{\varphi}_j(q_k) |J_E(q_k)|
$$
\n
$$
= \sum_{E} \sum_{k} \hat{\nabla} \hat{\varphi}_i(q_k) \underbrace{(\alpha_k J_E^{-T}(q_k) J_E^{-1}(q_k)) J_E(q_k)}_{\text{maximize } \varphi_j(q_k) |J_E(q_k)|}
$$
\n
$$
= \sum_{E} \sum_{k} \hat{\nabla} \hat{\varphi}_i(q_k) \underbrace{(\alpha_k J_E^{-T}(q_k) J_E^{-1}(q_k) |J_E(q_k)|)}_{\text{maximize } \varphi_j(q_k)}
$$
\n
$$
= \sum_{E} \sum_{k} \hat{\nabla} \hat{\varphi}_i(q_k) \underbrace{(\alpha_k J_E^{-T}(q_k) J_E^{-1}(q_k) |J_E(q_k)|)}_{\text{maximize } \varphi_j(q_k)}
$$
\n
$$
= \sum_{E} \sum_{k} \hat{\nabla} \hat{\varphi}_i(q_k) \underbrace{(\alpha_k J_E^{-T}(q_k) J_E^{-1}(q_k) |J_E(q_k)|)}_{\text{maximize } \varphi_j(q_k)}
$$
\n
$$
= \sum_{E} \sum_{k} \hat{\nabla} \hat{\varphi}_i(q_k) \underbrace{(\alpha_k J_E^{-T}(q_k) J_E^{-1}(q_k) |J_E(q_k)|)}_{\text{maximize } \varphi_j(q_k)}
$$
\n
$$
= \sum_{E} \sum_{k} \hat{\varphi}_i(q_k) \underbrace{(\alpha_k J_E^{-T}(q_k) J_E^{-1}(q_k) |J_E(q_k)|)}_{\text{maximize } \varphi_j(q_k)}
$$
\n
$$
= \sum_{E} \sum_{k} \hat{\varphi}_i(q_k) \underbrace{(\alpha_k J_E^{-T}(q_k) J_E^{-1}(q_k) |J_E(q_k)|)}_{\text{maximize } \varphi_j(q_k)}
$$
\n
$$
= \sum_{E} \sum_{k} \hat{\varphi}_i(q_k) \underbrace{(\alpha_k J_E^{-T}(q_k) J_E^{-1}(q_k) |J_E(q_k)|)}_{\text{maximize } \varphi_j(q
$$

Z mapping (geometric factors) • *J* is the Jacobian of the element



- $\overline{a}$  : ้นล ually Boolean (except AMR) R)  $\overline{y}$ • *G* is usually Boolean (except AMR)
- Element matrices  $A_E = B^TDB$ , are full, account for bulk of the physics, can be applied in parallel



and the sum-factorization in the sum-separation in the set of A<sub>E</sub>, just apply its action in C<sub>R</sub> is action in C<sub>R</sub> is a Boolean in case of A<sub>E</sub>, is a COD in case of A<sub>E</sub>, is a COD in case of A<sub>E</sub>, is a COD in case of A<sub>E</sub> based on actions of *B*, *BT* and *D*

### **CEED BP1 bakeoff on BG/Q**



 $\blacktriangledown$  All runs done on BG/Q (for repeatability), 16384 MPI ranks. Order p = 1, ..., 16; quad. points q = p + 2.

 $\checkmark$  BP1 results of MFEM+xlc (left), MFEM+xlc+intrinsics (center), and deal.ii + gcc (right) on BG/Q.

#### ✔ Paper: "Scalability of High-Performance PDE Solvers", IJHPCA, 2020

 $\checkmark$  Cooperation/collaboration is what makes the bake-offs rewarding.



## **Device support in MFEM**

*MFEM support GPU acceleration in many linear algebra and finite element operations*



- Several MFEM examples + miniapps have been ported with small changes
- § Many kernels have a single source for CUDA, RAJA and OpenMP backends
- Backends are runtime selectable, can be mixed
- Recent improvements in CUDA, HIP, RAJA, SYCL, ...

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*"MFEM: A modular finite element methods library"*, CAMWA 2020



### **MFEM performance on multiple GPUs**



Problem size: 10+ million

Best total performance: **2.1 TDOF/s** Largest size: 34 billion

**Optimized kernels for MPI buffer packing/unpacking on the GPU** 



### **Recent improvements on NVIDIA and AMD GPUs**



*New MFEM GPU kernels: perform on both V100 + MI100,*

*can utilize tensor cores on A100 have better strong scaling, achieve 10+ GDOFs on H100*



*MI250X results in the CEED-MS39 report:* ceed.exascaleproject.org/pubs



## **Matrix-free preconditioning**

- *Explicit matrix assembly impractical at high order:* – Polynomial degree  $p$ , spatial dimension d
	- Matrix assembly  $+$  sparse matvecs:
		- $O(p^{2d})$  memory transfers
		- $O(p^{3d})$  computations
		- can be reduced to  $O(p^{2d+1})$  computations by sum factorization
	- Matrix-free action of the operator (partial assembly):
		- $O(p^d)$  memory transfers *optimal*
		- $O(p^{d+1})$  computations *nearly-optimal*
		- efficient iterative solvers *if combined with effective preconditioners*
- *Challenges:*
	- Traditional matrix-based preconditioners (e.g. AMG) not available
	- Condition number of diffusion systems grows like  $O(p^3/h^2)$





#### ATPESC 2024

## Low-Order-Refined (LOR) preconditioning

Efficient LOR-based preconditioning of H1, H(curl), H(div) and L2 high-order operators



- Pick LOR space and HO basis so P=R=I (Gerritsma, Dohrmann) Г
- $A<sub>LOR</sub>$  is sparse and spectrally equivalent to  $A<sub>HO</sub>$  $\mathcal{L}_{\mathcal{A}}$

**Theorem 2.** Let  $M_{\star}$  and  $K_{\star}$  denote the mass and stiffness matrices, respectively, where  $\star$  represents one of the above-defined finite element spaces with basis as in Section  $\overline{4.3}$ . Then we have the following spectral equivalences, independent of mesh size h and polynomial degree p.

> $M_{V_h} \sim M_{V_n}$ ,  $K_{V_h} \sim K_{V_n}$  $M_{\mathbf{W}_h} \sim M_{\mathbf{W}_p}, \qquad K_{\mathbf{W}_h} \sim K_{\mathbf{W}_p},$  $M_{\mathbf{X}_h} \sim M_{\mathbf{X}_p}, \qquad K_{\mathbf{X}_h} \sim K_{\mathbf{X}_p},$  $M_{Y_h} \sim M_{Y_{n-1}}$  $M_{Z_h} \sim M_{Z_v}$ ,  $K_{Z_h} \sim K_{Z_v}$ .

 $(A_{HO})^{-1} \approx (A_{LOR})^{-1} \approx B_{LOR}$  - can use BoomerAMG, AMS, ADS  $\overline{\phantom{a}}$ 

 $\beta = 10^{-6}$ Copper  $\beta=1$  $\nabla \times \nabla \times \boldsymbol{u} + \beta \boldsymbol{u} = \boldsymbol{f}$ 







"Low-order preconditioning for the high-order de Rham complex", Pazner, Kolev, Dohrmann, 2022

### **High-order FE methods show promise for high-quality &**  performance simulations on exascale platforms

- § **More information and publications**
	- MFEM **mfem.org**
	- BLAST **computation.llnl.gov/projects/blast**
	- CEED **ceed.exascaleproject.org**
- § **Open-source software**



- § **Ongoing R&D** 
	- GPU-oriented algorithms for Frontier, Aurora, El Capitan
	- Matrix-free scalable preconditioners
	- Automatic differentiation, design optimization
	- Deterministic transport, multi-physics coupling



*Q4 Rayleigh-Taylor singlematerial ALE on 256 processors* 



### **Upcoming MFEM Events**

#### **MFEM in the Cloud Tutorial**

August 22, 2024



October 22-24, 2024





https://mfem.org/tutorial https://mfem.org/workshop

**ALINE Seminar series: https://mfem.org/seminar** 





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