

# Block Preconditioning for Multi-physics: From Jacobi to Schur Complements

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# A Segregated System

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$$\begin{bmatrix} A_{00} & A_{01} & \cdots & A_{0N} \\ A_{10} & A_{11} & \cdots & A_{1N} \\ \vdots & \vdots & \ddots & \vdots \\ A_{N0} & A_{N1} & \cdots & A_{NN} \end{bmatrix} \begin{bmatrix} x_0 \\ x_1 \\ \vdots \\ x_N \end{bmatrix} = \begin{bmatrix} b_0 \\ b_1 \\ \vdots \\ b_N \end{bmatrix}$$

- Most of  $A_{ij}$  are “large sparse” matrices
- This structure is common:
  1. Multi-physics (the focus of this talk)
  2. Constraints
  3. Optimization
- “Effective preconditioners” are robust and scalable for these systems



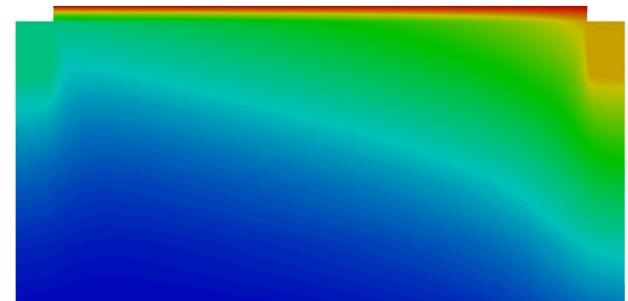
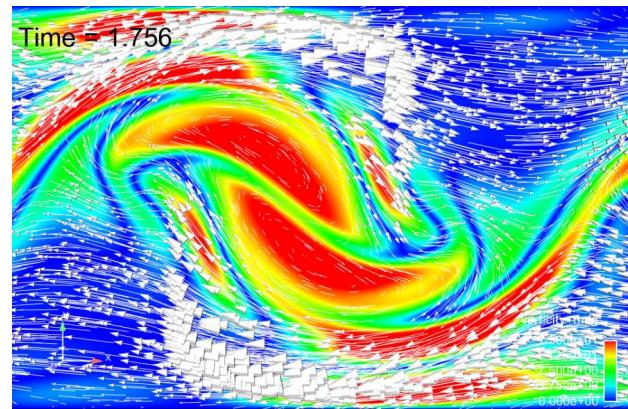
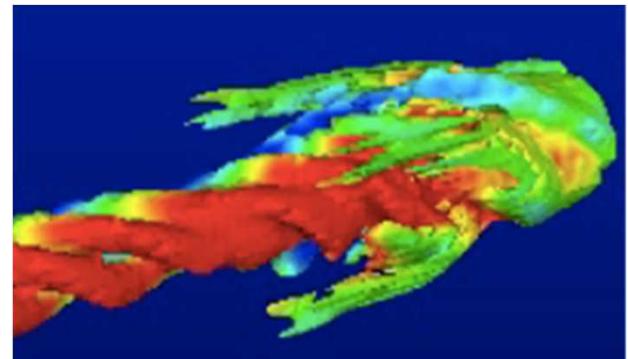
# Multi-Physics PDEs

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My working definition: Multi-physics PDEs are characterized by multiple interacting time and spatial scales arising from coupling between many distinct physical fields and mechanisms.

For example

1. Fluid-dynamics
2. Magnetohydrodynamics
3. Semiconductor modeling
4. Many more...



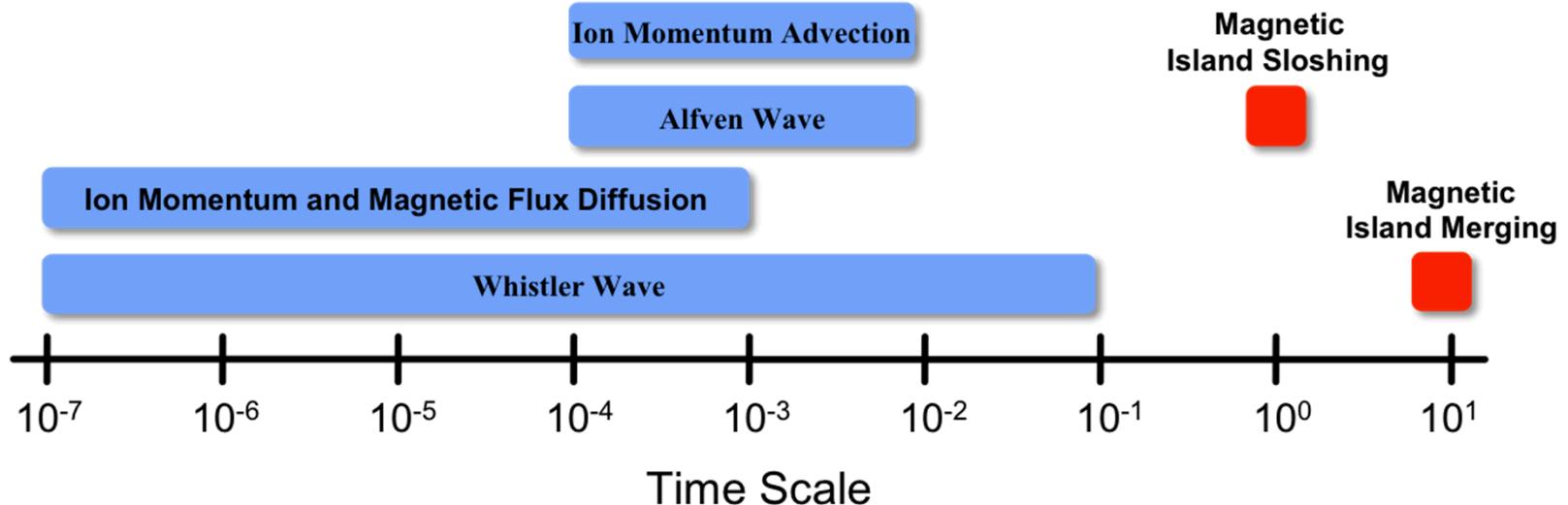


# MHD example: Multiple Time Scales

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MHD has multiple interacting time scales

- Often much faster than target mechanism
- Interaction makes operator splitting more challenging (time scales not well separated)
- We will use implicit time stepping with block preconditioners targeting each time scale





# Some “Classical” Block Preconditioners

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$$M^{-1} = \begin{bmatrix} A_{00} & & & \\ & A_{11} & & \\ & & \ddots & \\ & & & A_{NN} \end{bmatrix}^{-1}$$

Jacobi

$$M^{-1} = \begin{bmatrix} A_{00} & A_{01} & \cdots & A_{0N} \\ A_{11} & \cdots & & A_{1N} \\ \ddots & & \ddots & \\ & & & A_{NN} \end{bmatrix}^{-1}$$

Gauss-Seidel

Benefits:

- Easy to implement!
- Nice convergence theory

When are they “effective”?

- Little coupling
- One directional coupling



# Schur Complements for 2x2 Systems

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Use a block LU factorization:

$$\begin{bmatrix} A_{00} & A_{01} \\ A_{10} & A_{11} \end{bmatrix} = \begin{bmatrix} I & \\ A_{10}A_{00}^{-1} & I \end{bmatrix} \begin{bmatrix} A_{00} & A_{01} \\ & S \end{bmatrix}$$

$$\text{where } S = A_{11} - A_{10}A_{00}^{-1}A_{01}$$

An important result:

M. F. Murphy, G. H. Golub, and A. J. Wathen, A note on preconditioning for indefinite linear systems, SISC, 21 (2000).

$$M_{SC} = \begin{bmatrix} A_{00} & A_{01} \\ & S \end{bmatrix}$$



# A First-Order PDE

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Assume positive  $a_{**}$ , simplifies to a second order wave:

$$\frac{\partial}{\partial t} \begin{bmatrix} u \\ v \end{bmatrix} + \begin{bmatrix} a_{uu} & a_{uv} \\ a_{vu} & a_{vv} \end{bmatrix} \frac{\partial}{\partial x} \begin{bmatrix} u \\ v \end{bmatrix} = \begin{bmatrix} 0 \\ 0 \end{bmatrix}$$

Using a finite difference discretization, Jacobian is:

$$\begin{bmatrix} A_{00} & A_{01} \\ A_{10} & A_{11} \end{bmatrix} = \begin{bmatrix} \frac{1}{\Delta t} I + a_{uu} D & a_{uv} D \\ a_{vu} D & \frac{1}{\Delta t} I + a_{vv} D \end{bmatrix}$$



# Three Block Preconditioners

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$$M_J = \begin{bmatrix} A_{00} & & \\ & & A_{11} \end{bmatrix}$$

$$M_{GS} = \begin{bmatrix} A_{00} & A_{01} \\ & A_{11} \end{bmatrix}$$

$$M_{SC} = \begin{bmatrix} A_{00} & A_{01} \\ & S \end{bmatrix}$$

- $h=1/500, \Delta t=h$
- GMRES iterations averaged over 10 steps
- Required inverses of  $A_{00}, A_{11}$ , and  $S$  computed directly

$a_{uu}/a_{vv}$	$a_{uv}$	$a_{vu}$	$M_J$	$M_{GS}$	$M_{SC}$	CF	L
1	1	1	2	2	2	1	
1	10	10	42	34	2	10	
1	10	10	31	251	2	100	
0	0	7					
1	10	1	3.8	3	2	3	
1	10	1	44	42	2	10	
0							
1	10	10	14	131	2	31	
0			1				
10	1	1	3	2	2	0.1	
10	10	10	2	3	2	1	
10	10	10	77	49	2	10	
0	0						



# My “Algorithm” for Block Preconditioner Development

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A quick and dirty (i.e. non-rigorous) approach to understanding what is included in a block preconditioner:

1. Consider the desired time step  $\Delta t$
2. Look at *explicit* stability limit of all time scales:
  - Diffusion:  $v\Delta t/\Delta x^2$
  - Advection:  $|u|\Delta t/\Delta x$
  - Waves (typically from coupling):  $|w|\Delta t/\Delta x$
3. Everything where the stability limit is “relatively large” for the desired time step must be addressed in the preconditioner!



## Incompressible Navier-Stokes

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$$\partial_t \mathbf{u} + \mathbf{u} \cdot \nabla \mathbf{u} - \nabla \cdot \nu \nabla \mathbf{u} + \nabla p = \mathbf{f}$$

$$\nabla \cdot \mathbf{u} = 0$$

Segregated Jacobian is (C=0 implies stable discretization):

$$\begin{bmatrix} F & B^T \\ B & C \end{bmatrix} = \begin{bmatrix} I & \\ BF^{-1} & I \end{bmatrix} \begin{bmatrix} F & B^T \\ & S \end{bmatrix} \Rightarrow M = \begin{bmatrix} \hat{F} & B^T \\ & \hat{S} \end{bmatrix}$$

$$\text{where } \hat{S} \approx C - BF^{-1}B^T$$

- $F^{-1} \approx \hat{F}^{-1}$  using multigrid
- $S^{-1} \approx \hat{S}^{-1}$  using SIMPLEC, PCD or LSC



# Navier-Stokes: SIMPLEC Schur Complement

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Use Neumann series expansion (assume)

$$F^{-1} = M^{-1} \sum_{i=0}^{\infty} (I - FM^{-1})^i$$

Truncate after  $K$  terms

$$\hat{S} = C - B \left( M^{-1} \sum_{i=0}^{K-1} (I - FM^{-1})^i \right) B^T$$

For  $K=0$ : explicitly compute approximate Schur complement

- $M^{-1} = \mathbf{diag}(F)^{-1}$  is SIMPLE
- $M^{-1} = \mathbf{absRowSum}(F)^{-1}$  is SIMPLEC

SIMPLE-like methods restricted by assumptions on Neumann series

- CFL like constraint on time step for effective preconditioner



# Navier-Stokes: Commuting

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To avoid CFL restriction, try another approach: Assume

$$\nabla \cdot \left( \frac{\partial}{\partial t} + \mathbf{w} \cdot \nabla - \nu \nabla^2 \right)_u \approx \left( \frac{\partial}{\partial t} + \mathbf{w} \cdot \nabla - \nu \nabla^2 \right)_p \nabla.$$

motivates discrete commuting

$$BQ_u^{-1}F \approx F_p Q_p^{-1}B$$

which gives an approximate Schur complement (for  $C=0$ )

$$S = -BF^{-1}B^T \approx -Q_p F_p^{-1} (BQ_u^{-1}B^T) := \hat{S}$$

$F_p$  is a discrete convection-diffusion operator on pressure

# Navier-Stokes: PCD Approximation

$$S^{-1} \approx -(BQ_u^{-1}B^T)^{-1}F_pQ_p^{-1}$$



Need to approximate

1. Inverse of pressure Laplacian
2. Application of pressure convection-diffusion operator
3. Pressure mass inverse (just use a lumped inverse!)

Pressure Convection-Diffusion (PCD) method

- Explicit construction Laplacian and conv-diff operators

$$-\nabla \cdot \nabla \sim A_p \quad \frac{\partial}{\partial t} + \mathbf{w} \cdot \nabla - \nu \nabla \cdot \nabla \sim F_p$$

- Gives PCD schur complement approximation

$$S^{-1} \approx S_{PCD}^{-1} := A_p^{-1} F_p Q_p^{-1}$$

# Navier-Stokes: LSC Approximation

PCD works well – but not algebraic!

- requires extra infrastructure to construct  $A_p$  and  $F_p$

Least-Squares Commutator (**LSC**) addresses this

$$(F_p Q_p^{-1})^T \approx \operatorname{argmin}_X \|B^T X - F^T Q_u^{-1} B^T\|$$

Substituting LS approximation of  $F_p$  into  $S$  gives

$$S^{-1} \approx S_{LSC}^{-1} := -(B Q_u^{-1} B^T)^{-1} (B Q_u^{-1} F Q_u^{-1} B^T) (B Q_u^{-1} B^T)^{-1}$$

Approximated with AMG   Easy to evaluate 

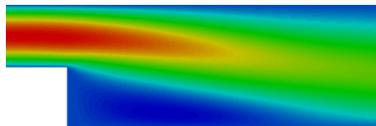


# Navier-Stokes: Schur Complement Summary

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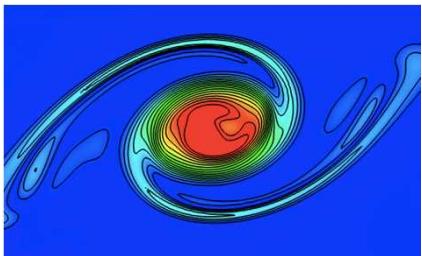
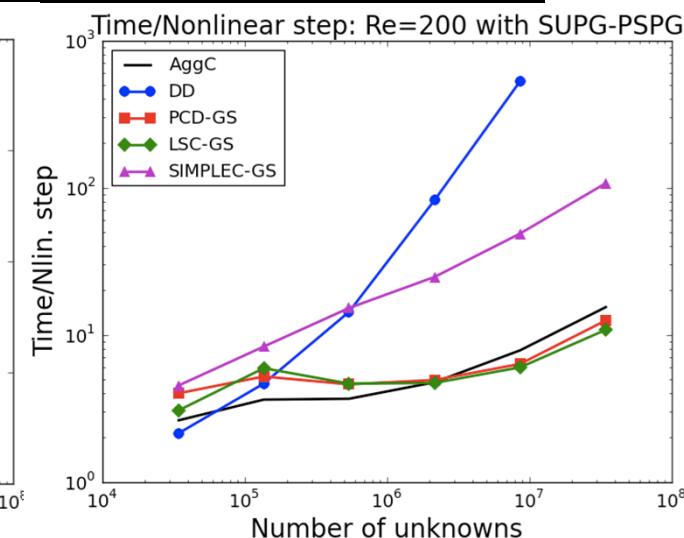
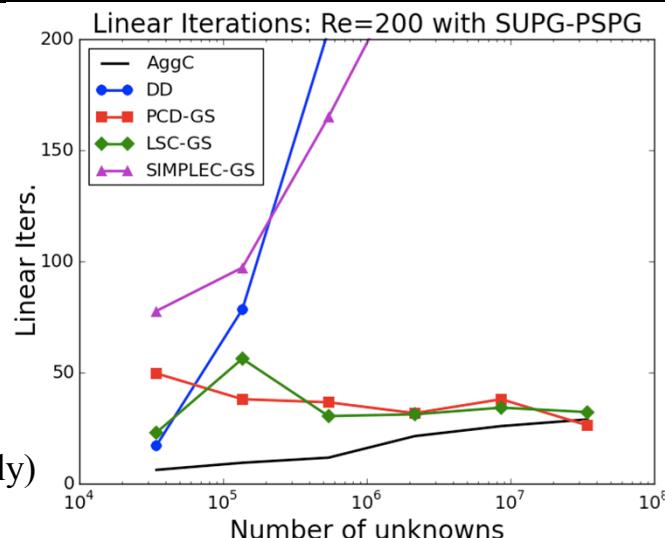
	$S = -BF^{-1}B^T$	Inverses Required
SIMPLEC	$-B \text{AbsRowSum}(F)^{-1}B^T$	$-B \text{AbsRowSum}(F)^{-1}B^T$
PCD	$Q_p F_p^{-1} A_p$	$A_p^{-1}$
LSC	$-(BQ_u^{-1}B^T)(BQ_u^{-1}FQ_u^{-1}B^T)^{-1}(BQ_u^{-1}B^T)$	$(BQ_u^{-1}B^T)^{-1}$

# Navier-Stokes: Results



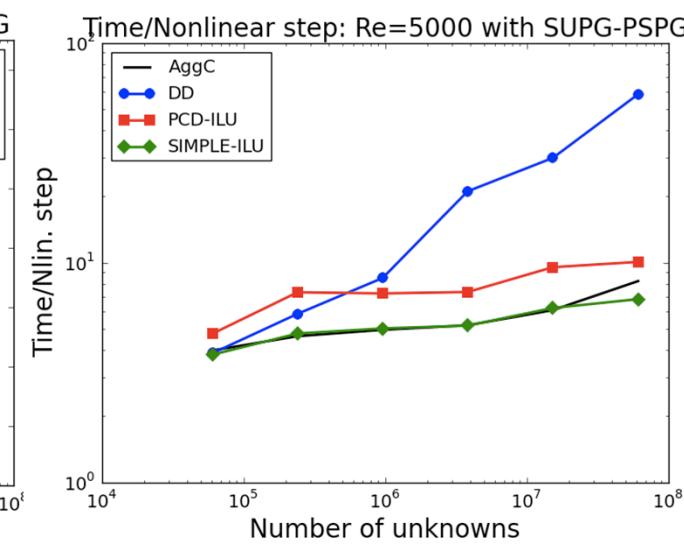
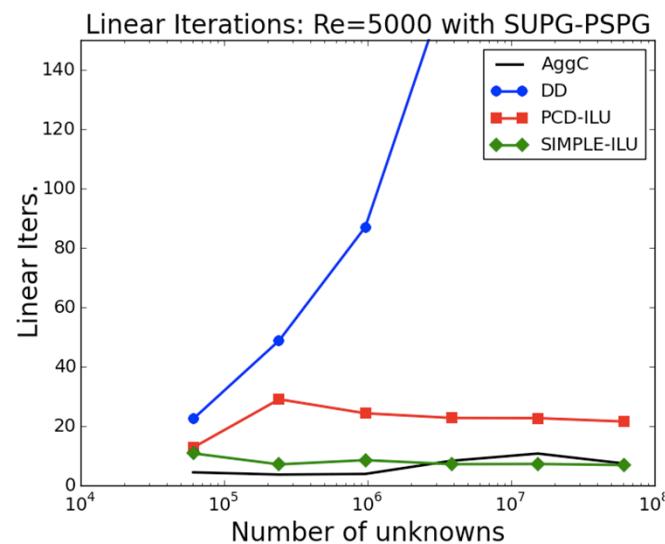
## Backward Facing Step: Steady

- $Re = 200$
- 1 to 1024 Processors
- Stabilization:
  - Pressure: PSPG
  - Velocity: SUPG (residual only)



## Kelvin Helmholtz: Transient

- $Re = 5000$
- 1 to 1024 Processors
- Stabilization: SUPG & PSPG
- CFL = 2.5





# Incompressible MHD: B-Field Lagrange Multiplier Formulation

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Magnetohydrodynamics (MHD) equations couple **fluid flow** to **magnetics** equations

$$\frac{\partial \mathbf{u}}{\partial t} + \mathbf{u} \cdot \nabla \mathbf{u} - \nu \nabla^2 \mathbf{u} + \nabla p - \frac{1}{\mu_0} (\nabla \times \mathbf{B}) \times \mathbf{B} = \mathbf{f}$$

$$\nabla \cdot \mathbf{u} = 0$$

$$\frac{\partial \mathbf{B}}{\partial t} - \nabla \times (\mathbf{u} \times \mathbf{B}) + \frac{\eta}{\eta_0} \nabla \times \nabla \times \mathbf{B} + \nabla r = \mathbf{0}$$

$$\nabla \cdot \mathbf{B} = 0$$

Using a stabilized finite element formulation

$$\mathcal{J} \mathbf{x} = \begin{bmatrix} F & B_p^T & Z \\ B_p & C_u & \\ Y & & D & B_r^T \\ & & B_r & C_B \end{bmatrix} \begin{bmatrix} \mathbf{u} \\ p \\ \mathbf{B} \\ r \end{bmatrix} = \begin{bmatrix} \mathbf{f} \\ 0 \\ \mathbf{0} \\ 0 \end{bmatrix}$$

- Equal order basis functions for all fields,  $C_u$  and  $C_B$  are nonzero stabilization operators



## Multiple Time Scales: MHD

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$$\frac{\partial \mathbf{u}}{\partial t} + \mathbf{u} \cdot \nabla \mathbf{u} - \nu \nabla^2 \mathbf{u} + \nabla p - \frac{1}{\mu_0} (\nabla \times \mathbf{B}) \times \mathbf{B} = \mathbf{f}$$

$$\nabla \cdot \mathbf{u} = 0$$

$$\frac{\partial \mathbf{B}}{\partial t} - \nabla \times (\mathbf{u} \times \mathbf{B}) + \frac{\eta}{\eta_0} \nabla \times \nabla \times \mathbf{B} + \nabla r = \mathbf{0}$$

$$\nabla \cdot \mathbf{B} = 0$$

Some time scales are obvious:

- Diffusion (fast, often implicit)
- Elliptic constraints (real fast, often implicit)
- Advection (fast or slow, explicit or implicit)

Others are not so obvious (to me anyway)



## Multiple Time Scales: MHD

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$$\frac{\partial \delta \mathbf{u}}{\partial t} + \mathbf{u} \cdot \nabla \delta \mathbf{u} + \nabla \delta p - \frac{1}{\mu_0} (\nabla \times \delta \mathbf{B}) \times \mathbf{B} = 0$$

$$\nabla \cdot \delta \mathbf{u} = 0$$

$$\frac{\partial \delta \mathbf{B}}{\partial t} - \nabla \times (\delta \mathbf{u} \times \mathbf{B}) + \nabla \delta r = 0$$

$$\nabla \cdot \delta \mathbf{B} = 0$$

A linearization about  $(\mathbf{u}, \mathbf{B})$ , dropped diffusive terms

- Particulars of linearization important to fixed point convergence

Alfvén Wave generated by coupling

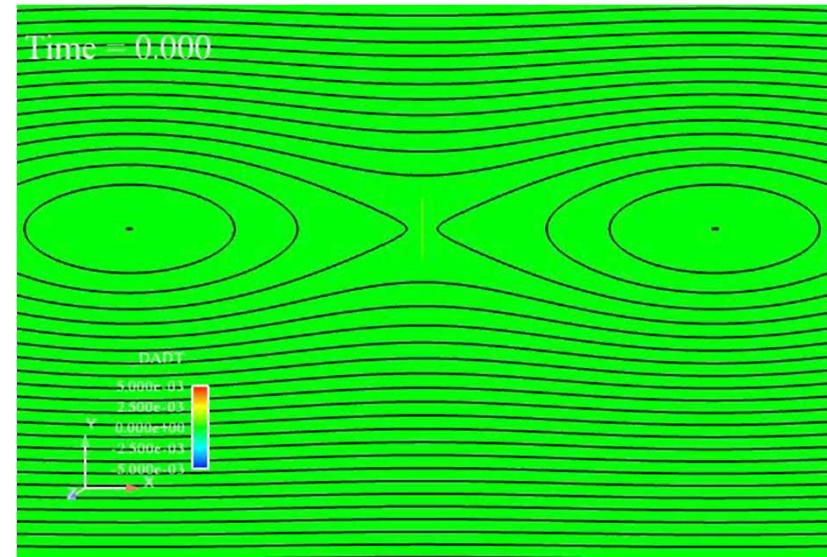
- Highlighted coupling gives wave speed:  $v_A = \frac{|\mathbf{B}|}{\sqrt{\rho \mu_0}}$
- Secondary gives wave “character”: anisotropic



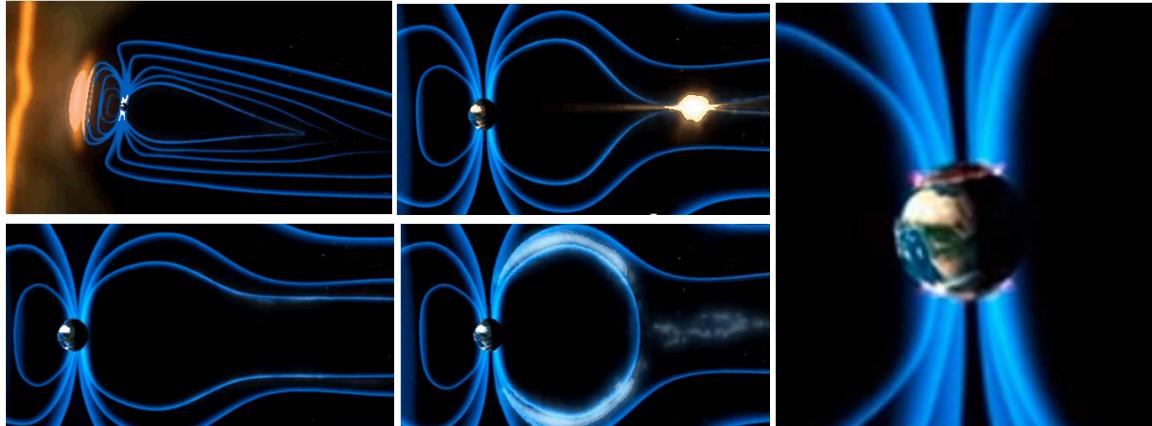
# Can I see the Alfvén wave?

Yep! Alfvén wave effects can be seen clearly in magnetic reconnection

Magnetic Reconnection Simulation



NASA Magnetic Reconnection Animation



[https://www.youtube.com/watch?v=i\\_x3s8ODaKg](https://www.youtube.com/watch?v=i_x3s8ODaKg)

Aurora Borealis



[http://en.wikipedia.org/wiki/File:Northern\\_Lights\\_2.jpg](http://en.wikipedia.org/wiki/File:Northern_Lights_2.jpg)



# Splitting for MHD

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Two split block factorization preconditioners

**A** 
$$\mathcal{M}_{Split-3 \times 3} = \begin{bmatrix} F & \hat{Z} \\ \hat{Y} & \hat{D} \end{bmatrix} \begin{bmatrix} F^{-1} & & \\ & I & \\ & & I \end{bmatrix} \begin{bmatrix} F & B^T \\ B & C \\ & I \end{bmatrix}$$

- Coupled multigrid for magnetics ( $\hat{D}$ )
- Block LU with SIMPLEC for Magnetics-Velocity (Alfvén)
  - Block LU with PCD or SIMPLEC for Fluids

**B** 
$$\mathcal{M}_{Split-4 \times 4} = \begin{bmatrix} F & Z & & \\ Y & I & D & \\ & & I \end{bmatrix} \begin{bmatrix} F^{-1} & & & \\ & I & & \\ & & D^{-1} & \\ & & & I \end{bmatrix} \begin{bmatrix} F & B_u^T & & \\ B_u & C_u & D & B_b^T \\ & & B_b & C_b \end{bmatrix}$$

- Block LU with SIMPLEC for Magnetics-Velocity (Alfvén)
  - Block LU with PCD or SIMPLEC for Fluids
  - Block LU with SIMPLEC for magnetics

**Shameless plug** - previous splitting for 2D vector potential MHD formulation in: Cyr, *et al.*, “*A new approximate block factorization for 2D incompressible (reduced) resistive MHD*”, *SISC* 2013



# Do these splittings work?

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Structurally small perturbation:

$$\mathcal{M}_{Split-3 \times 3} = \begin{bmatrix} F & B^T & \hat{Z} \\ B & C & \\ \hat{Y} & \boxed{YF^{-1}B^T} & \hat{D} \end{bmatrix}$$

Favorable spectrum:

$$\mathcal{JM}_{Split-3 \times 3}^{-1} = \begin{bmatrix} I & & \\ & I & \\ A_1 & A_2 & (D - YF^{-1}K_uZ)\hat{P}^{-1} \end{bmatrix}$$

$$A_1 = YF^{-1}K_u$$

$$A_2 = -YF^{-1}B^T S_u^{-1}$$

$$S_u = C - BF^{-1}B^T$$

$$K_u = I + B^T S_u^{-1} B F^{-1}$$

$$\hat{P} = D - YF^{-1}Z$$

# Do these splittings work?

Structurally small perturbation:

$$\mathcal{M}_{Split-4 \times 4} = \begin{bmatrix} F & B_u^T & Z & \boxed{ZD^{-1}B_r^T} \\ B_u & C_u & & \\ Y & \boxed{YF^{-1}B_u^T} & D & B_r^T \\ & & B_r & C_r \end{bmatrix}$$

Favorable (?) spectrum:

$$\mathcal{JM}_{Split-4 \times 4}^{-1} = \begin{bmatrix} I & & A_1 & A_2 \\ & I & & \\ A_3 & A_4 & (D - YF^{-1}K_uZ)\hat{P}^{-1} & \\ & & & I \end{bmatrix}$$

$$A_1 = Z(-I + D^{-1}K_bD)\hat{P}^{-1}$$

$$A_2 = -ZD^{-1}B_b^T S_b^{-1}$$

$$A_3 = YF^{-1}K_u$$

$$A_4 = -YF^{-1}B^T S_u^{-1}$$

$$S_u = C - BF^{-1}B^T$$

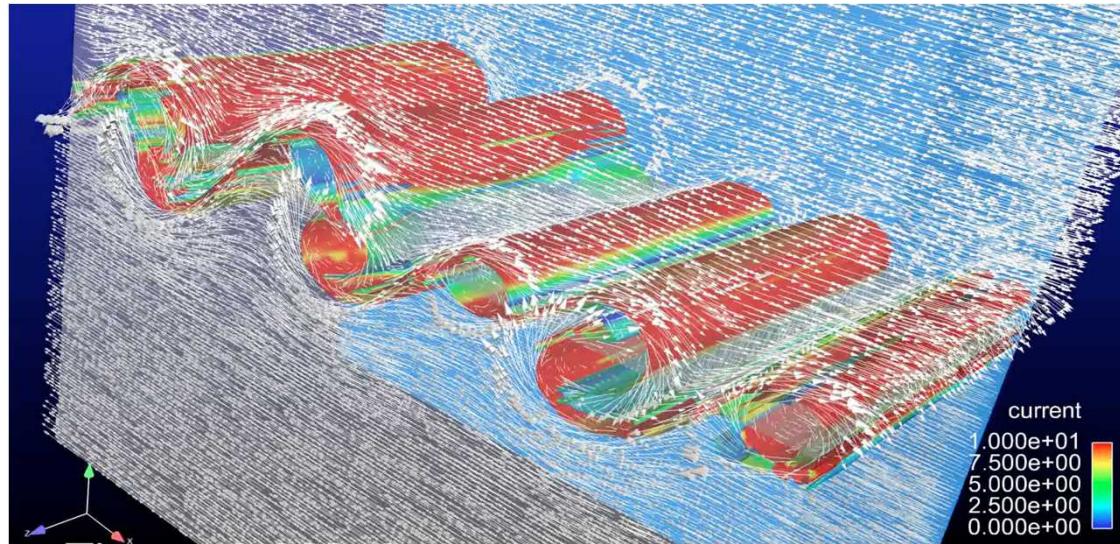
$$S_b = C - BD^{-1}B^T$$

$$\hat{P} = D - YF^{-1}Z$$

$$K_u = I + B^T S_u^{-1} BF^{-1}$$

$$K_b = I + B^T S_b^{-1} BD^{-1}$$

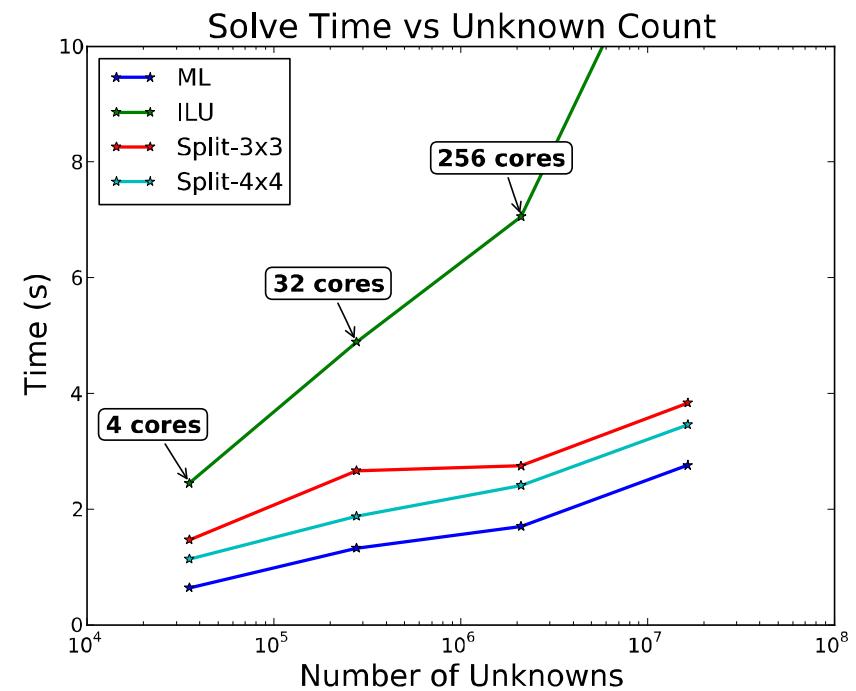
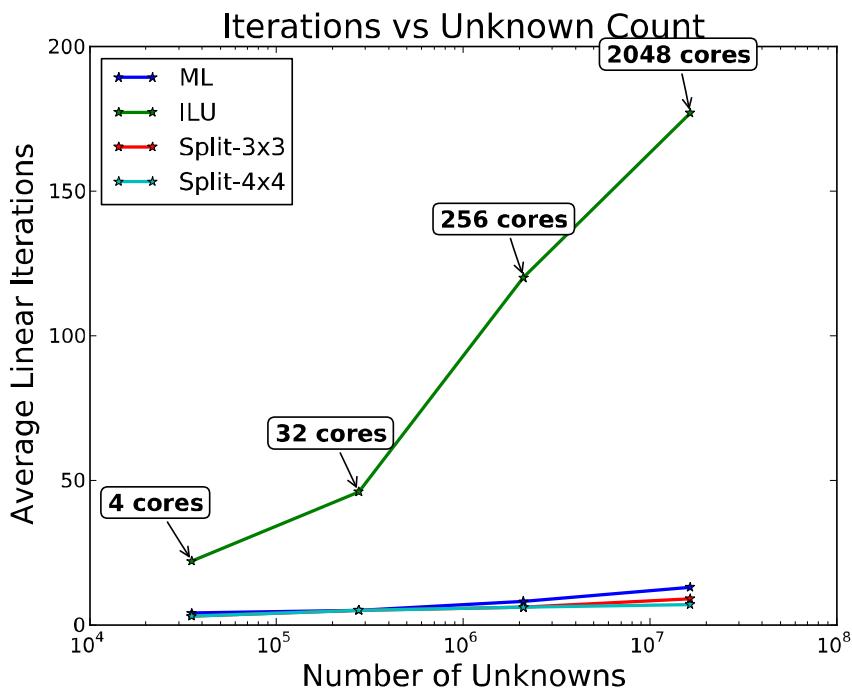
# Hydromagnetic Kelvin Helmholtz (HMKH)



## Results details:

- Magnetically stabilized 3D shear layer transient simulation
- Run to 5 time units with 2<sup>nd</sup> order BDF
- Uniform mesh (bilinear elements, 8 unknowns/node)
- Run on 4, 32, 256, 2048 processors (~8,000 unks/core)

# HMKH: Weak Scaling (CFL~0.125)



## Fully coupled Algebraic

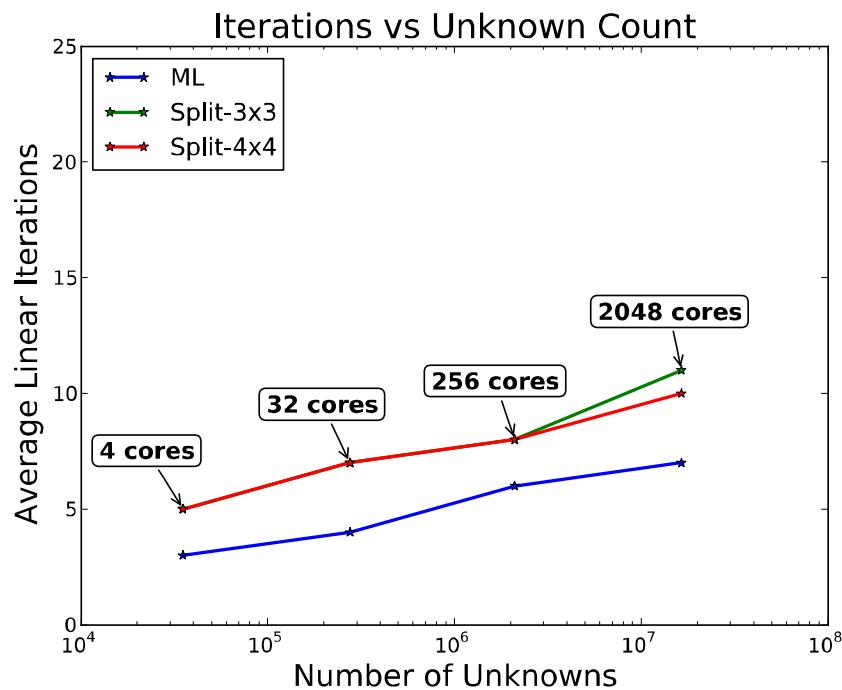
ML: Uncoupled AMG with repartitioning  
DD: Additive Schwarz Domain Decomposition

## Block Preconditioners

**Split-3x3:** 3x3 Splitting (SIMPLEC everywhere)  
**Split-4x4:** 4x4 Splitting (SIMPLEC everywhere)

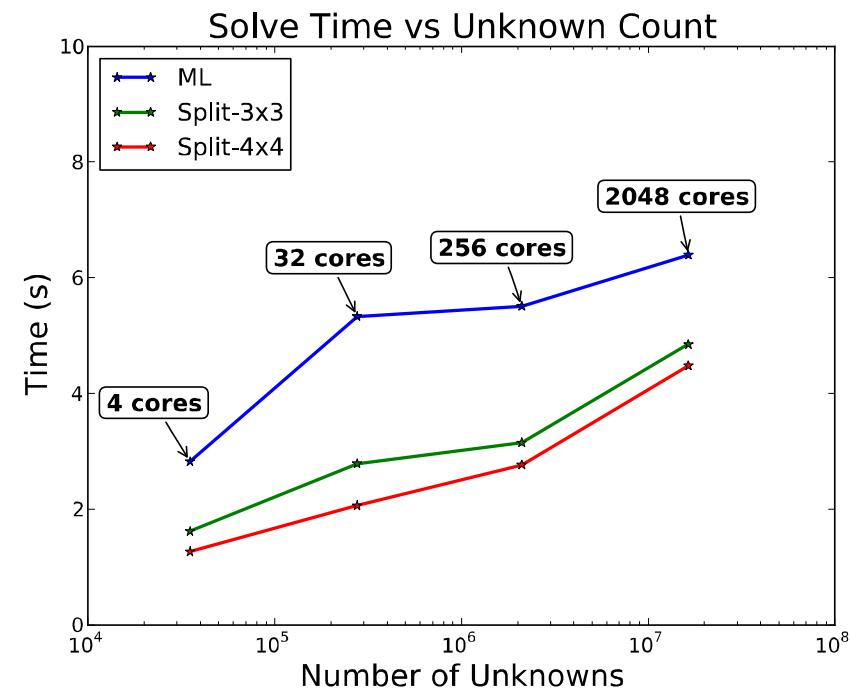
**Take home:** Split preconditioner scales algorithmically,  
more relevant for mixed discretizations

# HMKH: Weak Scaling (CFL~1.125)



## Fully coupled Algebraic

ML: Uncoupled AMG with repartitioning  
DD: Additive Schwarz Domain Decomposition

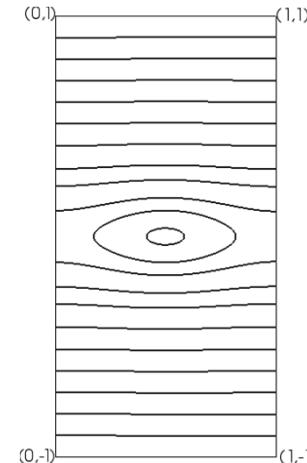
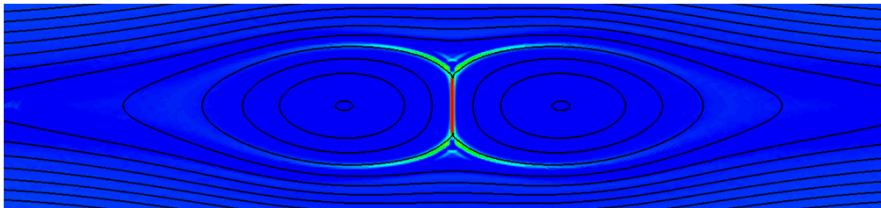
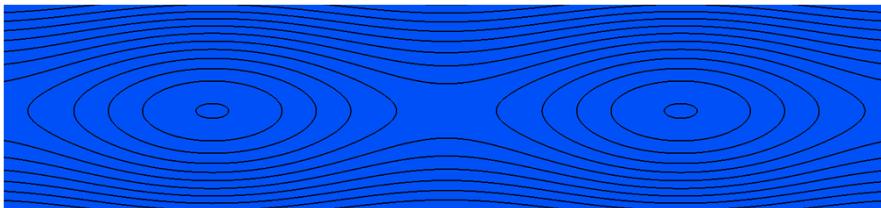


## Block Preconditioners

Split-3x3: 3x3 Splitting (SIMPLEC everywhere)  
Split-4x4: 4x4 Splitting (SIMPLEC everywhere)

**Take home:** Split preconditioner scales algorithmically,  
more relevant for mixed discretizations

# Island Coalescence (IC): 2D Vector Potential



Simulation on half domain

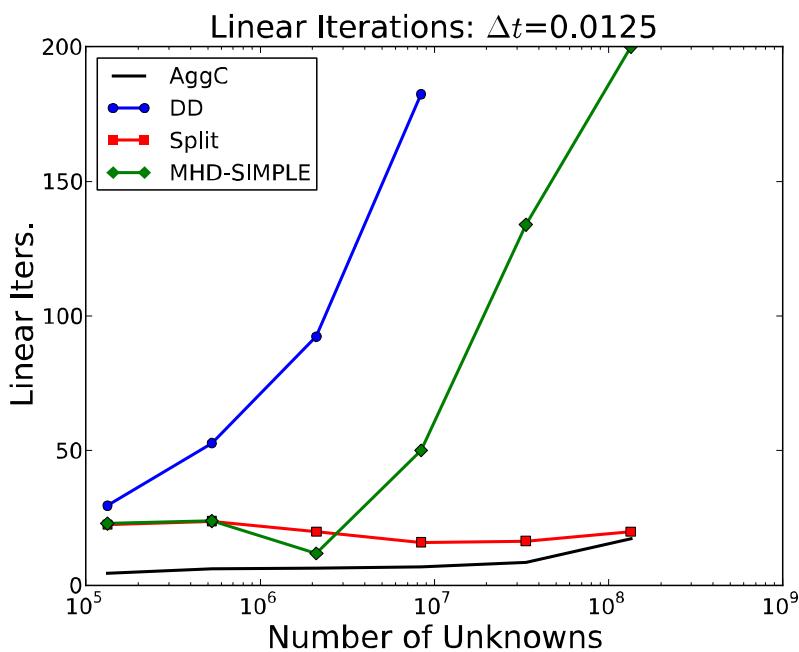
- Symmetry BC
- Perturbed Harris-Sheet

$$A_z^0(x, y, 0) = \delta \ln \left[ \cosh \left( \frac{y}{\delta} \right) + \epsilon \cos \left( \frac{x}{\delta} \right) \right]$$

Results details (an initial study):

- Lundquist number:  $10^4$
- Starting time right before reconnection: 5.75s
- Results averaged over 45 uniform timesteps
- Run on 1, 4, 16, 64, 256, and 1024 processors ( $\sim 33000$  unks/core)

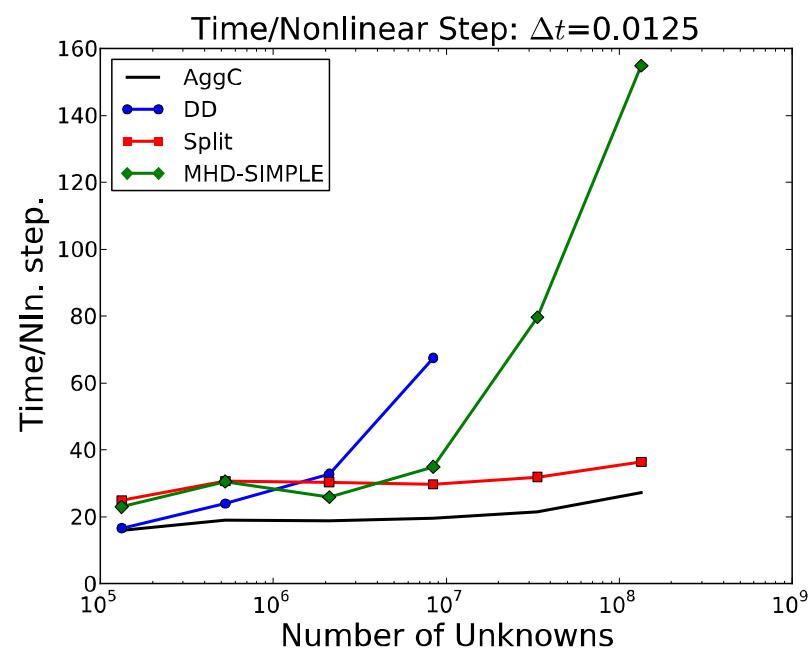
# IC: Weak Scaling



## Fully coupled Algebraic

AggC: Aggressive Coarsening Multigrid

DD: Additive Schwarz Domain Decomposition



## Block Preconditioners

Split: New Operator split preconditioner

SIMPLEC: Extreme diagonal approximations

**Take home:** Split preconditioner scales algorithmically,  
more relevant for mixed discretizations



# Final Thoughts

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Discussed block preconditioning

- Multi-physics has broad range of time and spatial scales
- Block Jacobian segregated by physical field
- For tightly coupled physics **must handle coupling**
- Coupling in Schur complement
- Scalability attained by leveraging multigrid

Showed Results for Navier-Stokes

- Presented SIMPLE, PCD and LSC approximations
- Showed scaling results for stabilized discretizations

Show results for 2D MHD

- Developed operator-split preconditioner
  - Focuses on elliptic incompressibility and Alfvén wave
- Showed results indicating good performance