

# EMPIRE – EM/PIC/Fluid Simulation Code

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# Agenda

- Overview of goals
- EMPIRE-EM
  - Flexibility of design
  - Performance portability
- EMPIRE-PIC
- EMPIRE-Fluid
- Future work
- Summary

# Goals

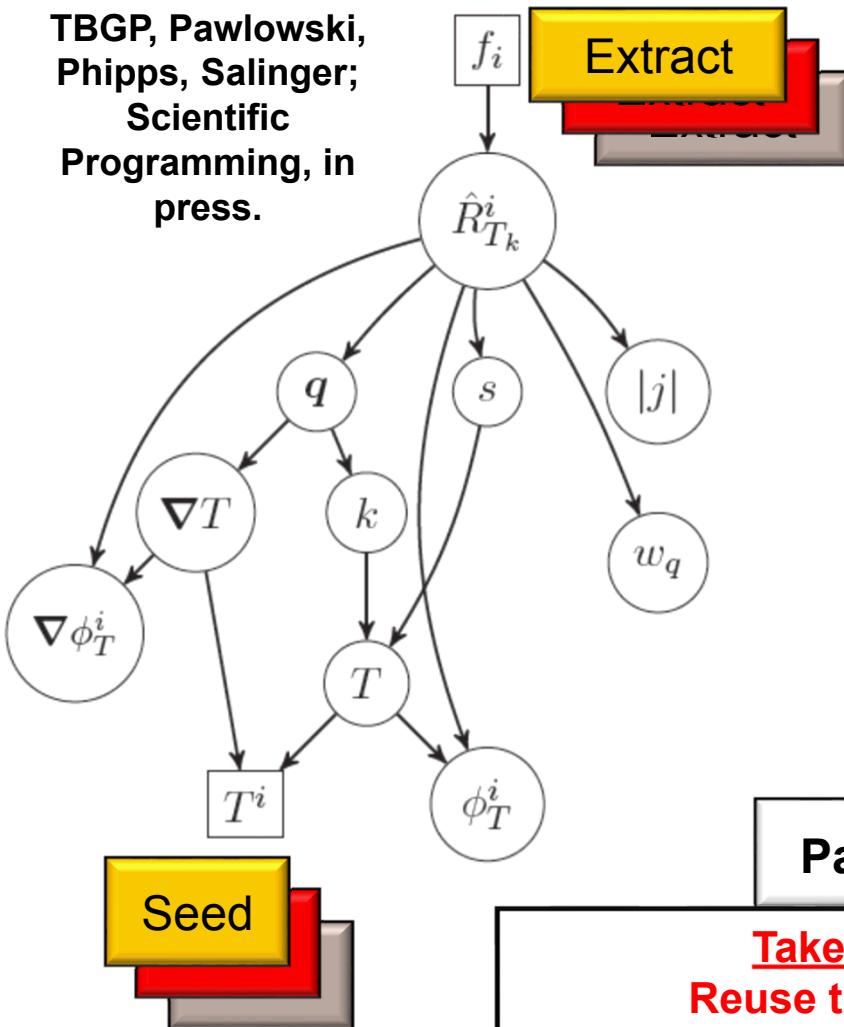
- EMPIRE – ElectroMagnetic Plasma In Realistic Environments
  - Open source application being developed for next generation platforms
- Modular design
  - Electromagnetics/electrostatics and alternate EM closures
  - Multi-fluid and Particle in Cell plasma modules
- Performance portability
  - Ability to run on modern computing platforms with a single code base
  - Kokkos abstraction to parallel backends
    - Cuda, OpenMP, Pthreads
- Advanced time integration
  - Implicit-Explicit (IMEX) methods
- Beyond forward simulation
  - Embedded sensitivities, adjoints, etc

# EMPIRE-EM

- EMPIRE-EM is designed to provide solvers for Maxwell's equations
  - Currently two approximations
    - Full Maxwell
    - Electrostatic
  - Could add magnetostatic or Darwin approximations
- Built upon Trilinos and the Panzer library
  - Directed acyclic graph assembly using Phalanx
  - Linear and nonlinear model descriptions through Thyra model-evaluators
  - Block based linear solvers/preconditioners through Thyra/Teko
  - Sensitivities - automatic differentiation through Sacado

# Handling Complexity in Analysis Requirements

TBGP, Pawlowski,  
 Phipps, Salinger;  
 Scientific  
 Programming, in  
 press.



$$f(x) = \sum_{k=1}^{N_w} f_k = \sum_{k=1}^{N_w} Q_k^T \hat{R}_{T_k}^i (P_k x)$$

$$\hat{R}_T^i = \sum_{e=1}^{N_e} \sum_{q=1}^{N_q} [-\nabla \phi_T^i \cdot q + \phi_T^i s] w_q |j| = 0$$

**Evaluation Type**      **Scalar Type**

$f(x, p)$       **double**

$J = \frac{\partial f}{\partial x}$       **DFad<double>**

$\frac{\partial^2 f}{\partial x_i \partial x_j}$       **DFad< DFad<double> >**

Param. Sens., Jv, Adjoint, PCE (SGF, SGJ), AP

Take Home Message:

Reuse the same code base!

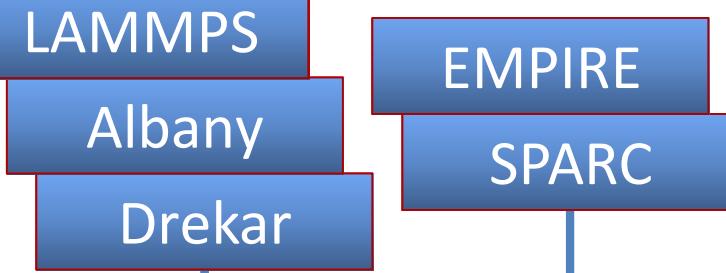
Equations decoupled from algorithms!  
 Machine precision accuracy!

# Performance Portability

- Once a graph is built we need to assemble and solve the graph efficiently on all different platforms
  - For linear problems we can build our matrices, preconditioners once and solve them many times
  - Solve application needs to be completed on device, however, setup can be done on the CPU
- Utilize Kokkos library for performance portability
  - Abstracts the hardware and programming models from the developer
  - Allows for compile time optimizations for memory layouts and access patterns
- Protects from future architecture changes, somewhat...

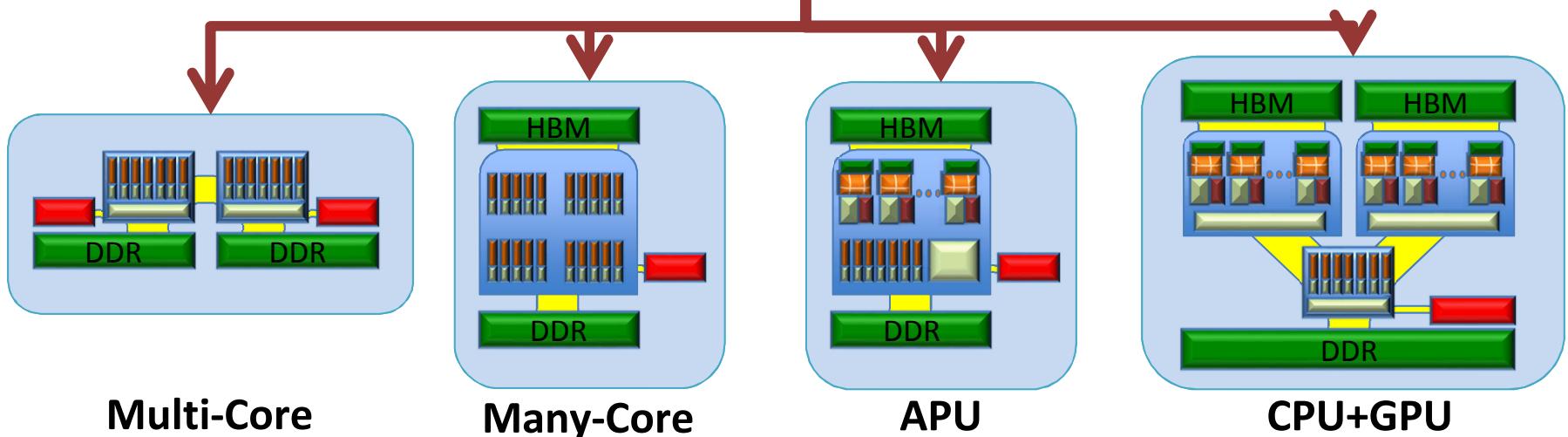
# What is Kokkos?

## Applications & Libraries



## Kokkos

performance portability for C++ applications



Cornerstone for performance portability across next generation HPC architectures at multiple DOE laboratories, and other organizations.

# Patterns, Policies, and Spaces

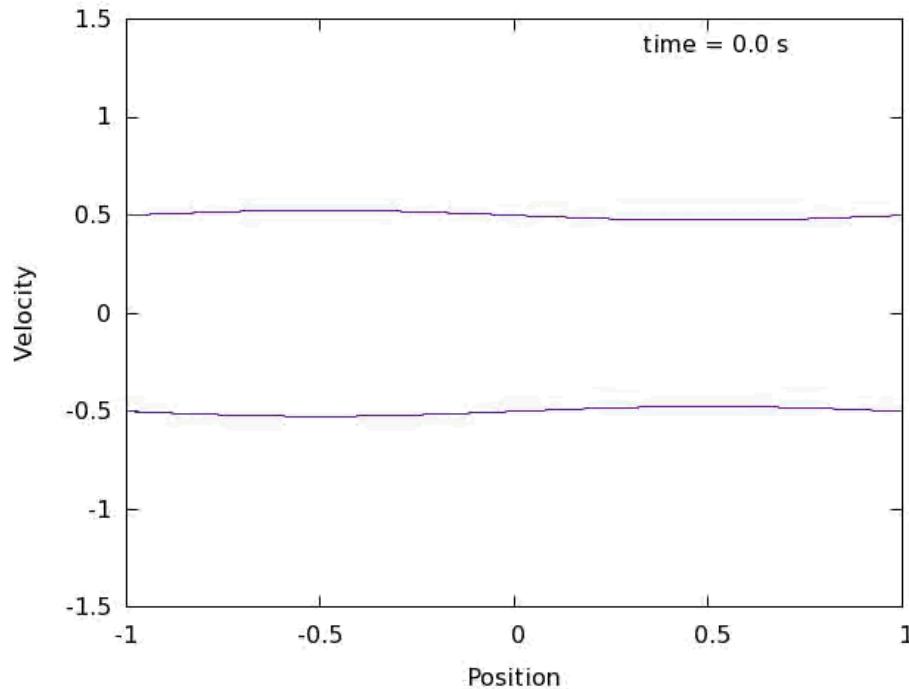
- **Parallel Pattern** of user's computations
  - parallel\_for, parallel\_reduce, parallel\_scan, task-graph, ... (*extensible*)
- **Execution Policy** tells *how* user computation will execute
  - Static scheduling, dynamic scheduling, thread-teams, ... (*extensible*)
- **Execution Space** tells *where* computations will execute
  - Which cores, numa region, GPU, ... (*extensible*)
- **Memory Space** tells *where* user data resides
  - Host memory, GPU memory, high bandwidth memory, ... (*extensible*)
- **Layout (policy)** tells *how* user array data is laid out
  - Row-major, column-major, array-of-struct, struct-of-array ... (*extensible*)
- Differentiating: Layout and Memory Space
  - Versus other programming models (OpenMP, OpenACC, ...)
  - Critical for performance portability ...

# EMPIRE-PIC

- Goal – develop a plasma simulation tool using the Particle In Cell (PIC) technique
- Built off the mini-PIC PIC algorithm
  - All field solve modified to use the Panzer based code
- Current status
  - Works on unstructured meshes for both EM/ES
    - Charge conserving current weighting for electromagnetic
    - Higher order fields for electrostatic
    - Lumped and consistent mass matrix for electric and magnetic field projections
  - MPI+X parallelization
    - Platform independent
  - General leap-frog time integration
  - Simple beam injection boundary conditions

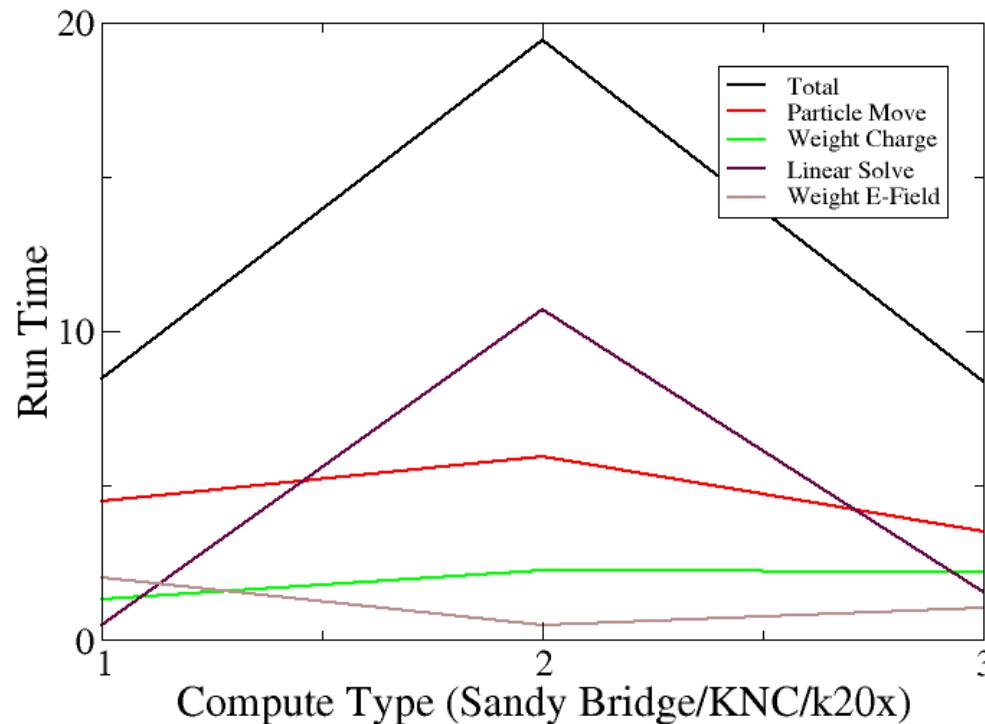
# Initial verification

- We have demonstrated initial convergence results for simple problems
  - Plasma oscillation (EM/ES)
  - TM mode through a plasma (EM)
  - Growth rate for two stream and decay rate for Landau damping (ES)



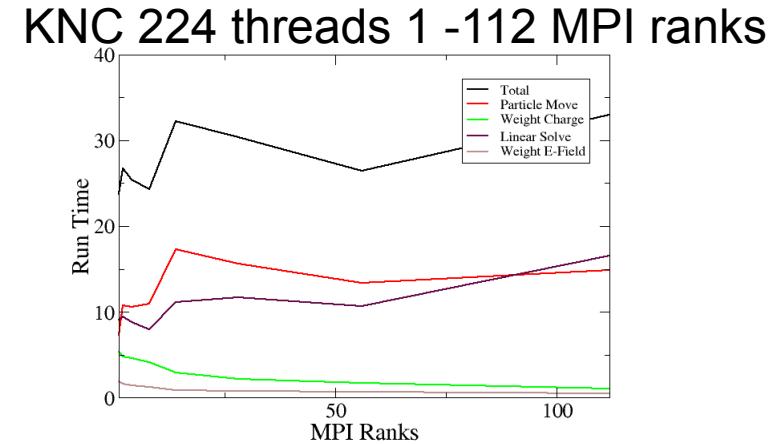
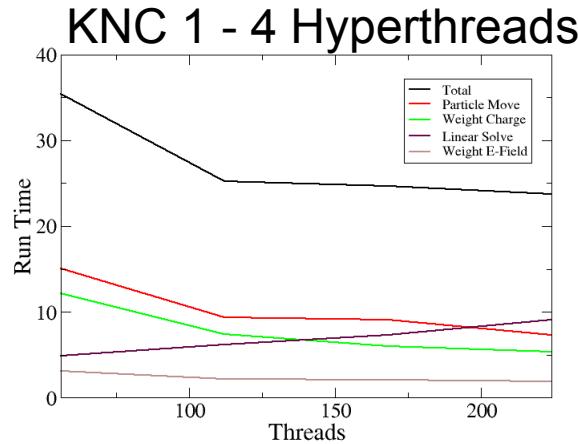
# Portable Performance

- Computed time per node on several machines
  - 18k unknowns and 11M particles, 20 timesteps CFL = 1.5
  - 16 cores of Sandy Bridge – 2 Knights Corner – 1NVidia k20x

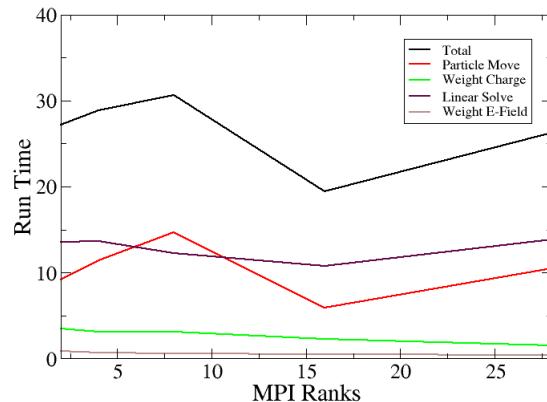


# MPI vs Threads

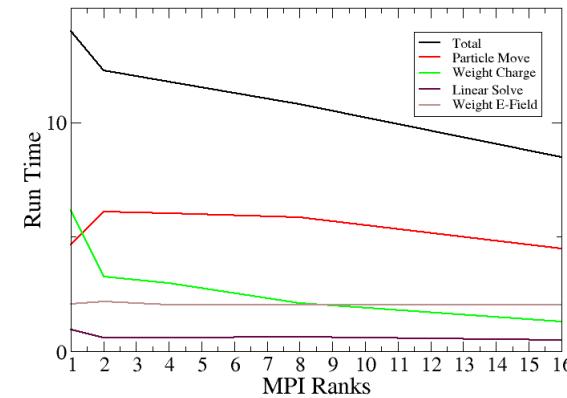
- Comparisons of distributions between threads and MPI ranks



**2 KNC 456 threads 2 - 28 MPI ranks**



**Sandy Bridge 1-16 MPI ranks**



# EMPIRE-Fluid

- Goal – develop a PDE based multi-fluid plasma simulation tool building off EMPIRE-EM capability
- Leveraging research done in the Drekar code
  - Both codes are based on Panzer/Trilinos library
- Design points
  - Discretization approach
    - IMEX time integration to handle multiple time scales (discussed today)
    - Continuous Galerkin Maxwell equations for enforcing involutions: solenoidal magnetic field and Gauss' law
    - Discontinuous Galerkin for fluid equations
  - Implicit block preconditioning
  - Beyond forward simulation
  - MPI+X parallelization using Kokkos

# Multi-fluid plasma model

Coupling 5-moment fluid models (for each species) to Maxwell equations

$$\left. \begin{array}{l}
 \left. \begin{array}{l}
 \partial_t \rho_\alpha + \mathbf{u}_\alpha \cdot \nabla \rho_\alpha = -\rho_\alpha \nabla \cdot \mathbf{u}_\alpha \\
 \partial_t \mathbf{u}_\alpha + \mathbf{u}_\alpha \cdot \nabla \mathbf{u}_\alpha = -\mathbf{u}_\alpha \nabla \cdot \mathbf{u}_\alpha - \frac{1}{\rho_\alpha} \nabla P_\alpha + \frac{1}{\rho_\alpha} \nabla \cdot \left( \mu_\alpha \left( \nabla \mathbf{u}_\alpha + \nabla \mathbf{u}_\alpha^T - \frac{2}{3} \mathbf{I} \nabla \cdot \mathbf{u}_\alpha \right) \right) \\
 + \frac{q_\alpha}{m_\alpha} (\mathbf{E} + \mathbf{u}_\alpha \times \mathbf{B}) - \sum_\beta \nu_{\alpha\beta} (\mathbf{u}_\alpha - \mathbf{u}_\beta) \\
 \partial_t P_\alpha + \mathbf{u}_\alpha \cdot \nabla P_\alpha = -\gamma P_\alpha \nabla \cdot \mathbf{u}_\alpha + \nabla \cdot ((\gamma - 1) k_\alpha \nabla T_\alpha) \\
 - \sum_\beta \frac{(\gamma - 1) \nu_{\alpha\beta} \rho_\alpha}{m_\alpha + m_\beta} (3(T_\alpha - T_\beta) - m_\beta (\mathbf{u}_\alpha - \mathbf{u}_\beta)^\wedge 2)
 \end{array} \right\} \text{5-Moment Fluid} \\
 \left. \begin{array}{l}
 \partial_t \mathbf{E} - c^2 \nabla \times \mathbf{B} = -\frac{1}{\epsilon_0} \sum_\alpha \frac{q_\alpha}{m_\alpha} \rho_\alpha \mathbf{u}_\alpha \\
 \partial_t \mathbf{B} + \nabla \times \mathbf{E} = 0
 \end{array} \right\} \text{Maxwell Equations}
 \end{array} \right.$$

# Fluid challenge: multiple time scales



- Scaling is strongly dependent on a species  $\alpha$ 's mass, density, and temperature.
- Can be broken into **frequency scales**, **velocity scales**, and **diffusion scales**:

Plasma frequency

$$\omega_{p\alpha} = \sqrt{\frac{q_\alpha^2 n_\alpha}{m_\alpha \epsilon_0}}$$

Cyclotron frequency

$$\omega_{c\alpha} = \frac{q_\alpha B}{m_\alpha}$$

Collision frequency

$$\nu_{\alpha\beta} \sim \frac{n_\beta}{\sqrt{m_\alpha} T_\alpha^{\frac{3}{2}}} \frac{1 + \frac{m_\alpha}{m_\beta}}{\left(1 + \frac{m_\alpha}{m_\beta} \frac{T_\beta}{T_\alpha}\right)^{\frac{3}{2}}}$$

Flow velocity

$$u_\alpha$$

Speed of sound

$$v_{s\alpha} = \sqrt{\frac{\gamma P_\alpha}{\rho_\alpha}}$$

Speed of light

$$c \gg u_\alpha, v_{s\alpha}$$

Momentum diffusivity

$$\nu_\alpha = \frac{\mu_\alpha}{\rho_\alpha}$$

Thermal diffusivity

$$\kappa_\alpha \sim \frac{k_\alpha}{\rho_\alpha}$$

# IMEX time integration

- Splitting the model up based on stiffness allows us to choose what goes into the implicit solve:

- Explicit for **slow**, non-stiff terms
- Implicit for **fast**, stiff terms

Implicit tableau

$$\begin{array}{c|c} c & A \\ \hline & b^t \end{array}$$

Explicit tableau

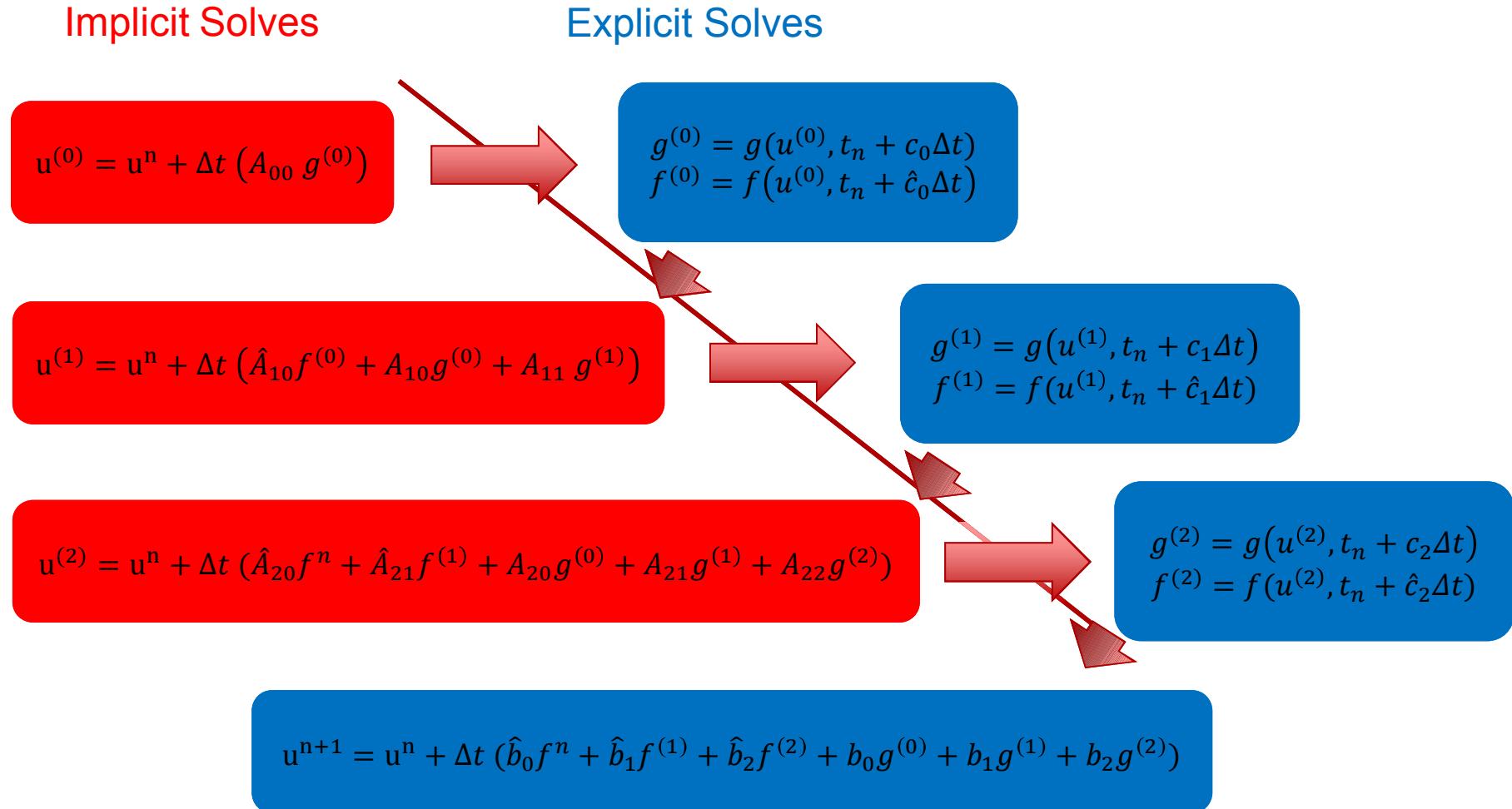
$$\begin{array}{c|c} \hat{c} & \hat{A} \\ \hline & \hat{b}^t \end{array}$$

$$\partial_t u = \mathbf{f}(u, t) + \mathbf{g}(u, t)$$

$$u^{(i)} = u^n + \Delta t \sum_{j=0}^{j < i} \hat{A}_{ij} \mathbf{f}(u^{(j)}, t_n + \hat{c}_j \Delta t) + \Delta t \sum_{j=0}^{j \leq i} \mathbf{A}_{ij} \mathbf{g}(u^{(j)}, t_n + c_j \Delta t)$$

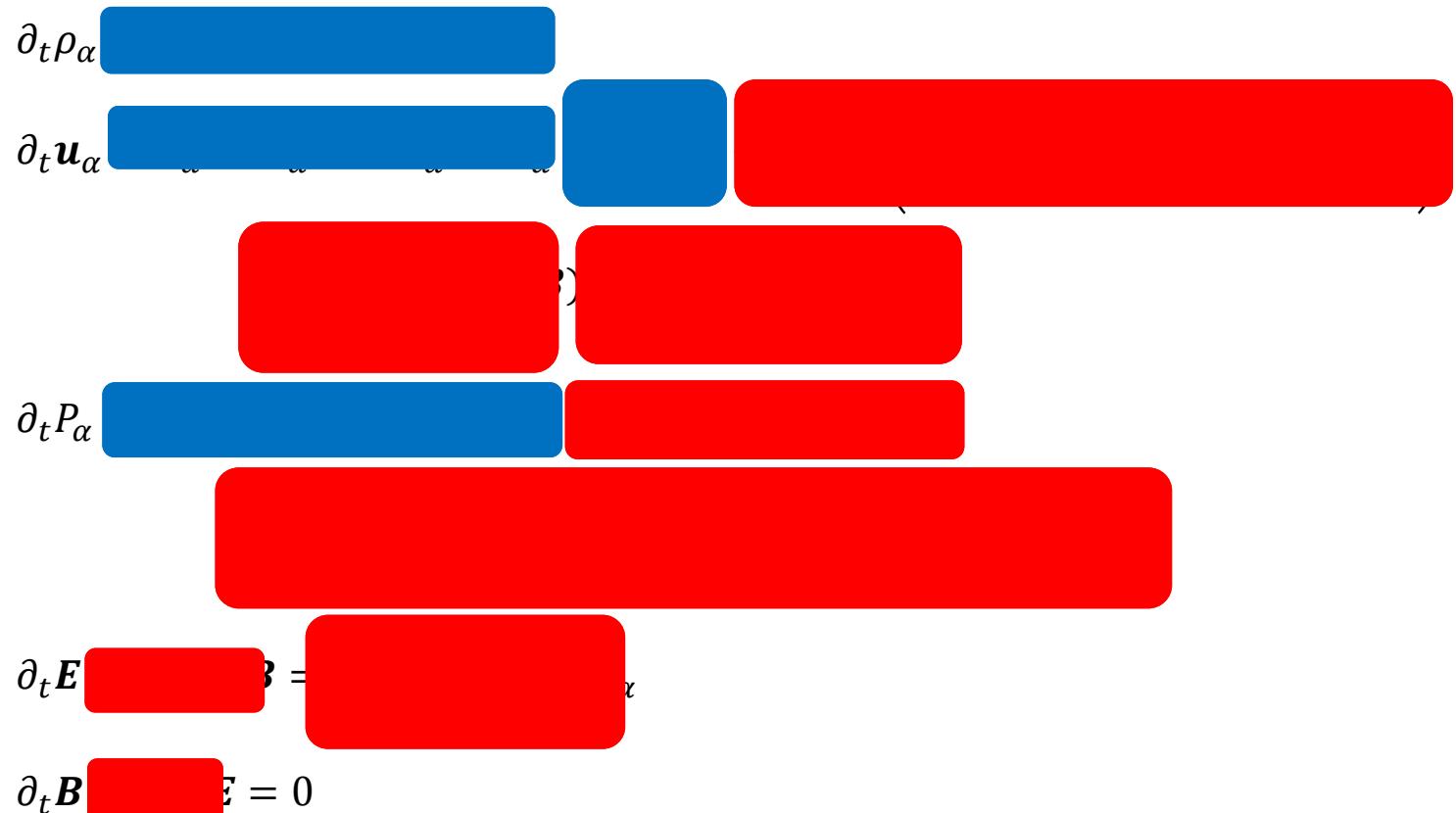
$$u^{n+1} = u^n + \Delta t \sum_{i=0}^{i < s} \hat{b}_i \mathbf{f}(u^{(i)}, t_n + \hat{c}_i \Delta t) + \Delta t \sum_{i=0}^{i \leq s} b_i \mathbf{g}(u^{(i)}, t_n + c_i \Delta t)$$

# Example 3-stage IMEX algorithm



# Splitting multi-fluid plasma model

- For most applications, multi-fluid plasma model's can be broken into **fast** and **slow** components based on the associated time scales:



- The stiffness of these terms are **problem dependent**

# Adaptable block preconditioning

- Efficient **Implicit** (in **IMEX**) time integration requires effective preconditioning
  - Effective means: “Stiffness arising from fast time scales is handled by the preconditioner”
- Our approach is to use **Block preconditioning** to identify and isolate scales by grouping terms together

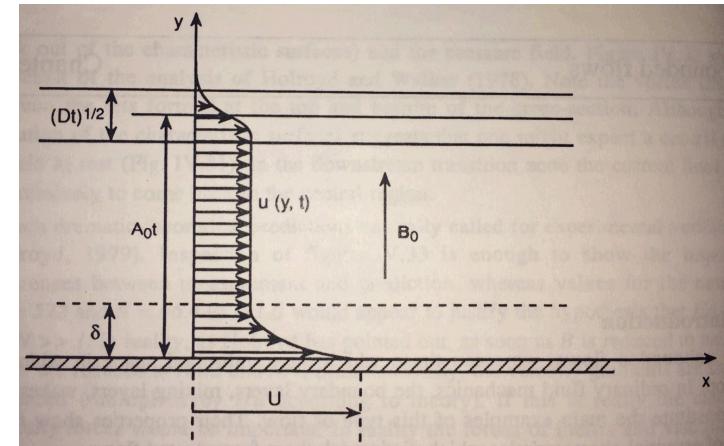
$$\begin{bmatrix}
 D_{\rho_i} & K_{\rho_i u_i}^{\rho_i} & 0 & Q_{\rho_e}^{\rho_i} & 0 & 0 & 0 & 0 \\
 D_{\rho_i u_i}^{\rho_i} & D_{\rho_i u_i} & 0 & Q_{\rho_e}^{\rho_i u_i} & Q_{\rho_e u_e}^{\rho_i u_i} & 0 & Q_E^{\rho_i u_i} & Q_B^{\rho_i u_i} \\
 D_{\rho_i}^{\mathcal{E}_i} & D_{\rho_i u_i}^{\mathcal{E}_i} & D_{\mathcal{E}_i} & Q_{\rho_e}^{\mathcal{E}_i} & Q_{\rho_e u_e}^{\mathcal{E}_i} & Q_{\mathcal{E}_e}^{\mathcal{E}_i} & Q_E^{\mathcal{E}_i} & 0 \\
 Q_{\rho_e}^{\rho_i} & 0 & 0 & D_{\rho_e} & K_{\rho_e u_e}^{\rho_e} & 0 & 0 & 0 \\
 Q_{\rho_i}^{\rho_e u_e} & Q_{\rho_i u_i}^{\rho_e u_e} & 0 & D_{\rho_e}^{\rho_e u_e} & D_{\rho_e u_e}^{\rho_e} & 0 & Q_E^{\rho_e u_e} & Q_B^{\rho_e u_e} \\
 Q_{\rho_i}^{\mathcal{E}_e} & Q_{\rho_i u_i}^{\mathcal{E}_e} & Q_{\mathcal{E}_e}^{\mathcal{E}_i} & D_{\rho_e}^{\mathcal{E}_e} & D_{\rho_e u_e}^{\mathcal{E}_e} & D_{\mathcal{E}_e} & Q_E^{\mathcal{E}_e} & 0 \\
 0 & Q_E^{\rho_i u_i} & 0 & 0 & Q_E^{\rho_e u_e} & 0 & Q_E & K_B^E \\
 0 & 0 & 0 & 0 & 0 & 0 & K_E^B & Q_B
 \end{bmatrix}
 \begin{bmatrix}
 \rho_i \\
 \rho_i \mathbf{u}_i \\
 \mathcal{E}_i \\
 \rho_e \\
 \rho_e \mathbf{u}_e \\
 \mathcal{E}_e \\
 \mathbf{E} \\
 \mathbf{B}
 \end{bmatrix}$$

See for instance

- L. Chacon, Physics of Plasmas, 2008
- E.C. Cyr, J.N. Shadid, R.S. Tuminaro, R.P. Pawlowski, and L. Chacon, SISC, Vol. 35, 2013
- E.G. Phillips, J.N. Shadid, E.C. Cyr, H.C. Elman, and R.P. Pawlowski, SISC, Vol. 38, 2016
- E.G. Phillips, J.N. Shadid, and E.C. Cyr, Submitted to SISC, 2017

# Resistive Alfvén wave problem

- **Objective:** Run a full multi-fluid solver over MHD plasma scales.
- Solution is derived from resistive/viscous MHD which **ignores Hall effects**:
  - Hall parameter  $H = \frac{\omega_{ce}}{v_{ei}} = \frac{\eta B}{n_e e} \ll 1$
  - Reducing Hall effects in a magnetized multi-fluid model is tricky - requires large collision frequency
- Problem is used for verifying resistive, Lorentz force, and viscous operators:
  - Impulse shear due to a moving wall drives a **Hartmann layer**
  - Hartmann layer shear excites **Alfvén wave** traveling along magnetic field
  - Alfvén wave front diffuses due to momentum and magnetic diffusivity
  - Profile depends on the effective **Lundquist number**  $S = \frac{L v_A}{\lambda}$

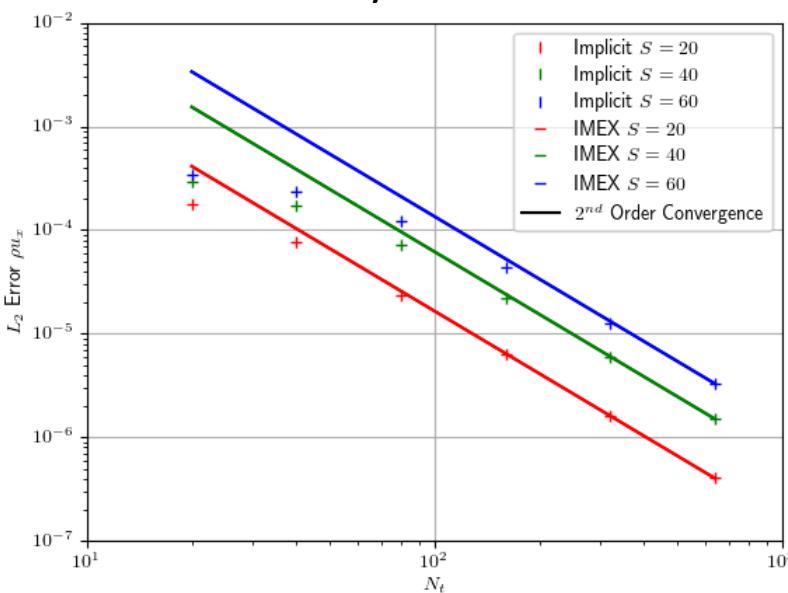


R. Moreau, Magnetohydrodynamics, 1990

$$\begin{aligned}
 u_x &= \frac{U}{4} \left( 1 + \exp \left( \frac{v_A y}{\lambda} \right) \right) \operatorname{erfc}(\eta_+) \\
 &\quad + \frac{U}{4} \left( 1 + \exp \left( -\frac{v_A y}{\lambda} \right) \right) \operatorname{erfc}(\eta_-) \\
 B_x &= \sqrt{\mu_0 \rho} \frac{U}{4} \left( 1 - \exp \left( \frac{v_A y}{\lambda} \right) \right) \operatorname{erfc}(\eta_+) \\
 &\quad - \sqrt{\mu_0 \rho} \frac{U}{4} \left( 1 - \exp \left( -\frac{v_A y}{\lambda} \right) \right) \operatorname{erfc}(\eta_-) \\
 \eta_{\pm} &= \frac{y \pm v_A t}{2\sqrt{\lambda t}}
 \end{aligned}$$

# Overstepping resistive plasmas\*

- Convergence tests show expected convergence even when massively overstepping non-MHD plasma scales
- Roll-off at low resolutions due to under-resolving Hartmann layer
  - Large Lundquist number implies thin Hartmann layer



Plasma Scales for $S = 60$		
	Electrons	Ions
$\omega_p \Delta t$	$4 \cdot 10^7 - 1.3 \cdot 10^9$	$9.4 \cdot 10^5 - 3 \cdot 10^7$
$\omega_e \Delta t$	$1.7 \cdot 10^6 - 5.5 \cdot 10^7$	$9.4 \cdot 10^2 - 3 \cdot 10^4$
$v_{\alpha\beta} \Delta t$	$1.7 \cdot 10^{10} - 5.5 \cdot 10^{11}$	$9.4 \cdot 10^6 - 3 \cdot 10^8$
$v_s \frac{\Delta t}{\Delta x}$	$7 \cdot 10^{-3}$	$2 \cdot 10^{-4}$
$u \frac{\Delta t}{\Delta x}$	$2 \cdot 10^{-4}$	$2 \cdot 10^{-4}$
$\frac{\mu}{\rho} \frac{\Delta t}{\Delta x^2}$	$0.4 - 12$	$0.01 - 0.3$
$c \frac{\Delta t}{\Delta x}$		167

IMEX terms: implicit/explicit

Overstepping fast time scales is both stable and accurate. The inclusion of a resistive operator adds dissipation to the electron dynamics on top of the L-stable time integrator.

# Future Work

## EMPIRE-PIC

- FY18
  - Release open source
  - Realistic boundary conditions
    - SCL/FN/Secondary Emission
    - PML for EM
  - Implicit PIC algorithm research
  - Higher order EM and ES research
  - Performance optimization
  - Improved V&V suite
    - Automated convergence analysis
    - Validation against B-dot experiment
- FY19
  - Implicit PIC working
  - Preproduction mode
  - Asynchronous Many Tasking (AMT) loadbalancing
  - Large Sierra scale simulation

## EMPIRE-Fluid

- FY18
  - CG compatible Maxwell coupled to DG hydro with IMEX time integration
  - Linear wave verification suite (**see S. Miller's talk**)
  - Hardening of user interface
  - Test problems
    - Brio-Wu
    - Atmospheric blast
- FY19
  - Release open source
  - Performance portable implementation
  - Large scale simulation

# Summary

- Foundation for next generation plasma model laid out
  - Basic electromagnetic capabilities
  - Multiple plasma modeling abilities (PIC and Fluid)
  - Kokkos for performance portability
- ASC and Sandia LDRD funding providing resources to develop
  - Extend the basic code to a preproduction application
  - Feature enhancements
- Future open source code base