# Unified algorithms for fluid and kinetic simulations of plasmas

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Stability, Energetics, and Turbulent Transport in Astrophysical, Fusion, and Solar Plasmas: Unifying Theoretical and Computational Tools, 2013 Theory and numerics of hyperbolic balance laws provide unifying theme in computational plasma physics

- Hyperbolic balance laws describe wide variety of physics: neutral fluid flow, magnetohydrodynamics, electromagnetism (linear and non-linear dielectrics), shallow-water flows, etc.
- Are building blocks for systems with dissipation, chemical reactions, etc.

Outline

- Definition, examples and properties, of hyperbolic balance laws
- Numerical schemes, in particular discontinuous Galerkin scheme
- Applications: two-fluid magnetic reconnection, FRC formation and jet propagation in vacuum.

# Extention of standard theory/numerics provide a framework for solving broad class of kinetic equations

#### Question

Can one develop accurate and stable schemes for solution of (gyro) kinetic equations that conserve invariants, maintain positivity and use as few grid points as possible?

#### Proposed Answer

Explore high-order hybrid discontinuous/continuous Galerkin finite-element schemes, enhanced with flux-reconstruction and a better choice of velocity space basis functions.

Hyperbolic balance laws describe phenomena with finite propagation speeds

Consider the N dimensional system of  $\boldsymbol{m}$  balance laws

$$\partial_t U + \sum_{i=1}^N \partial_i F_i(U) = S(U, x, t)$$

Here  $x \in \mathbb{R}^N$ ,  $U(x,t) \in \mathbb{R}^m$ ,  $F_i(U)$  is the flux  $S(U,x,t) \in \mathbb{R}^m$  are source terms.

#### Informally

If a small perturbation around a equilibrium  $U_0(x)$  propagates with *finite speed* then system is hyperbolic.

We can make this formal by looking at eigenstructure of flux Jacobian

Definition (Hyperbolic Equations)

If for any admissible  $\boldsymbol{U}$  the flux Jacobian

$$A(U,n) \equiv \sum_{i=0}^{N} n_i DF_i(U)$$

where  $[n_1, \ldots, n_N]$  is a unit vector, has real eigenvalues,  $\lambda_p$  and a complete set of right eigenvectors,  $r_p$ ,  $p = 1, \ldots, m$ , the system said to be *hyperbolic*.

System is *strictly hyperbolic* if eigenvalues are distinct, *weakly hyperbolic* otherwise, and *isotropic* if eigensystem does not depend on  $n_i$ .

### Example: Euler equations for neutral fluid flow

Neutral inviscid flow is described by Euler equations

$$\begin{split} &\frac{\partial n}{\partial t} + n\nabla\cdot\mathbf{u} + u\cdot\nabla n = 0\\ &\frac{\partial \mathbf{u}}{\partial t} + \mathbf{u}\cdot\nabla\mathbf{u} + \frac{1}{mn}\nabla p = \frac{q}{m}(\mathbf{E} + \mathbf{u}\times\mathbf{B})\\ &\frac{\partial p}{\partial t} + \mathbf{u}\cdot\nabla p + \gamma p\nabla\cdot\mathbf{u} = 0. \end{split}$$

This is weakly hyperbolic, isotropic system with eigenvalues  $\{u \pm c_s, u, u, u\}$ , where  $c_s = \sqrt{\gamma p/mn}$ .

This system is interesting in itself, and is also a building block for Navier-Stokes equations, two-fluid equations, and MHD equations.

Hyperbolic balance laws have number of properties that are important for schemes to satisfy

- Hyperbolic balance laws allow for discontinuous solutions. I.e. shocks, rarefactions and contact discontinuities can develop even from smooth initial conditions. Schemes must be able to handle this, i.e. be *shock capturing*.
- Even if true shocks do not form (due to diffusion), small scale fluctuations and sharp gradients need to be captured.
- If a hyperbolic balance law is isotropic, so must be the numerical scheme, i.e. be grid and coordinate independent.

### Three additional mathematical properties are important

- Schemes must preserve *invariant domains*. For example, n ≥ 0, p ≥ 0 and P<sub>ij</sub> is semi-positive definite.
- Schemes must satisfy entropy inequalities. For example, physical entropy should increase across shocks. This is really important as otherwise solutions are no longer unique. I.e if  $\eta(U)$  is an entropy and  $g_i(U)$  are entropy fluxes, then we must have

$$\partial_t \eta(U) + \sum_{i=1}^N \partial_i g_i(U) \le 0$$
 (1)

• Involutions must be satisfied. I.e. constraints like  $\nabla \cdot \mathbf{B} = 0$ ,  $\nabla \cdot \mathbf{E} = \rho_c / \epsilon_0$  etc must be maintained. Discontinuous Galerkin algorithms represent state-of-art for solution of hyperbolic partial differential equations

- DG algorithms hot topic in CFD and applied mathematics. First introduced by Reed and Hill in 1973 for neutron transport in 2D.
- General formulation in paper by Cockburn and Shu, JCP 1998. More than 700 citations.
- DG combines key advantages of finite-elements (low phase error, high accuracy, flexible geometries) with finite-volume schemes (limiters to produce positivity/monotonicity, locality)
- Certain types of DG have excellent conservation properties for Hamiltonian systems, low noise and low dissipation.
- ▶ DG is inherently super-convergent: in FV methods interpolate p points to get pth order accuracy. In DG interpolate p points to get 2p − 1 order accuracy.

### What does a typical DG solution look like?

Discontinuous Galerkin schemes use function spaces that allow *discontinuities* across cell boundaries.



Figure: The best  $L_2$  fit of  $x^4 + \sin(5x)$  with piecewise linear (left) and quadratic (right) basis functions.

Discontinuous Galerkin schemes are applicable to phase-space advection equations described as Hamiltonian dynamical system

For example,

$$\frac{\partial f}{\partial t} + \{f, H\} = 0$$

where  $H(z^1, z^2)$  is the Hamiltonian and canonical Poisson bracket is

$$\{g,h\} \equiv \frac{\partial g}{\partial z^1} \frac{\partial h}{\partial z^2} - \frac{\partial g}{\partial z^2} \frac{\partial h}{\partial z^1}.$$

Defining phase-space velocity vector  $\alpha = (\dot{z}^1, \dot{z}^2)$ , with  $\dot{z}^i = \{z^i, H\}$  leads to *phase-space conservation form* 

$$\frac{\partial f}{\partial t} + \nabla \cdot (\boldsymbol{\alpha} f) = 0.$$

Example: Incompressible Euler equations in two dimensions serves as a model for  $E \times B$  nonlinearities in gyrokinetics

A basic model problem is the *incompressible* 2D Euler equations written in the stream-function ( $\phi$ ) vorticity ( $\zeta$ ) formulation. Here the Hamiltonian is simply  $H(x, y) = \phi(x, y)$ .

$$\frac{\partial \zeta}{\partial t} + \nabla \cdot (\mathbf{u}\zeta) = 0$$

where  $\mathbf{u} = \nabla \phi \times \mathbf{e}_z$ . The potential is determined from

$$\nabla^2 \phi = -\zeta.$$

### It is important to preserve quadratic invariants

The incompressible Euler equations has two quadratic invariants, *energy* 

$$\frac{\partial}{\partial t} \int_{K} \frac{1}{2} |\nabla \phi|^2 d\Omega = 0$$

and *enstrophy* 

$$\frac{\partial}{\partial t} \int_{K} \frac{1}{2} \zeta^{2} d\Omega = 0.$$

Similar invariants can be derived for Vlasov-Poisson and Hasegawa-Wakatani equations. In addition, Vlasov-Poisson also conserves momentum.

#### Question

Can one design schemes that conserve these invariants?

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A DG scheme is used to discretize phase-space advection equation

To discretize the equations introduce a mesh  $K_j$  of the domain K. Then the discrete problem is stated as: find  $\zeta_h$  in the space of discontinuous piecewise polynomials such that for all basis functions w we have

$$\int_{K_j} w \frac{\partial \zeta_h}{\partial t} \, d\Omega + \int_{\partial K_j} w^- \mathbf{n} \cdot \boldsymbol{\alpha}_h \hat{\zeta}_h \, dS - \int_{K_j} \nabla w \cdot \boldsymbol{\alpha}_h \zeta_h \, d\Omega = 0.$$

Here  $\hat{\zeta}_h = \hat{\zeta}(\zeta_h^+, \zeta_h^-)$  is the consistent numerical flux on  $\partial K_j$ .

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## A continuous finite element scheme is used to discretize Poisson equation

To discretize the Poisson equation the problem is stated as: find  $\phi_h$  in the space of *continuous* piecewise polynomials such that for all basis functions  $\psi$  we have

$$\int_{K} \psi \nabla^2 \phi_h d\Omega = -\int_{K} \psi \zeta_h d\Omega$$

#### Questions

How to pick basis functions for discontinuous and continuous spaces? We also have not specified numerical fluxes to use. How to pick them? Do they effect invariants?

# Hybrid DG/CG schemes for Hamiltonian systems have good conservation properties

- With proper choice of function spaces and a *central* flux, both quadratic invariants are exactly conserved by the semi-discrete scheme.
- ▶ With upwind fluxes (preferred choice) energy is still conserved, and the scheme is stable in the L<sub>2</sub> norm of the solution.
- For Vlasov-Poisson system, momentum conservation is not exact, but the errors decrease rapidly with spatial resolution, even on a coarse velocity grid.

#### Questions

Can this scheme be modified to conserve momentum exactly? Can time discretization exactly conserve these invariants? Perhaps try symplectic integrators ...

## Only recently conditions for conservation of discrete energy and enstrophy were discovered

### Energy Conservation

Liu and Shu (2000) have shown that discrete energy is conserved for 2D incompressible flow if *basis functions for potential are a continuous subset of the basis functions for the vorticity irrespective of numerical flux chosen*! We discovered extension to discontinuous phi for the Vlasov equation.

#### Enstrophy Conservation

Enstrophy is conserved only if *central fluxes* are used. With upwind fluxes, enstrophy decays and hence the scheme is *stable* in the  $L_2$  norm.

DG with central fluxes like high-order generalization of the well-known *Arakawa* schemes, widely used in climate modeling and recently also in plasma physics.

Under-construction code Gkeyll provides unified computational framework for broad class of fluid and kinetic equations

- Gkeyll is written in C++ and scripted using Lua<sup>1</sup>.
- Package management and builds are automated via scimake and bilder, both developed at Tech-X Corporation.
- ► Linear solvers from Petsc<sup>2</sup> are used for inverting stiffness matrices.
- MPI is used for parallelization via the txbase library developed at Tech-X Corporation.

Used presently for reconnection with multi-fluid moment equations and being developed for gyrokinetic simulations of edge turbulence.

<sup>2</sup>http://www.mcs.anl.gov/petsc/

<sup>&</sup>lt;sup>1</sup>http://www.lua.org

Simulation journal with results is maintained at http://www.ammar-hakim.org/sj

Results are presented for the equation systems.

- Incompressible Euler equations
- Hasegawa-Wakatani equations
- Vlasov-Poisson equations



Figure: [Movie] Swirling flow problem. The initial Gaussian pulses distort strongly but regain their shapes after a period of 1.5 seconds.

### Two-Fluid magnetic reconnection in a current sheet



Figure: Electron momentum (left) and ion momentum (right) at t = 40. Inward traveling shocks are visible in both the fluids. Thin jets flowing along the X axis are also visible. Ion flow is unstable due to counter flowing fluid jets.

## Energy of fluids and fields, reconnection rates can be computed



Figure: Electromagnetic energy (EE), fluid thermal energy (IE), fluid kinetic energy (KE) and total energy (TE) as a function of time.



Figure: Reconnected flux verses time. The reconnected flux increases rapidly after the reconnection occurs at about t = 10. The flux saturates due to the conducting wall.

Double shear problem is a good test for resolution of vortex shearing in  $E \times B$  driven flows

Vorticity at t = 8with different grid resolutions and schemes. Third order DG scheme runs faster and produces better results than DG2 scheme.





# Initial studies of Hasegawa-Wakatani drift-wave turbulence are carried out



Figure: [Movie] Number density from Hasegawa-Wakatani drift-wave turbulence simulations with adiabacity parameter D=0.1 with (left) and without (right) zonal flow modification.

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# Algorithms have been tested with nonlinear Landau damping problem



Figure: [Movie] Distribution function from nonlinear Landau damping problem. Hyper-collisions are being implemented for phase-mixing to unresolved scales in velocity.

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A particle, momentum and energy conserving Lenard-Bernstein collision operator is implemented

A simple collision operator is implemented:

$$C_{LB}[f] = \frac{\partial}{\partial v} \left( \nu(v-u)f + \nu v_t^2 \frac{\partial f}{\partial v} \right)$$

Figure shows relaxation of an initial step-function distribution function to Maxwellian due to collisions.



# Conclusions: DG algorithms are promising for fluid and kinetic problems

- A discontinuous Galerkin scheme to solve a general class of Hamiltonian field equations is presented.
- The Poisson equation is discretized using continuous basis functions.
- With proper choice of basis functions energy is conserved.
- ▶ With central fluxes enstrophy is conserved. With upwind fluxes the scheme is L<sub>2</sub> stable.
- Momentum conservation has small errors but is independent of velocity space resolution and converges rapidly with spatial resolution.

Future work: extend scheme to higher dimensions, general geometries and do first physics problems

- The schemes have been extended to higher dimensions and Serendipity basis functions are being explored (with Eric Shi). Testing is in progress.
- Maxwellian weighted basis functions for velocity space discretization will be developed to allow coarse resolution simulations with the option of fine scale resolution when needed.
- ► A collision model is implemented. It will be tested with standard problems and extended to higher dimensions.
- Extensions will be made to take into account complicated edge geometries using a multi-block structured grid.