

# Aspects of Discontinuous Galerkin Schemes for Fluid and Kinetic Simulations of Plasmas

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# Outline: Present scheme for a class of fluid and kinetic problems

Long term goal: Accurate and stable schemes fluid/kinetic turbulence simulations of plasmas.

- ▶ Present discontinuous/continuous Galerkin schemes for solution of a class of fluid and kinetic problems in plasmas.
- ▶ Discuss use on non-polynomial basis functions to optimize capturing known physical features.
- ▶ Outline some subtle issues in discretization of second-order derivatives operators using various DG approaches.

## Significant prior work exists on Vlasov-Poisson, Vlasov-Maxwell

A lot of work is from Institute of Fusion Studies (IFS) and ICES studies here in U. Texas. See series of papers by Cheng, Morrison, Gamba and co-workers

- ▶ Y. Cheng, I. M. Gamba, F. Li, and P. J. Morrison, "Discontinuous Galerkin Methods for the Vlasov-Maxwell Equations," submitted (2013).
- ▶ Y. Cheng, I. M. Gamba, and P. J. Morrison, "Study of Conservation and Recurrence of Runge-Kutta Discontinuous Galerkin Schemes for Vlasov-Poisson Systems," *Journal of Scientific Computing* (2012)
- ▶ R. E. Heath, I. M. Gamba, P. J. Morrison, and C. Michler, "A Discontinuous Galerkin Method for the Vlasov-Poisson System," *Journal of Computational Physics* 231, 11401174 (2012).

Other efforts by C.W. Shu (Brown), J. Rossmanith (Iowa State), David Seal (Michigan State) etc.

A basic model of a class of problems in plasma physics is nonlinear advection in phase space

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

Here  $f(z^1, z^2, \dots, t)$  is a scalar “distribution function” and  $\boldsymbol{\alpha} = (\alpha_1, \alpha_2, \dots)$  is advection velocity vector in phase space.

## These models can be derived from a Hamiltonian and a Poisson Bracket structure

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

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  $\alpha_i = \{z^i, H\}$  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 prototype model for a class of turbulence fluid problems

*Incompressible* 2D Euler equations written in the stream-function ( $\phi$ ) vorticity ( $\zeta$ ) formulation. Here the Hamiltonian is simply

$$H(x, y) = \phi(x, y)$$

Advection speed is  $u_x = \{x, H\}$  and  $u_y = \{y, h\}$  or  $\mathbf{u} = \nabla\phi \times \mathbf{e}_z$

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

The potential is determined from

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

## Example: Vlasov equation for electrostatic plasmas

The Vlasov-Poisson system has the Hamiltonian

$$H(x, v) = \frac{1}{2}mv^2 + \frac{q}{m}\phi(x)$$

where  $q$  is species charge and  $m$  is species mass and  $v$  is velocity.  
Poisson bracket is *noncanonical*

$$\{g, h\} = \frac{1}{m} \left( \frac{\partial g}{\partial x} \frac{\partial h}{\partial x} - \frac{\partial g}{\partial v} \frac{\partial h}{\partial x} \right)$$

With this  $\dot{x} = v$  and  $\dot{v} = -q/m\partial\phi/\partial x$  leading to

$$\frac{\partial f}{\partial t} + v \frac{\partial f}{\partial x} - \frac{q}{m} \frac{\partial \phi}{\partial x} \frac{\partial f}{\partial v} = 0$$

## Example: For Vlasov equation two methods to determine potential

For non-neutral plasmas solve a Poisson equation

$$\frac{\partial^2 \phi}{\partial x^2} = -\frac{\rho_c}{\epsilon_0}$$

where

$$\rho_c = |e| \left( Z n_{io}(x) - \int_{-\infty}^{\infty} f(x, v, t) dv \right)$$

OR, For a quasi-neutral plasma in certain limits

$$\int_{-\infty}^{\infty} f(x, v, t) dv = n_{eo} \left( 1 + \frac{|e|\phi}{T_e} \right)$$



## It is important to preserve quadratic invariants of these systems

One can show that

$$\int H \frac{\partial f}{\partial t} d\mathbf{Z} = 0$$
$$\int f \frac{\partial f}{\partial t} d\mathbf{Z} = 0$$

In deriving these one can use the identity  $\alpha \cdot \nabla H = 0$ . Many other invariants might exist, some of which may be important to conserve. Example: momentum in electrostatic Vlasov equations.

## Example: For incompressible Euler these are called energy and enstrophy

The energy is defined as

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

and *enstrophy* is defined as

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

## Often diffusive processes need to be included

Diffusion (from viscous effects or collisions) might be needed. For example, the collisional Vlasov equation in some approximation is

$$\frac{\partial f}{\partial t} + v \frac{\partial f}{\partial x} - \frac{q}{m} \frac{\partial \phi}{\partial x} \frac{\partial f}{\partial v} = \frac{\partial}{\partial v} \left( \nu(v - u)f + \nu v^2 \frac{\partial f}{\partial v} \right)$$

where  $\nu$  is a collision frequency.

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In summary: we need to discretize advection equation coupled to elliptic equation

### Question

Can one develop accurate and stable schemes 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 and a proper choice of velocity space basis functions.

## 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  $\partial K_j$ .

## 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?

# 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 if *space spanned by potential basis functions are a continuous subset of the space spanned by the vorticity basis functions.*

## 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.

However, conservation needs Hamiltonian (fields) to be *continuous*

Look at the a quasi-neutral plasma (or parallel dynamics in gyrokinetics)

$$\int_{-\infty}^{\infty} f(x, v, t) dv = n_{eo} \left( 1 + \frac{|e|\phi}{T_e} \right)$$

This *can not* be true point-wise, but must be enforced only in a *weak-sense*.

Problem: This leads to a global solve to determine  $\phi(x)$ , even though the point-wise expression is local. Is there a way to conserve energy even in this case?



## Summary of hybrid DG/CG schemes for Hamiltonian systems

- ▶ 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  $L_2$  norm of the solution.
- ▶ For Vlasov-Poisson system there are small errors in momentum conservation even on a coarse velocity grid, and decrease rapidly with spatial resolution.

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

Results are presented for each of the equation systems described above.

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

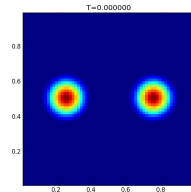


Figure: [Movie] Swirling flow problem. The initial Gaussian pulses distort strongly but regain their shapes after a period of 1.5 seconds.

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

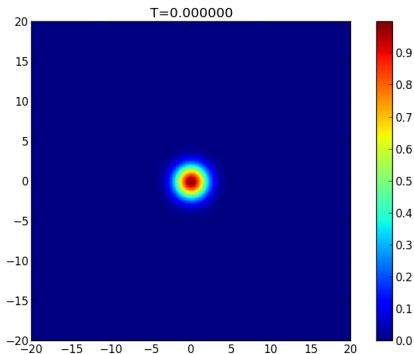


Figure: [Movie] Number density from Hasegawa-Wakatani drift-wave turbulence simulations with adiabacity parameter  $D = 0.1$ .

## Modified Hasegawa-Wakatani equations are used to study zonal flow formation

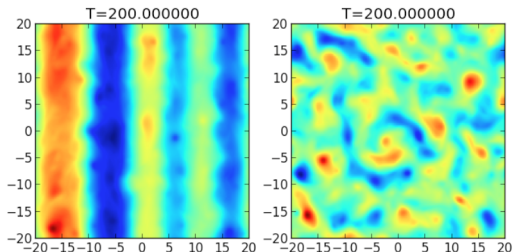


Figure: [Movie] Number density from Hasegawa-Wakatani drift-wave turbulence simulations with adiabaticity parameter  $D = 0.1$  with (left) and without (right) zonal flow modification.

## How to handle second-order derivatives with DG?

Numerical Methods 101: How to discretize

$$g(x) = \frac{d^2 f}{dx^2}$$

Simplest finite difference scheme

$$g_j = \frac{1}{\Delta x^2} (T - 2 + T^{-1}) f_j$$

The shift operators are used

$$\begin{aligned} T(j) &= f_{j+1} \\ T^{-1}u(j) &= f_{j-1}. \end{aligned}$$

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A whole zoo of schemes have been developed to handle such terms in DG

But: Are they *consistent*?

## What is consistency?

Write the expansion in a cell using Taylor series basis functions centered around  $x = x_j$

$$f_{jh}(x) = \sum_{n=0}^N f_j^{(n)} (x - x_j)^n / n!$$

Given a function  $f(x)$ , we call a discrete representation  $f_{jh}$  *consistent* if

$$\lim_{\Delta x \rightarrow 0} f_j^{(n)} = \left. \frac{d^n f}{dx^n} \right|_{x_j}.$$

For example, the standard Galerkin procedure of minimization of the error in each cell,  $\int_{I_j} [f(x) - f_{jh}(x)]^2 dx$ , leads to a consistent representation.

## What is consistency?

Consistency for operators. Consider

$$g(x) = f_{xx}(x) \quad (1)$$

Given a domain  $I \in [a, b]$  divided into uniform cells  $I_j$

$$g(x) = f_{xx}(x) \approx g_{jh}(x) = \sum_{n=0}^N g_j^n P_n(\eta_j(x)) \quad (2)$$

in each cell  $I_j$ . We define a discretization to be *consistent in the mean* as follows

### Definition (Consistency in the mean)

A discrete DG representation,  $g_{jh}(x)$ , of  $f_{xx}$  said to be *consistent in the mean*, if

$$\lim_{\Delta x \rightarrow 0} g_j^0 = f_{xx}|_{x_j}.$$



## What is consistency?

Consistency in the mean is required if the discrete operator is to be represented correctly. *But what about other terms in expansion?*

We define a discretization to be *fully consistent* as follows

### Definition (Full consistency)

A discrete DG representation,  $g_{jh}(x)$ , of  $f_{xx}$  said to be *fully consistent*, if

$$\lim_{\Delta x \rightarrow 0} \frac{d^n g_{jh}}{dx^n} = \frac{d^n f_{xx}}{dx^n} \Big|_{x_j}$$

for all  $n = 0, \dots, N$ .

## A whole zoo of schemes have been developed to handle such terms in DG

Example: Local DG schemes. Rewrite the system as system of first order equations

$$\frac{\partial w}{\partial x} + f = 0, \quad \frac{\partial g}{\partial x} + w = 0$$

For piecewise linear basis functions

$$u_h(x, t) = u_0 + \frac{x - x_j}{\Delta x/2} u_1$$

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A whole zoo of schemes have been developed to handle such terms in DG

### Claim

Many popular DG schemes for such terms are not fully consistent.

## Example: Local DG scheme for piece-wise linear basis functions

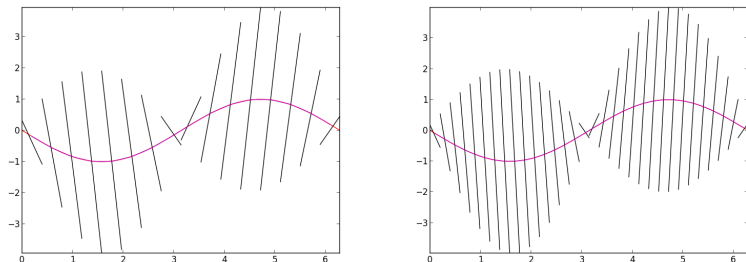


Figure: Derivatives of  $\sin(x)$  computed using LDG scheme with 16 cells (left) and 32 cells (right). Notice slopes are completely mispredicted, showing scheme is inconsistent.

## Example: Local DG scheme for piece-wise linear basis functions

For piecewise linear basis functions we can write update formula as

$$\begin{pmatrix} g_0 \\ g_1 \end{pmatrix} = \frac{1}{\Delta x^2} \begin{pmatrix} 4T^{-1} - 8 + 4T & 2T^{-1} + 2 - 4T \\ -12T^{-1} + 6 + 6T & -6T^{-1} - 24 - 6T \end{pmatrix} \begin{pmatrix} f_0 \\ f_1 \end{pmatrix}$$

General procedure to check consistency: perform Taylor series expansion and plug into above expression and take limit as  $\Delta x \rightarrow 0$

## Example: Local DG scheme for piece-wise linear basis functions

Taylor series analysis, confirmed numerically, shows that

$$\begin{pmatrix} g_0 \\ g_1 \end{pmatrix} = \begin{pmatrix} f_{xx} + \Delta x(\dots) \\ -6f_{xx}/\Delta x + \Delta x(\dots) \end{pmatrix}$$

Notice: not only the slopes are incorrect, but they blow up as  $\Delta x \rightarrow 0!$

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Notice: not only the slopes are incorrect, but they blow up as  $\Delta x \rightarrow 0!$

## Example: What if use a symmetric form of local DG scheme?

For piecewise linear basis functions we can write update formula as

$$\begin{pmatrix} g_0 \\ g_1 \end{pmatrix} = \frac{1}{\Delta x^2} \begin{pmatrix} 4T^{-1} - 8 + 4T & 3T^{-1} - 3T \\ -9T^{-1} + 9T & -6T^{-1} - 24 - 6T \end{pmatrix}$$



Example: What if use a symmetric form of local DG scheme? Also inconsistent.

Taylor series analysis, confirmed numerically, shows that

$$\begin{pmatrix} g_0 \\ g_1 \end{pmatrix} = \begin{pmatrix} f_{xx} + \Delta x(\dots) \\ 3f_{xxx}/5 + \Delta x(\dots) \end{pmatrix}$$

Notice: slopes are incorrect.

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Many other popular schemes, including popular penalty methods are inconsistent

A philosophical problem: we are trying to use ideas from traditional FEM toolbox to construct the discrete operators.

Instead, let's use ideas from finite volume toolbox, in particular the idea of *recovery* widely used in finite-volume Navier-Stokes solvers.

## Basic idea: recover a continuous solution in two cells sharing edge (van Leer AIAA 2005, Huynh AIAA 2009)

Let  $R(\zeta)$ ,  $\zeta = x_{j-1/2} - x \in [-\Delta x, \Delta x]$ , be a *reconstructed* polynomial that extends across two cells and defined as

$$R(\zeta) = f_0 + \zeta f' + \frac{1}{2} \zeta^2 f'' + \dots$$

over  $\zeta = x_{j-1/2} - x \in [-\Delta x, \Delta x]$ .

Determine  $R(\zeta)$  by L2 minimization over each of the neighboring cells

$$\int_{I_{j-1}} v R dx = \int_{I_{j-1}} v f dx$$
$$\int_{I_j} v R dx = \int_{I_j} v f dx$$

for all  $v(x)$  being the basis functions.

Basic idea: recover a continuous solution in two cells sharing edge

For piecewise linear basis function this leads to

$$\begin{pmatrix} g_0 \\ g_1 \end{pmatrix} = \frac{1}{4\Delta x^2} \begin{pmatrix} 9T - 18 + 9T^{-1} & -5T + 5T^{-1} \\ 15T - 15T^{-1} & -7T - 46 - 7T^{-1} \end{pmatrix}$$

## Basic idea: recover a continuous solution in two cells sharing edge

Taylor series analysis, confirmed numerically, shows that

$$\begin{pmatrix} g_0 \\ g_1 \end{pmatrix} = \begin{pmatrix} f_{xx} + \Delta x(\dots) \\ f_{xxx} + \Delta x(\dots) \end{pmatrix}$$

Notice: *fully consistent scheme!*

### Lesson

The fact that the solution is discontinuous is actually just a cartoon or reality. Advection equations do not mind these discontinuities, but diffusion operators do. So for the latter use *recovery* and for the former *upwinding*. Upwinding does not make sense for diffusion.

## Conclusions: Our tests confirm that DG algorithms are promising for 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  $L_2$  stable.
- ▶ Momentum conservation has small errors but is independent of velocity space resolution and converges rapidly with spatial resolution.