## Gyrokinetics and tokamak turbulence simulations

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#### 5<sup>th</sup> March 2014

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- Turbulence is chaotic, apparently random fluid motion which results in enhanced diffusion / transport
- Usually thought of in terms of **eddies** of size *L*, or wave-number  $k = 2\pi/L$
- Large eddies break up into smaller eddies, transferring energy from large to small scales (low to high k). This process is known as a **cascade**.
- Large eddies are less affected by dissipation (viscosity) than small eddies. This is quantified by the **Reynolds number**  $Re = uL/\nu$ , which is ~ 1 for the smallest eddies

## Turbulence in plasmas

- Plasmas have many more waves and instabilities than fluids, making turbulent dynamics more complex
- Strong magnetic fields tend to elongate structures, leading to essentially 2D dynamics in some cases
- Finite sized Larmor orbits provide a limit to how small eddies can become, reducing the resolution required
- Plasma turbulence can be divided into two categories:
  - High-β (small magnetic field). Essentially fluid turbulence modified by presence of Alfvén waves, so generally electromagnetic. Space and astrophysical plasmas.
  - Low- $\beta$  (large magnetic field). The magnetic field strongly constrains the motion of the plasma, and the resulting turbulence tends to be electrostatic e.g. drift waves
  - $\rightarrow$  Here we're interested in the low- $\beta$  case ( $\beta \sim$  1%)

## Turbulence in tokamaks

- Transport of heat and particles in tokamaks is typically "anomalous", meaning above neoclassical
- Little progress can be made analytically, so computer simulations used to study and predict transport levels
- These require sophisticated plasma models (gyro-kinetics) and supercomputers



Image: GYRO simulation of DIII-D by J.Candy, Waltz

Like fluid turbulence, plasma turbulence has a closure problem:

- The equations (classical mechanics + electromagnetism) are well known, but cannot in general be solved
- Average quantities are well behaved, but form an infinite set of equations, due to the nonlinear advection term  $\bm{v}\cdot\nabla\bm{v}$

How can transport be calculated?

- Since the 1970's computers have been used to study turbulence (e.g. Orszag & Patterson 1972)
- Computational Fluid Dynamics (CFD) is now a huge area of research
- Plasma simulations are at the stage where they can be compared to experiment, sometimes successfully

**Problem:** The full 6-D Vlasov equation is too difficult to solve in most situations of interest, but the plasma core is not collisional enough for a fluid (MHD-like) model to be valid

How is plasma turbulence calculated?

- **Gyrokinetics**: Remove fast timescales and reduce number of dimensions
- Numerical tricks: Speed up calculations by many orders of magnitude
- **High Performance Computing**: Algorithms needed to parallelise efficiently across thousands of processors

## Gyrokinetics

- Recall that the Vlasov equation describes a collection of particles, each with a position x and velocity v. Both are 3D, so this is a 6D problem.
- In a strong field, these particles are gyrating quickly ( $\sim$  GHz) around the magnetic field, much faster than the turbulence we want to calculate ( $\sim$  100 kHz)
- We can think of these particles as small current loops



Gyrokinetics describes the dynamics of these current loops

One of the major achievements in plasma theory

- Early work on linear theory e.g. J.B. Taylor, R.J. Hastie (1968), Rutherford and Frieman (1968), P.Catto (1978)
- Nonlinear theory: Frieman & Chen (1982), and first simulations: W. W. Lee (1983)
- Hamiltonian formulation: R.G.Littlejohn (1979,1982), Dublin et al. (1983) ensures conservation of energy
- Modern gyrokinetics uses sophisticated mathematics of differential geometry and field theories

Here I will give only a brief outline of the basic versions

Consider a particle at position  ${\boldsymbol x}$  with velocity  ${\boldsymbol v}$ 

- We need 6 numbers to describe the position of this particle in phase space
- We're free to choose what coordinates to use:

$$(\mathbf{x}, \mathbf{v}) 
ightarrow \left( \overline{\mathbf{x}}, \mathbf{v}_{||}, \mathbf{v}_{\perp}, \phi 
ight)$$



where  $\overline{\mathbf{x}}$  is the middle of the orbit,  $v_{||}$  is the velocity along the magnetic field,  $v_{\perp}$  the speed around the magnetic field, and  $\phi$  is the gyro-phase.

#### Average around an orbit

Averaging over gyro-angle  $\phi$  (gyro-averaging) removes the dependence on  $\phi$ , and reduces the number of dimensions to 5.

• Starting with a distribution of particles *f*, so that the number of particles within a small volume of phase space is

$$\delta n = f(\mathbf{x}, \mathbf{v}) \, \delta \mathbf{x} \delta \mathbf{v}$$

ullet We re-write this in terms of gyro-centre  $\overline{\mathbf{x}}$  and gyro-angle  $\phi$ 

$$\delta \boldsymbol{n} = \hat{\boldsymbol{f}} \left( \overline{\mathbf{x}}, \boldsymbol{v}_{||}, \boldsymbol{v}_{\perp}, \phi \right) \delta \overline{\mathbf{x}} \delta \boldsymbol{v}_{||} \delta \boldsymbol{v}_{\perp} \delta \phi$$

Integrate over gyro-phase

$$\overline{f}\left(\overline{\mathbf{x}},\mathbf{v}_{||},\mathbf{v}_{\perp}\right) = \frac{1}{2\pi} \oint \widehat{f}\left(\overline{\mathbf{x}},\mathbf{v}_{||},\mathbf{v}_{\perp},\phi\right) d\phi$$
$$\Rightarrow \delta n = \overline{f}\left(\overline{\mathbf{x}},\mathbf{v}_{||},\mathbf{v}_{\perp}\right) \delta \overline{\mathbf{x}} \delta \mathbf{v}_{||} \delta \mathbf{v}_{\perp}$$

# Equation for $\overline{f}$

To derive an equation for gyro-averaged distribution function  $\overline{f}$ , take the Vlasov equation and gyro-average  $\rightarrow$  many many pages of maths.

A simple "derivation" is by analogy to the Vlasov equation:

$$\frac{d}{dt}f\left(\mathbf{x},\mathbf{v},t\right)=0$$

Using the chain rule:

$$\frac{\partial f}{\partial t} + \frac{\partial \mathbf{x}}{\partial t} \cdot \frac{\partial f}{\partial \mathbf{x}} + \frac{\partial \mathbf{v}}{\partial t} \cdot \frac{\partial f}{\partial \mathbf{v}} = 0$$
  
and finally putting in  $\frac{\partial \mathbf{x}}{\partial t} = \mathbf{v}$  and the force to get  $\frac{\partial \mathbf{v}}{\partial t}$  gives  
 $\frac{\partial f}{\partial t} + \mathbf{v} \cdot \frac{\partial f}{\partial \mathbf{x}} + \frac{q}{m} (\mathbf{E} + \mathbf{v} \times \mathbf{B}) \cdot \frac{\partial f}{\partial \mathbf{v}} = 0$ 

# Equation for $\overline{f}$

For the distribution of current loops we now have  $\overline{f}(\overline{\mathbf{x}}, v_{||}, v_{\perp})$ 

• We can choose to use the total kinetic energy K rather than the parallel velocity, and magnetic moment  $\mu$  rather than perpendicular velocity

$$\rightarrow \overline{f}(\overline{\mathbf{x}}, K, \mu)$$

$$K = \frac{1}{2}m\left(v_{||}^2 + v_{\perp}^2\right) \qquad \mu = mv_{\perp}^2/(2B)$$

NB: Not the only possible choice

• Now write down total derivative as before:

$$\frac{d}{dt}f(\mathbf{x},\mathbf{v},t)=0 \qquad \Rightarrow \qquad \frac{d}{dt}\overline{f}(\overline{\mathbf{x}},K,\mu,t)=0$$

 $\sim$ 

From total derivative:

$$rac{d}{dt}\overline{f}\left(\overline{\mathbf{x}},K,\mu,t
ight)=0$$

Expand using chain rule

$$\frac{\partial \overline{f}}{\partial t} + \frac{\partial \overline{\mathbf{x}}}{\partial t} \cdot \frac{\partial \overline{f}}{\partial \overline{\mathbf{x}}} + \frac{\partial K}{\partial t} \frac{\partial f}{\partial K} + \frac{\partial \mu}{\partial t} \frac{\partial f}{\partial \mu} = \mathbf{0}$$

• 
$$\frac{\partial}{\partial t} \overline{\mathbf{x}}$$
 is the motion of the gyro-center  
•  $\frac{\partial}{\partial t} K$  is the change in energy of the particle  
•  $\frac{\partial}{\partial t} \mu \simeq 0$  due to conservation of  $\mu$ 

The motion of the gyro-center is the motion along the magnetic field and the drifts across the magnetic field:

$$\frac{\partial \overline{\mathbf{x}}}{\partial t} = \mathbf{v}_g = \mathbf{v}_{||} \mathbf{b} + \frac{\mathbf{E} \times \mathbf{B}}{B^2} + \frac{1}{\Omega} \left[ \mathbf{v}_{||}^2 \mathbf{b} \times (\mathbf{b} \cdot \nabla) \, \mathbf{b} + \mu \mathbf{b} \times \nabla B \right]$$

The energy of a particle changes due to electric fields:

$$rac{\partial K}{\partial t} = q \mathbf{v}_g \cdot \mathbf{E} + \mu rac{\partial \mathbf{B}}{\partial t}$$

Putting this together gets us...

An equation for particle gyro-centers (current loops)

$$\frac{\partial \overline{f}}{\partial t} + \mathbf{v}_g \cdot \frac{\partial \overline{f}}{\partial \overline{\mathbf{x}}} + \left( q \mathbf{v}_g \cdot \mathbf{E} + \mu \frac{\partial \mathbf{B}}{\partial t} \right) \frac{\partial f}{\partial K} = 0$$

- These move along, and drift (relatively) slowly across, magnetic fields
- The fast gyro-frequency timescale has been removed, so time steps in a simulation can be much larger than for the Vlasov equation
- One velocity dimension removed, reducing the problem to 5D
- But: This is not the gyro-kinetic equation!

- We have neglected the finite size of the Larmor orbits, so assumed that the  $\textbf{E}\times\textbf{B}$  is just given by the E field at the gyro-center position  $\overline{\textbf{x}}$ 
  - $\rightarrow$  Need to average drift around the orbit
- We have not considered how to calculate the  ${\bf E}$  and  ${\bf B}$  fields  $\rightarrow$  This is done using Poisson and Ampére laws. Calculation of electric field complicated: determined by polarisation, not charge separation

There are many subtleties in deriving and using gyro-kinetics, particular nonlinear calculations

Whilst the details are more complicated, the principles of gyrokinetic PIC codes are the same as the 1D electrostatic code studied in Comp Lab:

- Gather electrons and ions to calculate gyro-center densities and velocities on grid cells
- Solve for the electric (and magnetic) fields
- Scatter the E and B fields on to the particles. This now involves averaging around a gyro-orbit, typically done by sampling several points on the orbit.
- Galculate the particle drifts, and move the particles
- Go to (1)

Many tricks have been developed to reduce the computational cost

Altogether, algorithmic and theoretical advances over the past  $\sim 25$  years have sped up Gyro-Kinetic simulations by  $\sim 10^{25}.$  Compare to Moore's law over the same period  $\sim 10^5$  speedup. – G.Hammett, APS 2007

Common ways to classify codes:

- Continuum / PIC
- Global / Flux tube
- Delta-f / Full-f

GS2 (Dorland & Kotschenreuther): Delta-f, Cont. Flux GKW () : Delta-f, Cont. Flux GENE (Jenko) : Cont. Flux GYRO (Candy & Waltz) : Cont. Global GEM (Parker & Chen) : Delta-f, PIC, Global GTC (Z.Lin) : PIC, Global XGC (C.S.Chang) : PIC, Global

#### Simulations of DIII-D using GYRO (left), and of MAST using GS2 (right)



Figures: Waltz et al. Phys. Plasmas (2006), and Hammett PPPL (2002)

High- $\beta$ , homogenous stirred plasma turbulence shows Kolmogorov scaling. Here  $\beta = 8$ .

From W.Dorland, S.C.Cowley, G.W.Hammett, E.Quataert EPS 2002



## Results - Dimits shift

- The threshold temperature gradient for significant transport due to ITG turbulence is higher than linear theory predicts
- Non-linear simulations show an initial burst of turbulence, which then dies down to a low level
- Self-regulation of turbulence through generation of mean "zonal" flows



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## Results - Transport

- For core turbulence, gyro-kinetic codes can now get very close e.g. ITG threshold gradient within 5%
- Fluxes a strong function of gradient, so harder to predict
- Models like TGLF use fits to G-K simulations, and produce quite good results
- A "shortfall" is often observed near the edge, and the cause is still being debated



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# Summary

- Drift-kinetics and gyro-kinetics average over gyro-motion
- This removes a fast timescale (cyclotron frequency) and a velocity dimension, making realistic 3D simulations possible
- Gyro-kinetics can treat fluctuations of the same size as the Larmor orbit, whereas drift-kinetics cannot, and assumes orbits are small
- Major theoretical and computational improvements have been made since the early '80s
- Simulations can now reproduce experiments with reasonable accuracy

- Still lots of work needed, particularly in extending towards the plasma edge
- Calculation are still far from routine, and several more orders of magnitude speedup are needed