## Numerical modeling of MHD turbulence

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## Outline

- Why MHD turbulence?
- Why numerical modeling?
- How to model numerically?
- Applications

# Why MHD turbulence?

Simplest macroscopic description of a conducting flow

- fluid description (not kinetic)
- one fluid quasi neutral
- non relativistic

#### Magnetohydrodynamic field equations

$$\begin{array}{l} \frac{\partial \boldsymbol{v}}{\partial t} + \boldsymbol{v} \cdot \nabla \boldsymbol{v} = -\nabla P + \boldsymbol{j} \times \boldsymbol{B} + \nu \Delta \boldsymbol{v} + \boldsymbol{F_v} & \text{Momentum equation} \\ \frac{\partial \boldsymbol{B}}{\partial t} + \boldsymbol{v} \cdot \nabla \boldsymbol{B} = \boldsymbol{B} \cdot \nabla \boldsymbol{v} + \eta \Delta \boldsymbol{B} + \boldsymbol{F_B} & \text{Induction equation} \\ \nabla \cdot \boldsymbol{B} = \nabla \cdot \boldsymbol{v} = 0 & \text{Incompressible flow} \\ \boldsymbol{F_v} \text{ and } \boldsymbol{F_B} : \text{ forcing terms} \end{array}$$

+ boundary conditions!!!

# Why MHD turbulence?

- Fundamental questions: universality, scaling laws, isotropy, ...
- **Applications :** Heliosphere, Solar wind, Dynamos, Interstellar medium, Fusion experiments, ...



Caution: MHD turbulence is a very complicated state

- non-linear
- high Re  $\rightarrow$  many degrees of freedom  $\sim Re^{9/4}$
- Proving uniqueness and existence of solution to Navier-Stokes equations  $\rightarrow$  1 million Dollar

# Why numerical modeling?

- Access to detailed data
- Focus on idealized situation
- Understanding nature by simplified models
- Supercomputer provide remote laboratory
- might be much cheaper than experiments
- free (peer-reviewed) access to European resources





## How to model numerically

- Numerical derivatives
- Fast Fourier Transforms
- Resolution issues: inertial and dissipation range
- Floating point precision
- Parallelization
- What can be done with a supercomputer?

# Introduction

Discretization: 
$$v(x,t) \rightarrow v_{ijk}^n \equiv v(x_i, x_j, x_k, t_n)$$

Time integration:  $v_{ijk}^{n+1} = F(v_{ijk}^n)$ 

- Runge-Kutta
- Adams-Bashforth
- Leap-Frog

Solve accurately the MHD equations!





Tracer (fluid element) trajectories

$$\frac{d\boldsymbol{X}(\boldsymbol{x},t)}{dt} = \boldsymbol{v}(\boldsymbol{X}(\boldsymbol{x},t))$$

solution of the MHD equations

## Numerical derivatives



Compact schemes: 
$$\sum_{j=-m}^{m} h_j f'_j = \sum_{j=-n}^{n} g_j f_j$$

advantages: balance of left and right hand side terms  $\rightarrow$  smaller stencil drawback: implicit  $\rightarrow$  more complicated to solve : m=1  $\rightarrow$  tridiagonal matrix

Spectral scheme:  $f_K(x) = \sum_{k=-K}^{K} \widehat{f_k} e^{ikx}$   $f' = \widehat{i k f_K}$ 

advantages: exponential accuracy: for a periodic  $f(x) \in C^m$ 

$$\|f - f_K\|_{L^p_{(0,2\pi)}} \le CK^{-m} \|f^{(m)}\|_{L^p_{(0,2\pi)}}$$

drawbacks: convolutions (N<sup>2</sup> operations) for non-linearities  $\rightarrow$  speudo-spectral with FFTs problems for discontinues functions computation of modes  $\widehat{f_K}$  = global operation

#### **Fast Fourier Transforms**

Quadratic term 
$$f(x) = a(x) \cdot b(x) \widehat{=} (v \cdot \nabla v)$$
  
 $(\widehat{f(x)})_k = \int a(x)b(x)e^{ikx}dx$   
 $= \int \hat{a}(k-k_1)\hat{b}(k_1)dk_1$ 

 $\rightarrow$  N<sup>2</sup> operations  $\rightarrow$  numerically expensive



Speudo-spectral: Derivatives in Fourier-Space, Products in real space Transformations with Fast Fourier Transformations (FFT)

Idea: Discrete Fourier Transform = sum of 2 transforms of half length

$$\hat{f}_{k} = \sum_{j=0}^{N/2-1} e^{2\pi i k(2j)/N} f_{2j} + \sum_{j=0}^{N/2-1} e^{2\pi i k(2j+1)/N} f_{2j+1}$$
$$= \sum_{j=0}^{N/2-1} e^{2\pi i k j/(N/2)} f_{2j} + W^{k} \sum_{j=0}^{N/2-1} e^{2\pi i k j/(N/2)} f_{2j+1} = \hat{f}_{k}^{even} + W^{k} \hat{f}_{k}^{odd}$$

# Fast Fourier Transforms (2)

Iterate this decomposition  $\log_2 N$  times in even and odd transforms ...

Second level:  $\hat{f}_k = \hat{f}_k^{ee} + W^k \hat{f}_k^{eo} + W^k \hat{f}_k^{oe} + (W^k)^2 \hat{f}_k^{oo}$ 

Number of operations of a FFT:  $N \log_2 N$ 

Why?

- $\log_2 N$  levels
- N operations per level s:  $0 \le k \le N/2^s 1$  (period halving) for the computation of  $2^s$  functions

## Resolution issues: inertial range

Which resolution of the turbulent flow? A) inertial range statistics

Forcing at large scales fixes *L*. Variation of  $\nu$  determines  $Re = \frac{L u_{rms}}{\nu}$ 

Respect  $k_{max}\eta \ge 1.5$ 

Small differences in the scaling behavior of two different types of structure functions









# Resolution issues: dissipation range

#### Which resolution of the turbulent flow?



$$k_{max}\eta = 10 - 34$$

Schumacher (2007) EPL

**B) dissipation range statistics** 



# Floating point precision

#### Which floating point precision is needed?

Navier-Stokes simulation with 256<sup>3</sup> grid-points



# Floating point precision (2)

What maximal resolution can be run in single precision?

- 9 bits more  $\rightarrow$  512 times larger number
- Assume Kolmogorov spectrum  $E_k \sim k^{-5/3}$



8192<sup>3</sup> simulations are possible in single precision

#### Parallelization

Performance Development





At the end ... huge number of standard computing cores connected with a very fast network with an essentially distributed memory

# Parallelization (2)

Message Passing Interface (MPI): Data transfer between cores with different ram

Library with functions:

int MPI\_Send(void \*buf, int count, MPI\_Datatype datatype, int dest, int tag, MPI\_Comm comm)
int MPI Recv(void \*buf, int count, MPI Datatype datatype, int source, int tag, MPI Comm comm, MPI Status \*status)

+ the same in non-blocking + global communications such as

256

512

1024

2048

4096

number of cores

8192 16384 32768

# Free parallel FFT libraries such as FFTW and P3DFFT

MPI + OpenMP/Threads (on shear memory)

# What is possible

TURING (IDRIS, 31<sup>st</sup> of TOP500):

BlueGene/Q: 0.84 Pflop, 65 Tbyte RAM, 400 kW energy consumption

Simulation:

4096<sup>3</sup> grid-points ( $Re \simeq 40000$ )

Approx. 8TByte RAM

10 LET = 40 Days = 60 Million CPU h

PRACE (Partnership for advanced computing in Europe)



Electricity: 400000 kWh = 45 k euros (if 1kWh = 0.11 cents as in France, else ...)

BlueGene/Q is the most efficient Supercomputer: 2GFlop/W (Green500)



# Discontinuities

Incompressible Navier-Stokes:  $\Delta \boldsymbol{v} \rightarrow$  smooth solution

Highly compressible Flows  $\rightarrow$  shocks = discontinuities  $\rightarrow$ 

Finite volume scheme

Central Weighted Essentially Non-Oscillatory scheme

Beetz, Schwarz et al. (2008) Phys. Lett. A



Gibbs oscillations

Functional approximation of square wave using 5 harmonics



square wave using 25 harmonics



New trends: Graphic cards (CUDA, OpenCL)

- 2688 simple cores arranged in multiprocessors
- small cache per multiprocessor
- big (6TByte) global memory

very fast multiprocessors slow memory bandwidth



# APPLICATIONS

- Universality
- Planet formation
- Turbulent dynamo
- Transport of tracers and Impurities

# Universality

Problem: Are scaling laws universal ?

Speudo-spectral simulations of decaying MHD turbulence

#### **Different initial conditions**

**Different mean magnetic fields** 

$$egin{aligned} S_p(l) &= \langle (\delta z_l)^p 
angle \sim l^{\zeta_p} \ oldsymbol{z}^\pm &= oldsymbol{v} \pm oldsymbol{B} \end{aligned}$$



Lee, Brachet et al. (2012) PRE

Müller, Biskamp et al. (2003) Phy. Rev. E

#### Energy spectra:



# **Planet formation**

Problem: How to grow m-size boulders to km-size planetisimals?

- DNS of MHD shearing box
- Heavy particles
- 2-way coupling
- High order finite differences (pencil code, http://www.nordita.org/pencil-code/))

- Particles concentrate in high-pressure regions
- Acceleration of gravitational collapse
- Accelerated boulder growth

Johansen, Oishi et al. (2007) Nature Johansen, Klahr et al. (2011) A&A





# Turbulent dynamo

Problem: How does the dynamo onset scale with the Reynolds number?



Ponty, Minninni et al. (2005) Phys. Rev. Lett.

Monchaux et al., Phys. Fluids 21, 035108 (2009)

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## **Transport of tracers**

Problem: Statistical properties of fluid element trajectories



$$S_p(\tau) = \langle (\delta_\tau u)^p \rangle$$



- MHD velocity increments are less intermittent than Navier-Stokes ones
- Accelerated (Richardson) MHD dispersion is delayed due to alignment to mean magnetic field
- B-transverse dispersion is reduced

Busse, Müller et al. (2007) Phys. Plasmas

## **Transport of impurities**

Problem: Where do inertial particles go in MHD turbulence?



St

## Transport of charged impurities

#### Clustering of **charged** particles b > 0



Lorentz-number

$$Lo = \tau B_{rms}/\ell$$

Effect of Lorentz-force with respect to inertial drag

