# Generating Synthetic Turbulence in Astrophysical Plasmas

#### **Final Presentation**

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### **Background & Motivation**

#### Turbulence in Plasmas?

- > Supernovae, solar wind, turbulent accretion flows etc.
- Cosmic Ray Scattering and Influences Solar Particles (Yan, Lazarian 2004)





#### **Standard Method**

- Studies of turbulence, e.g: Cosmic Ray Diffusion by turbulence or Turbulent Star Formation, are typically done using MHD simulations (Eyink et. al, 2013)
- > Takes 0.1-1 million CPU hours
- Want to generate turbulence data cheaply

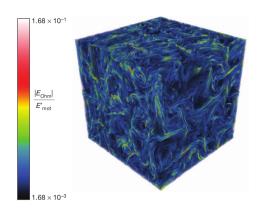


Figure: A  $1024^3$  point cube of the Electric Field. Electric field magnitude shown by colours: indicates turbulence.



# **GS95 Theory**

Most widely accepted theory of astrophysical turbulence is the Goldreich-Sridhar theory (1995). It predicts a spectrum for the turbulence in 3D:

$$E(k_{\parallel}, k_{\perp}) = k_{\perp}^{-10/3} \exp\left(-\frac{k_{\parallel}}{k_{\perp}^{2/3}}\right),$$
 (1)

where  $E^{1/2}$  is the amplitude of the waves,  $k_{\perp}$  and  $k_{\parallel}$  are the perpendicular and parallel components of the wavevector respectively w.r.t the local mean magnetic field. The scalar field,  $\Phi$ , can be initialised in real or k space:

$$\Phi(\underline{r}) = E^{1/2} cos(\underline{k} \cdot \underline{r} + \psi) \iff \widetilde{\Phi}(\underline{k}) = E^{1/2} \exp(i\psi), \tag{2}$$

where  $\psi$  is a random phase. Here we are initialising the above spectrum using  $k_{\parallel}$  &  $k_{\perp}$ w.r.t. the global mean field. The challenge is to produce a GS95 spectrum w.r.t. the local mean field. For this we describe two methods.

### **Squares Method**

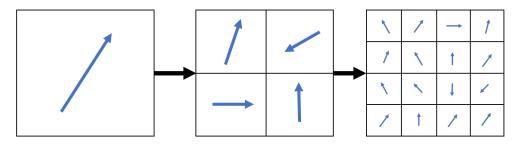


Figure: Domain split up into smaller areas, scalar field set according to local mean magnetic field. Keep splitting until Nyquist Frequency reached.

This requires some trial and error as the range of wavenumbers used in each domain is rather arbitrary

### **Displacement Method**

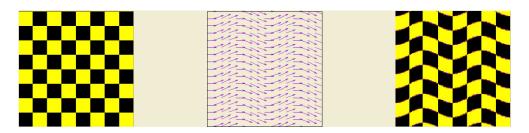


Figure: Given an initial scalar field (left) and a magnetic field (centre), the scalar field should be deformed to follow the magnetic field (right).

MHD induction equation for a perfect conductor:  $\frac{\delta \mathbf{B}}{\delta t} = \nabla \times (\mathbf{v} \times \mathbf{B})$ , where **B** is the magnetic field and **v** is the velocity. Making an ansatz this becomes:

$$\mathbf{B}^{(i+1)} - \mathbf{B}^{(i)} = \nabla \times (\delta \xi^{(i)} \times \mathbf{B}^{(i)}), \tag{3}$$

where  $\delta \xi^{(i)}$  is the spatial displacement. A second ansatz is made:  $\delta \xi_*^{(i)} = \delta \mathbf{R}^{(i)} \times \mathbf{B}^{(i)}$ , where  $\delta \mathbf{R}^{(i)}$  is the displacement field that we desire.

### **GS95 Spectrum Verification**

In both squares & displacement method a magnetic field was setup:

$$B_x(x,y) = 1 (4)$$

$$B_y(x,y) = 0.5sin(2x) \tag{5}$$

When the energy spectra, E, is integrated separately over  $k_{\perp}$  &  $k_{\parallel}$  the following relations are found:

$$E(k_{\perp}) \propto k_{\perp}^{-5/3}, \ E(k_{\parallel}) \propto k_{\perp}^{-2}$$
 (6)

Another measure of performance is the structure function, which depends on the scale of the turbulence in real space:  $l_{\perp}$  and  $l_{\parallel}$  w.r.t. the local mean magnetic field. A key result from GS95 is the relation between  $k_{\perp}$  and  $k_{\parallel}$ :

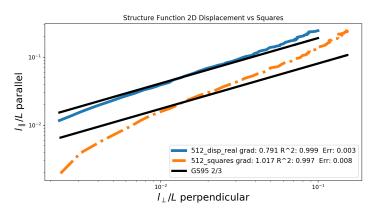
$$k_{\parallel} \propto k_{\perp}^{2/3}.\tag{7}$$

As  $k \propto 1/l$ , the same relation applies for  $l_\perp$  and  $l_\parallel$  as used in the structure function, implying a slope of 2/3 on a logarithmic plot.

#### 2D Real Displacement vs Squares

> The structure function w.r.t the local mean magnetic field:

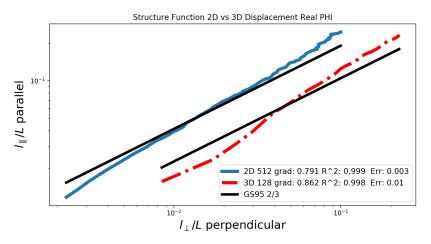
$$SF(l_{\parallel}, l_{\perp}) = \langle (\mathbf{B}(r + l_{\parallel}\hat{b}_{\parallel} + l_{\perp}\hat{b}_{\perp}) - \mathbf{B}(r))^2 \rangle$$
 (8)



Squares method less accurate. Displacement method extended to 3D.

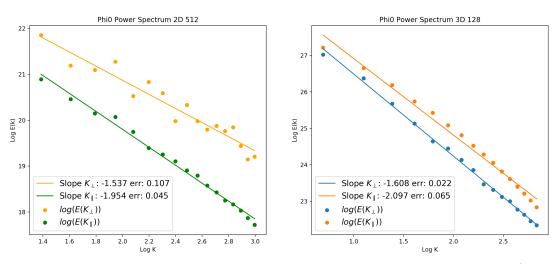


### 2d vs 3d Real Displacement



This shows that the 3D method works less accurately but this could be due to the low resolution.

## 2D & 3D Real Disp. Verification



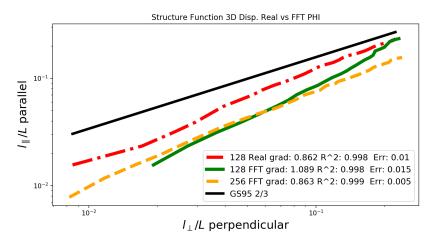
- > These show that the phi0 initialisation in real space worked as intended in 2D & 3D.
- > As both seem to agree with:  $E(k_\perp) \propto k_\perp^{-5/3}$  and  $E(k_\parallel) \propto k_\perp^{-2}$



#### **Issue with Time - FFT**

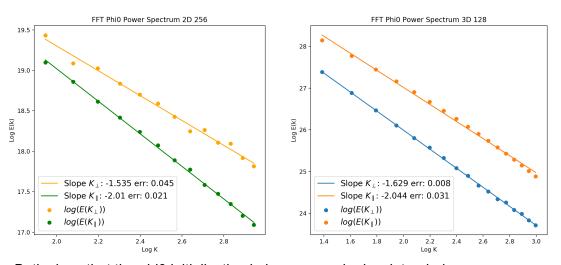
- Displacement method run times:
  - 2d 512 resolution  $\sim$  40 minutes
  - 3d 64 res.  $\sim$  40 minutes
  - $\sim$  3d 128 res.  $\sim$  43 hours
- Need to speed up the process to create data at a meaningful resolution
- Attempted OpenMP in Fortran but phi init. not thread safe
- Instead initialise phi in k-space and use inverse fourier transform back to real space
- This reduced the time from 43 hours to 4 minutes for 3d 128

#### 3d Disp. Real vs FFT



- > Here the FFT method performs as accurately as the one in real space
- However this plot displays why higher resolutions are required as 128 FFT less accurate

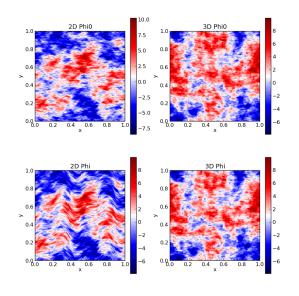
# 2D & 3D Disp. Verification FFT



- > Both show that the phi0 initialisation in k space worked as intended.
- > As both seem to agree with:  $E(k_\perp) \propto k_\perp^{-5/3}$  and  $E(k_\parallel) \propto k_\perp^{-2}$



#### FFT Disp. Verification



- > An X,Y slice of the Phi0 and Phi arrays
- In both 2D & 3D added sinusoidal mag. field in Y varying with X
- In 2D Phi (bottom right) can see displacement method working
- > 3D Phi no sinusoidal displacement seen
- More investigation required

#### **Conclusion & Further Work**

- Displacement performs better than Squares
- Power Spectrum implies displacement method works as intended
- Nevertheless still not perfect: structure function doesn't match theory
- Successfully extended to 3D, but very slow
- > Attempted speed up with FFT method power spectrum implies successful
  - But FFT method still uses too much RAM ( 45GB for 3D 512 single precision arrays) need more memory efficiency
  - FFT method also gives less accurate results in 3D phi plots
  - Need closer look at FFT method
- Port methods to python to use MPI4py to safely parallelize the process and access higher resolutions
- > Compare results in 3D for varying  $M_A$ , (i.e. changing the magnetic field variation)



#### Thank you!

#### Contact

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