### Fractal, multifractal, and generalized scaling in the turbulent solar wind

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- ➤ The quest for *universal* features of turbulence in solar wind
- ➤ Multifractal turbulence in the solar wind- the inertial range
- What happens on small scales- dissipation/dispersion range on large scales- outer scale

Data thanks to CLUSTER, WIND, ACE, ULYSSES teams

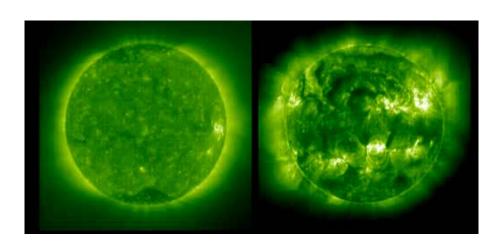


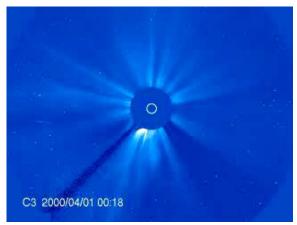


# Overview: the solar wind as a turbulence laboratory

SOHO-EIT image of the corona at solar minimum and solar maximum

SOHO- LASCO image of the outer corona near solar maximum





I: coronal signature has scaling properties

II: solar wind has intermittent (multifractal) inertial range of turbulence

III: in-situ observations span inertial range,

dissipation/dispersion range and lower k





#### Solar wind at 1AU power spectrasuggests inertial range of (anisotropic MHD) turbulence. Multifractal scaling in velocity and magnetic field components..

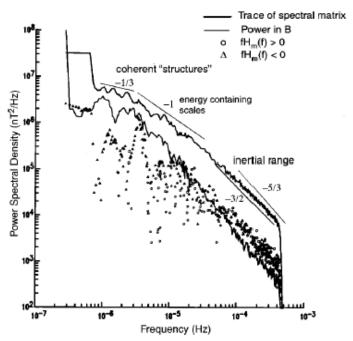


FIG. 1. A power spectrum of the solar wind magnetic field from a time series spanning more than a year. The upper curve is the trace of the power spectral matrix of the three components of B, the lower solid curve is the power in |B|, and the circles and triangles are the positive and negative values of the [reduced (Ref. 91)] magnetic helicity (Refs. 39 and 92) respectively.

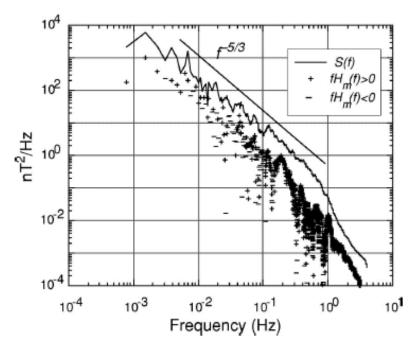


FIG. 2. A power spectrum of Mariner 10 data from 0.5 AU showing the dissipation range of magnetic fluctuations. Also shown are positive and negative values of  $fH_m(f)$ .

Goldstein and Roberts, POP 1999, See also Tu and Marsch, SSR, 1995





#### **Turbulence and scaling**

structures on many length/timescales.

single spacecraft- time interval  $\tau$  a proxy for space

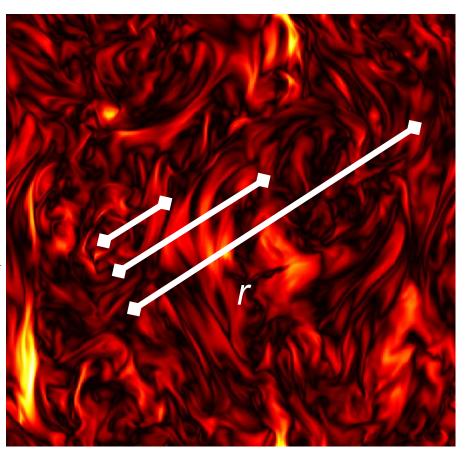
Reproducible, predictable in a statistical sense.

to focus on any particular scale r take a difference:

$$y(l,r) = x(l+r) - x(l)$$

look at the statistics of y(l,r)

power spectra- compare power in Fourier modes on different scales *r* 



DNS of 2D compressible MHD turbulence Merrifield, SCC et al, POP 2006,2007





## Beyond power spectra- quantifying scaling/turbulence from observations

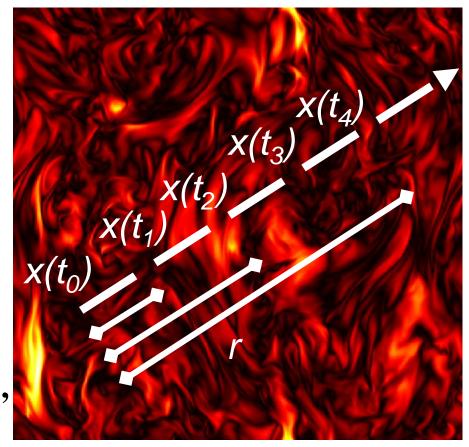
single spacecraft- time interval  $\tau$  a proxy for space

look at (time-space) differences:  $y(t,\tau) = x(t+\tau) - x(t)$  for all available  $t_k$  of the timeseries  $x(t_k)$  test for statistical scaling i.e structure functions  $S_p(\tau) = \langle |y(t,\tau)|^p \rangle \propto \tau^{\zeta(p)}$  we want to measure the  $\zeta(p)$ 

fractal (self- affine)  $\zeta(p) \sim \alpha p$ 

multifractal  $\zeta(p) \sim \alpha p - \beta p^2 + ...$ 

NB structure functions are just one example of a 'scaling measure' cf wavelets, Fourier, SVD/PCA...



All decompose the timeseries as a sum of functions on different scales.





# The inertial range- anisotropy and phenomenology from scaling





#### Multifractal inertial range turbulence- examples

$$S_p = \langle |x(t+\tau) - x(t)|^p \rangle \sim \tau^{\xi(p)}$$
, plot  $\log(S_p)$  vz.  $\log(\tau)$  to obtain  $\xi(p)$ 

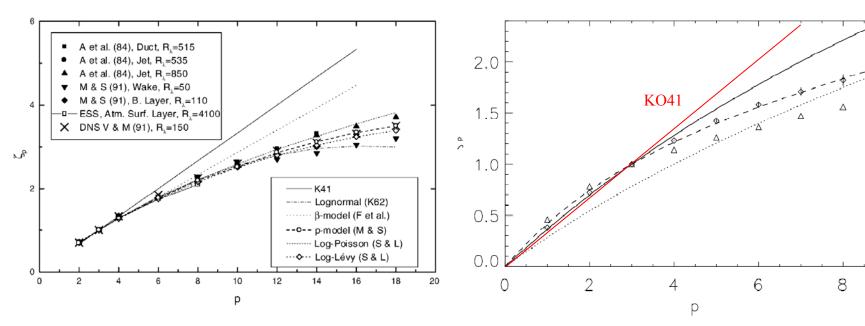


Fig. 11. Power-law exponents  $\zeta_p$  of the structure functions as a function of the order p, together with the values predicted by K41 and the various intermittency models of Table 1.

Lab Fluid experiments, Anselmet et al, PSS, 2001

IG. 4. Scaling exponents  $\zeta_p^+$  for 3D MHD turbulence (diasonds) and relative exponents  $\zeta_p^+/\zeta_3^+$  for 2D MHD turbulence riangles). The continuous curve is the She-Leveque model  $\zeta_p^{\rm SL}$ , the dashed curve the modified model  $\zeta_p^{\rm MHD}$  (7), and the dotted line the IK model  $\zeta_p^{\rm IK}$ .

2 and 3D MHD simulations *Muller & Biskamp PRL 2000* 

How large can we take p? See eg Dudok De Wit, PRE, 2004



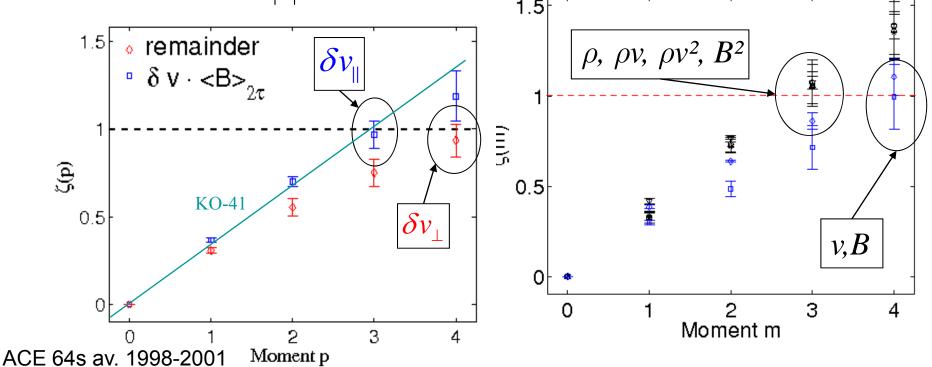


#### Solar wind anisotropy: Velocity fluctuations parallel and perpendicular to the local B field direction

Exponents  $\zeta(p)$  for  $< |\delta v_{\parallel,\perp}|^p > \sim \tau^{\zeta(p)}$  for

$$\delta v_{\parallel} = \delta \mathbf{v} \cdot \hat{\mathbf{b}}$$
 and its remainder  $\delta v_{\perp} = \sqrt{\delta \mathbf{v} \cdot \delta \mathbf{v} - \left(\delta \mathbf{v} \cdot \hat{\mathbf{b}}\right)^2}$   $\zeta(3 + \alpha) = 1$  determines phenomenology

$$\overline{\mathbf{B}} = \mathbf{B}(t) + ... + \mathbf{B}(t + \tau'), \ \hat{\mathbf{b}} = \frac{\overline{\mathbf{B}}}{|\overline{\mathbf{B}}|}, \text{here } \tau' = 2\tau \text{ and } \delta \mathbf{v} = \mathbf{v}(t + \tau) - \mathbf{v}(t)$$



SCC et al GRL 2007, see also Hnat, SCC et al PRL 2005, SCC et al NPG 2008



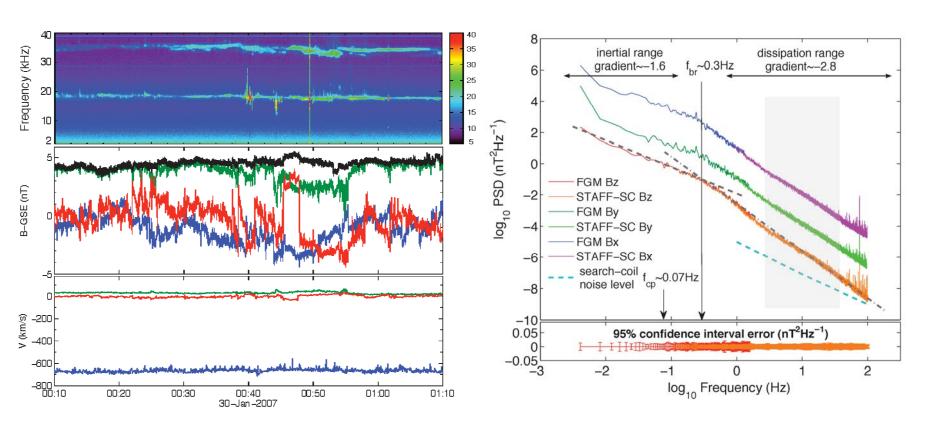


# The 'dissipation' range- what happens on kinetic scales





### A nice quiet fast interval of solar wind- CLUSTER high cadence B field spanning IR and dissipation range

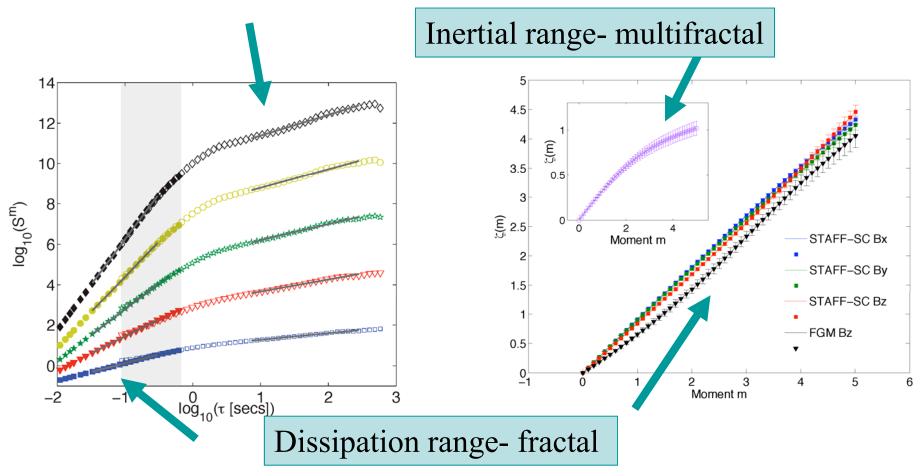


CLUSTER STAFF and FGM shown overlaid. Kiyani, SCC et al PRL submitted 2009





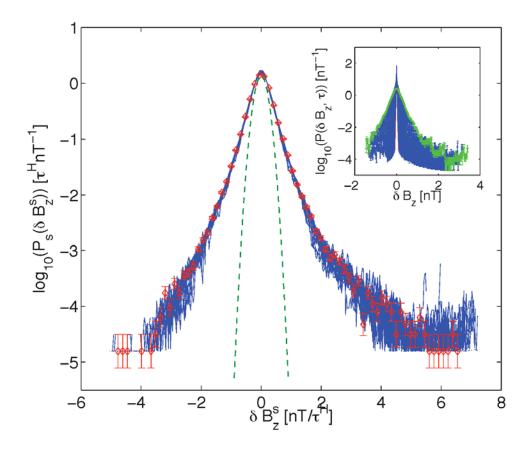
#### $S_p = \langle |x(t+\tau) - x(t)|^p \rangle \sim \tau^{\xi(p)}$ , plot $\log(S_p)$ vz. $\log(\tau)$ to obtain $\xi(p)$



CLUSTER STAFF and FGM shown overlaid. Kiyani, SCC et al PRL submitted 2009







Non- Gaussian PDF in dissipation range, single exponent scaling collapse





# The 'outer scale'- the end of the inertial range of turbulence at larger scales



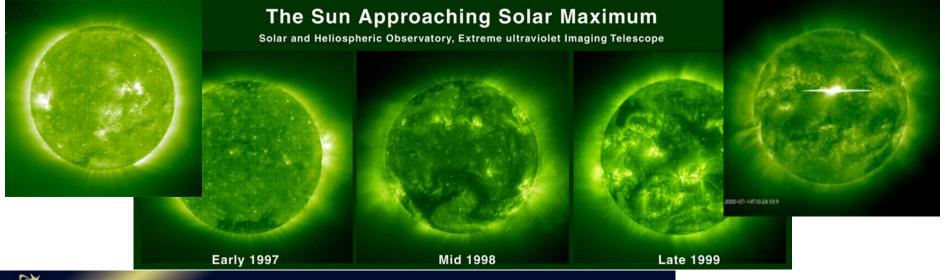


#### ULYSSES- north and south polar passes at solar minimum

ULYSSES 60s averages B field components

- ~8.5x10<sup>4</sup> points, selected as a quiet interval
- -Multifractal

-See also *Nicol*, *SCC et al*, *ApJ* (2008), *SCC et al ApJL* (2009) Solar cycle dependence in correlation *Wicks*, *SCC et al*, *ApJ* (2009)

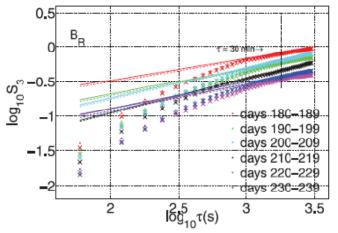


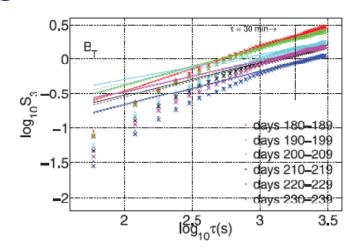




#### **Evolving turbulence-**

### Quiet, fast polar solar wind: 1995 North polar pass, solar min, ULYSSES



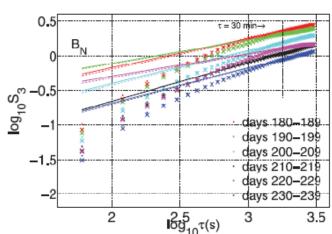


IR turbulence- expect

$$S_3 \sim \tau^{\zeta(3)}$$

i.e. straight line on log-log plot not quite seen here!

$$\frac{1}{f}$$
 is actually  $\frac{1}{f^{\gamma}}$ 



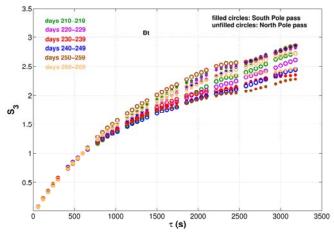
Nicol, SCC et al ApJ 2008, SCC et al, ApJL 2009

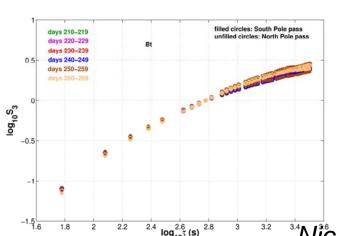




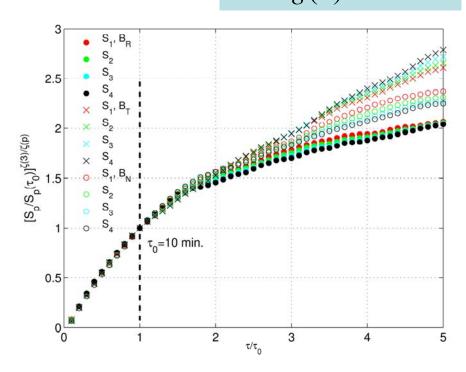
### Generalized similarity (scaling)- turbulence at the outer scale-universal behaviour?

South pass 1994, North pass 1995, solar min





 $S_p \sim g(\tau)^{\xi(p)}$ invert to obtain  $g(\tau)$ same  $g(\tau)$  seen



"Nicol, SCC et al ApJ 2008, SCC et al, ApJL 2009





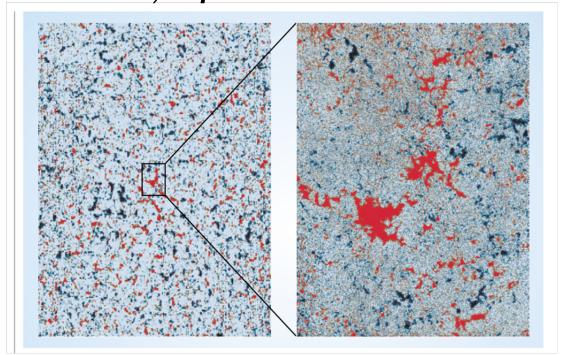
### Scaling from the corona?





### Scaling from the sun: Fractal patches of magnetic polarity on the quiet sun

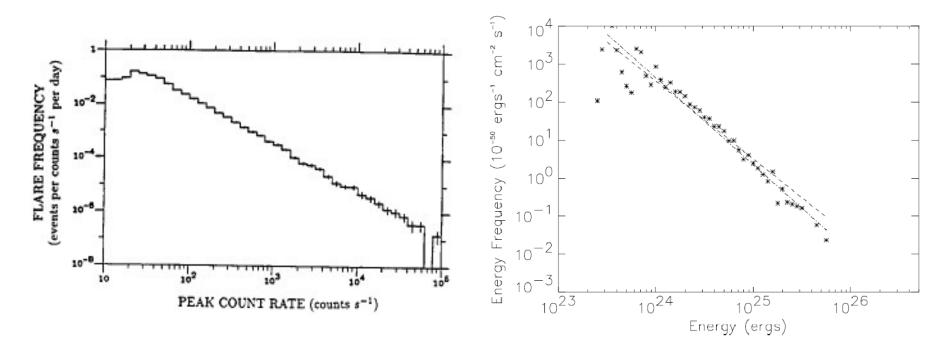
Patches of opposing polarity — Zeeman effect photosphere, quiet sun, (Stenflo, Nature 2004, See eg Janssen et al A&A 2003, Bueno et al Nature 2004+..) - spatial







#### Scaling from the sun: power law flare statistics



Peak flare count rate *Lu&Hamilton ApJ 1991*TRACE nanoflare events *Parnell&Judd ApJ 2000*-temporal





#### Solar wind at 1AU power spectra-B magnitude shows a single power law range, inertial range of (anisotropic MHD) turbulence seen in components

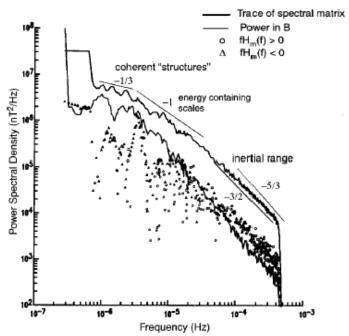


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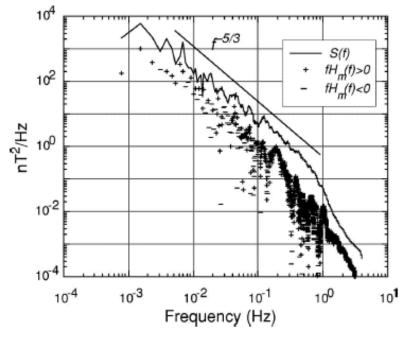
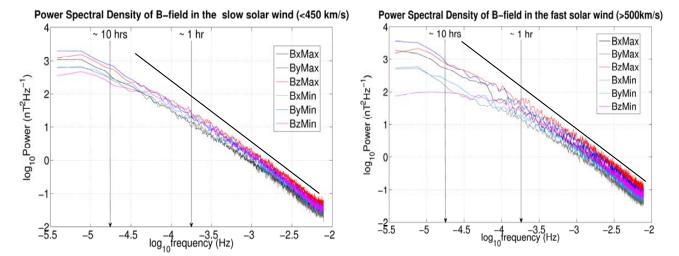


FIG. 2. A power spectrum of Mariner 10 data from 0.5 AU showing the dissipation range of magnetic fluctuations. Also shown are positive and negative values of  $fH_m(f)$ .

Goldstein and Roberts, POP 1999, See also Tu and Marsch, SSR, 1995





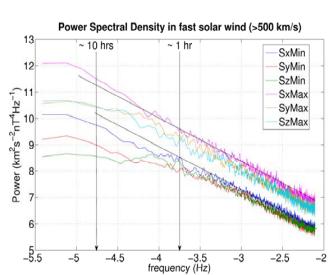


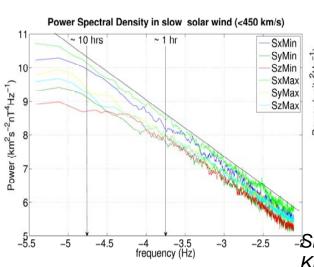
Shown: log-log plots of PSD of 3 day intervals averaged over 1 year

ACE solar max (2000); solar min (2007)

Plotted:  $|\mathbf{B}|$ ,  $B^2$  and normalized  $\mathbf{S}=-[\mathbf{B}(\mathbf{v}.\mathbf{B})-\mathbf{v}B^2]$ 

Fast v>500kms<sup>-1</sup>and slow v<450kms<sup>-1</sup>





Components show 2 regions inertial range and '1/f'

x- component of Poynting flux B magnitude one single region

PSD in fast (>500 km/s) & slow (<450km/s) solar wind

8

~ 10 hrs

~ 1 hr

B<sup>2</sup>MinFast
|B|MinFast
|B|MixFast|
|B|MixFast|
|B|MixFow
|B|MixSlow

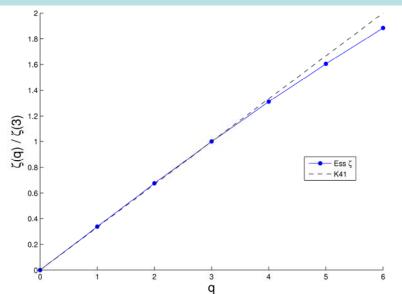
Signature of coronal fields within IR-Kiyani, SCC et al PRL, 2007

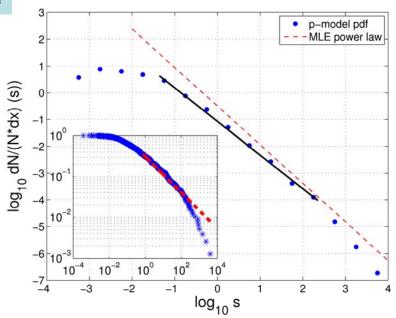




### p-model for intermittent turbulence- shows finite range power law avalanches

p-model timeseries shows multifractal behaviour in structure functions as expected





Thresholding the timeseries to form an avalanche distribution- finite range power law *Watkins, SCC et al, PRL, 2009, SCC et al, POP 2009* 





### Summary

- The quest for universal features of turbulence in solar wind
- The corona contributes some scaling-dominates x component of Poynting flux and B magnitude
- ➤ inertial range: Components- Multifractal anisotropic MHD turbulence
- ➤ dissipation/dispersion range- fractal (monoscaling) distinct from fluid/MHD phenomenology
- >outer scale- a universal function for the largest scales in finite range turbulence?





#### Turbulence, fractals and multifractals (intermittency)

velocity difference across an eddy  $d_r v = v(l+r) - v(l)$ 

eddy time T(r) and energy transfer rate  $\varepsilon_{\rm r} \propto \frac{d_{\rm r} v^2}{T}$ 

now 
$$T \propto \frac{\mathbf{r}}{d_{\mathbf{r}}v}$$
 so that  $\varepsilon_{\mathbf{r}} \propto \frac{d_{\mathbf{r}}v^3}{r}$  or  $\langle d_{\mathbf{r}}v^3 \rangle \propto \langle \varepsilon_{\mathbf{r}} \rangle r$  and  $\langle d_{\mathbf{r}}v^p \rangle \propto r^{p/3} \langle \varepsilon_{\mathbf{r}}^{p/3} \rangle$ 

If the flow is non-intermittent  $\langle \varepsilon_r^p \rangle = \overline{\varepsilon}^p$ , r independent

$$\Rightarrow \langle d_r v^p \rangle \propto r^{p/3} \overline{\varepsilon}^{p/3} \sim r^{\zeta(p)} - \zeta(p) = \alpha p \text{ linear with } p - self similar(fractal)$$

intermittency correction-  $\langle \varepsilon_r^p \rangle$  is r dependent-  $\zeta(p)$  quadratic in p – multifractal

 $\langle \varepsilon_r \rangle = \overline{\varepsilon}$  independent of r (steady state) so  $\zeta(3) = 1$ 

cannot distinguish fractal from multifractal from power spectrum (only fixes  $\zeta(2)$ )





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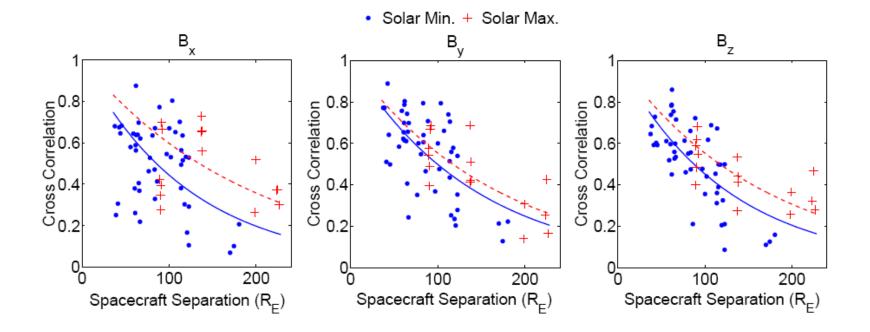
MHD: now T is due to (say) Alfvenic collisions  $T \sim \frac{r}{d_r v} \left( \frac{v_0}{d_r v} \right)^{\alpha}$  giving  $\varepsilon_r \sim \frac{d_r v^{3+\alpha}}{r}$ 

MHD: same with  $\frac{p}{3} \rightarrow \frac{p}{(3+\alpha)}$  and  $\zeta(\alpha+3)=1$ 





# Much less (if any) solar cycle variation in components.







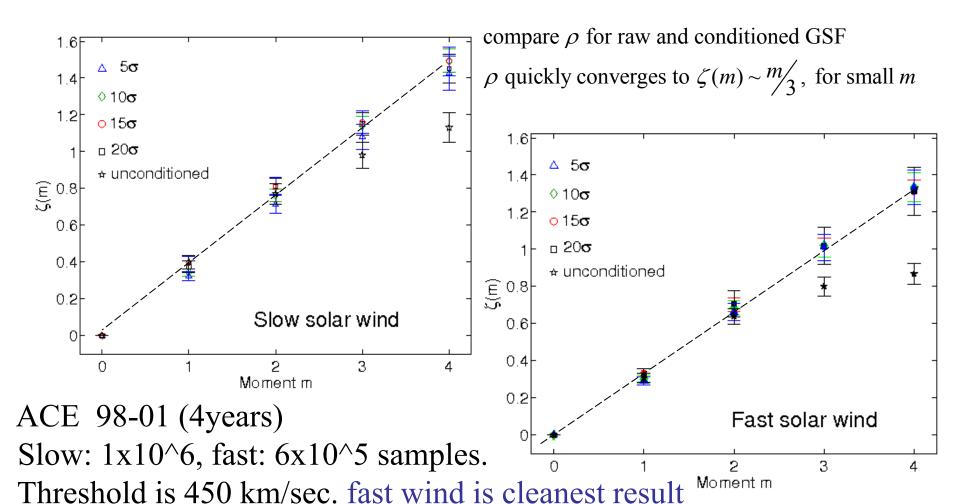
#### Summary- what we have learned..

- > 'Turbulence' is a sub- class of 'scaling'- and we observe scaling
- 2 types of 'scaling and bursty' in time (i) fractal and heavy tailed (non- Gaussian) (ii) multifractal (and both are sometimes called intermittent)
- Method to distinguish these proposed
- The 'straightforward' solar wind- scaling coronal signature within the inertial range of turbulence
- Coronal signatures in magnetic energy density, Poynting flux, density?
- Physical insights flow from universality (asking: are the observed exponents the same as...?) to determine the physics- so the error bars are important!
- Finite size data sets, time stationarity!
- SDE models as a bridge between scaling (turbulence) and critical phenomena, as a method for quantifying 'anomalous transport'
- Evolving and boundary layer turbulence- universal(?) functions we can measure





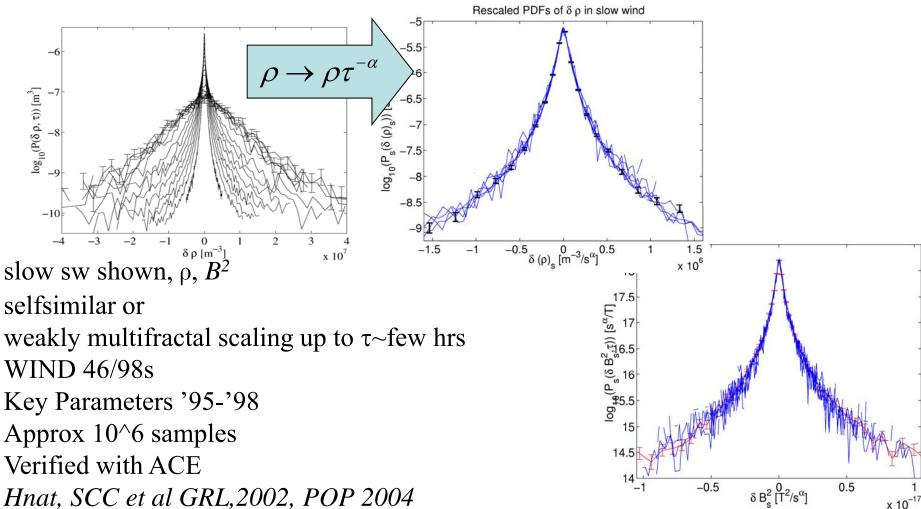
#### Scaling- p in slow and fast solar wind







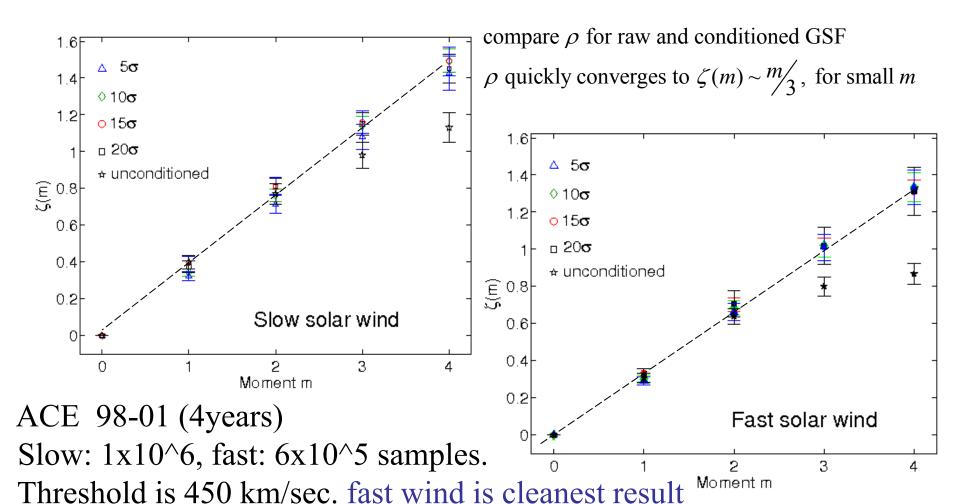
### Rescaled PDF- $\rho$ , $B^2$ in the solar wind







#### Scaling- p in slow and fast solar wind







### Passive scalars and incompressibility

Bershadskii and Sreenivasan PRL '04 argued that |B| is passive scalar.. Appeal to universality in scaling exponents (same physics, same scaling)

$$\frac{DQ}{Dt} = \frac{\partial Q}{\partial t} + v \bullet \nabla Q = 0$$

e.g.

$$\frac{\partial \rho}{\partial t} + \nabla \bullet (\rho v) = 0 = \frac{\partial \rho}{\partial t} + v \bullet \nabla \rho$$

with  $\nabla \cdot v = 0$  incompressible flow

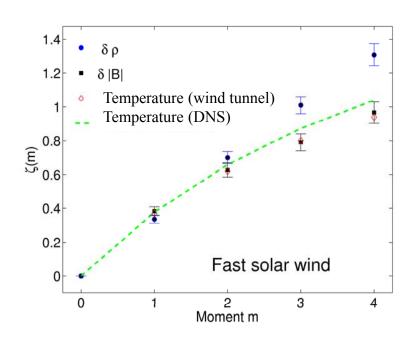
if the flow is incompressible-  $\rho$  must be a passive scalar-

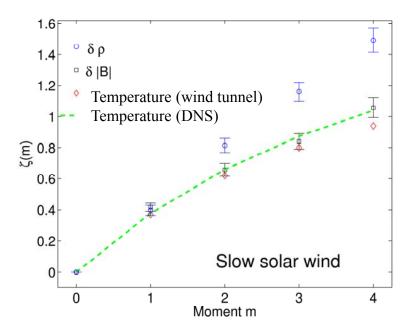




### Passive scalars comparison

does not need to be so precise..





ρ is not passively advected with the flow? Hnat, SCC et al PRL '05 1 year ACE data (1998)

Compare  $\rho$  with passive scalars:

Conditioned |B| (same dataset), + others

Argued that |B| is passive scalar..

Bershadskii and Sreenivasan PRL '04





# Fokker- Planck models (see also fractional kinetics and Lévy flights)

Langevin equation

$$\frac{dx}{dt} = \beta(x) + \gamma(x)\eta$$

 $\eta$  stochastic iid

Fokker- Planck equation

$$\frac{\partial P(y,t)}{\partial t} = \nabla (A(y)P(y,t) + B(y)\nabla P(y,t))$$
can solve for  $P(y,t)$ 

Note: y(t) is distance travelled in interval  $t = \tau$ –a differenced variable

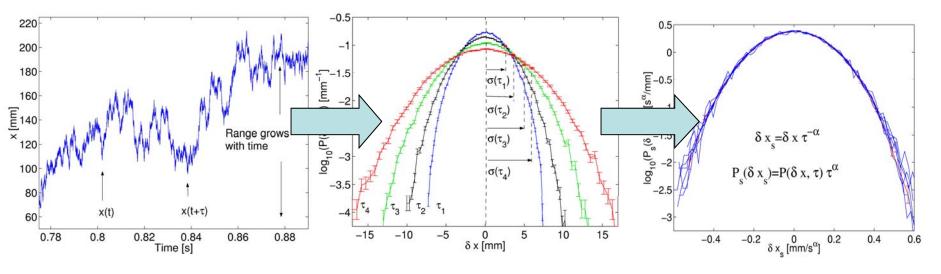
Renormalization-scaling system looks the same under

$$t' = \frac{t}{\tau}$$
,  $y' = \frac{y}{\tau^{\alpha}}$  and  $\alpha \neq \frac{1}{2}$ .....which implies  $P(y',t') = \tau^{\alpha} P(y,t)$ 





#### How 'differences' tell us about scaling - Brownian walk ('fractal')

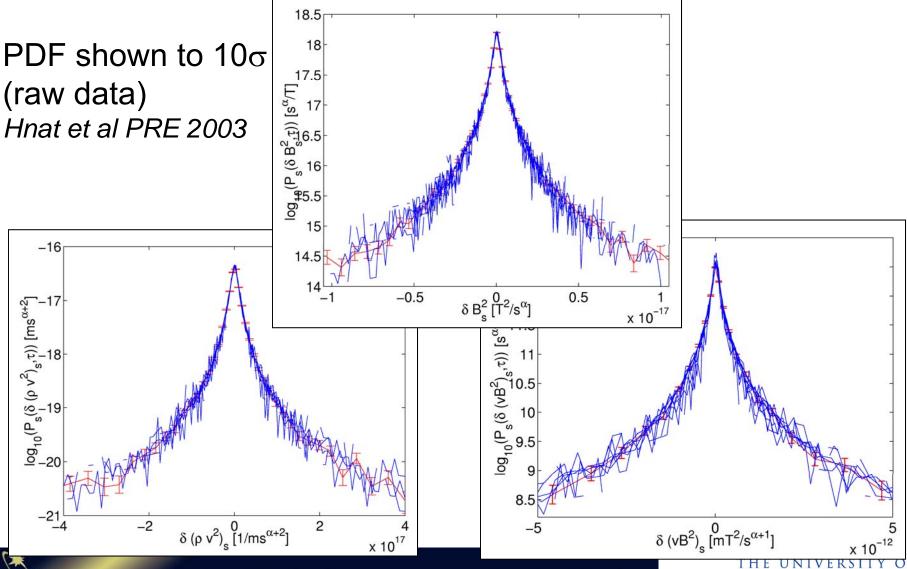


- 1) difference the timeseries x(t) on timescale  $\tau$  to obtain  $y(t,\tau) = x(t+\tau) x(t)$
- 2)  $P(y,\tau)$  are self-similar (fractal) if same function under single parameter rescaling
- 3) rescaling parameter comes from the data eg  $\sigma(\tau) \sim \tau^{\alpha}$ ,  $\alpha = \frac{1}{2}$  here
- 4) so moments of the PDF:  $\langle y(t,\tau)^p \rangle_t \sim \tau^{\alpha p}$





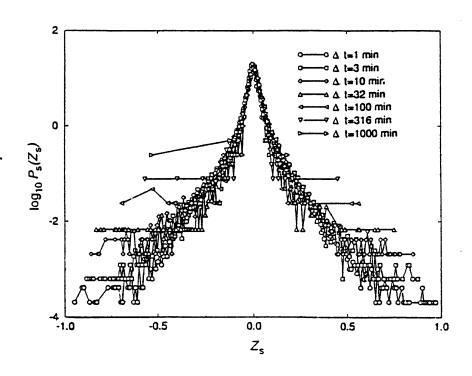
Rescaled PDF of  $S=vB^2, \rho v^2, B^2$ ...





#### A not so simple fractal timeseries- financial markets

- Mantegna and Stanley- Nature, 1995
- S+P500 index
- 'heavy tailed' distributions
- Brownian walk in log(price) is the basis of Black Scholes (FP model for price dynamics)
- Non- Gaussian PDF, fractal scaling-Fractional Kinetics or non- linear FP in solar wind: Hnat, SCC et al PRE 2003, SCC et al NPG 2005







## Structure functions-estimating the $\zeta(p)$ from data

Define structure function (generalized variogram)  $S_p$  for differenced timeseries:

$$y(t,\tau) = x(t+\tau) - x(t)$$

$$S_p(\tau) = \langle y(t,\tau) |^p \rangle \propto \tau^{\zeta(p)}$$
 if scaling

We would like to calculate  $S_p(\tau) = \langle |y(t,\tau)|^p \rangle = \int_{-\infty}^{\infty} |y|^p P(y,\tau) dy$ 

then 
$$S_p(\tau) = \tau^{\zeta(p)} \int_{-\infty}^{\infty} y_s^p P_s dy_s$$

Conditioning- an estimate is:

$$||y||^p > = \int_{-A}^{A} |y|^p P(y,\tau) dy \text{ where } A = [10-20]\sigma(\tau)$$

strictly ok if selfsimilar:  $y \to y_s \tau^{\alpha}, P \to P_s \tau^{-\alpha}, \zeta(p) = p\alpha$ 

if  $\xi(p)$  is quadratic in p (multifractal)- weaker estimate

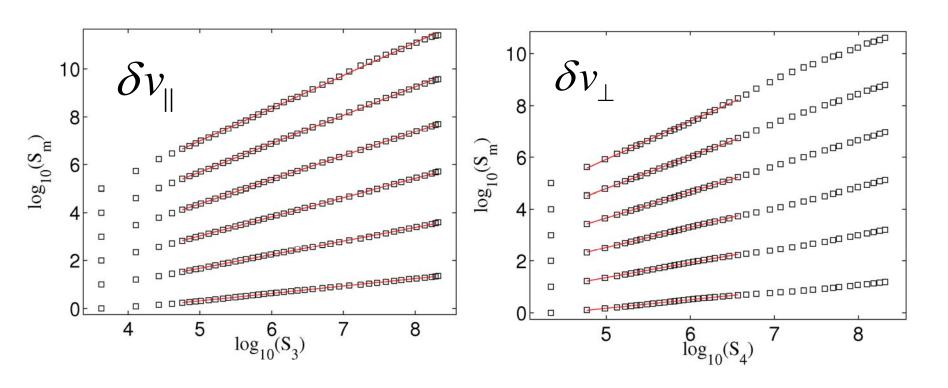




#### Confirmation of a scaling range- ESS plots:

 $S_p = \langle |\delta \mathbf{v} \cdot \hat{\mathbf{b}}|^p \rangle \sim \tau^{\zeta(p)}$  and its remainder versus  $S_3, S_4$  where  $\zeta(3), \zeta(4) \approx 1$  respectively

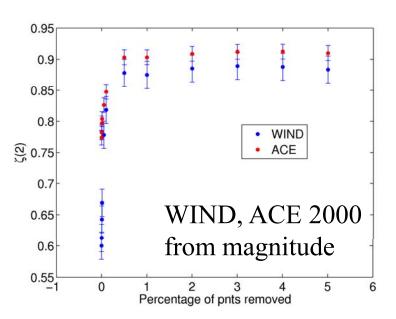
ESS tests 
$$S_p = G(\tau) S_q^{\zeta(p)/\zeta(q)}$$

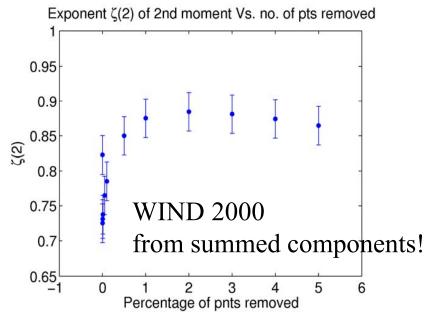






## Seen both in WIND and ACE





Scaling is sensitive to calibration?

Shown B<sup>2</sup>

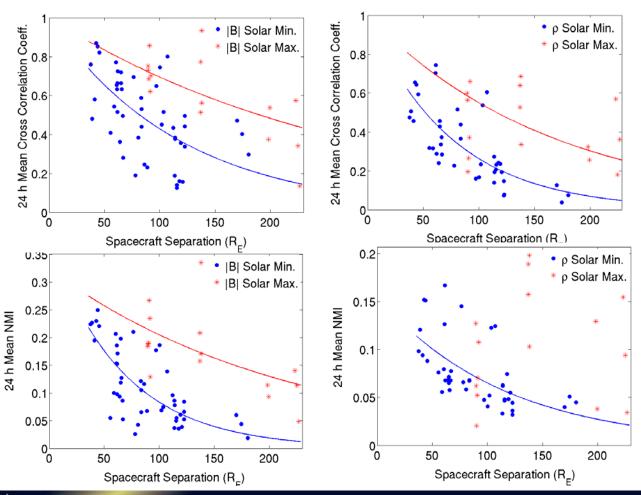
WIND: from summed components, and from magnitude

ACE: from magnitude





## Solar Cycle Dependence of Solar Wind Correlation Length- between WIND-ACE



- Fits are of the form :
  - $y = A \exp(-x/\lambda)$
- A = 1 for cross correlation fitting.
- Each point represents 24 hours of data
- Running mean subtracted.

Wicks, SCC et al, ApJ(2009)



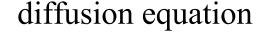


## Diffusion- random walk

Brownian random walk

$$\frac{dx}{dt} = \eta$$

$$\eta \text{ is stochastic iid}$$



$$\frac{\partial P(y,t)}{\partial t} = D\nabla^2 P(y,t)$$

 $\Rightarrow P(y,t)$  is Gaussian

Note: y(t) is distance travelled in interval  $t = \tau$ —a differenced variable

Renormalization-scaling system looks the same under

$$t' = \frac{t}{\tau}$$
,  $y' = \frac{y}{\tau^{\alpha}}$  and  $\alpha = \frac{1}{2}$ .....which implies  $P(y',t') = \tau^{\alpha} P(y,t)$ 

 $\Rightarrow P(y,t)$  is Gaussian, the fixed point under RG



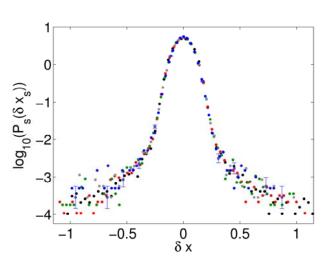


## A more precise test for fractalityoutliers and convergence: example-Lèvy flight ('fractal')

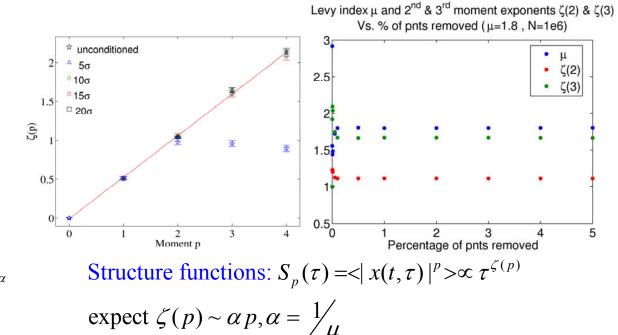
$$P(x) \sim \frac{C}{x^{1+\mu}}, x \to \pm \infty, 1 < \mu < 2$$
 power law tails, self similar

for a finite length flight  $(x - \langle x \rangle)^2 \sim t^{2/\mu}$ 

so  $\mu = 2$  is Gaussian distributed, Brownian walk



PDF rescaling  $x \to x_s \tau^{\alpha}, P \to P_s \tau^{-\alpha}$ 



SCC et al, NPG, 2005, Kiyani, SCC et al PRE (2006)



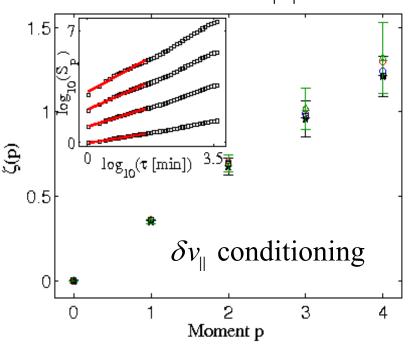


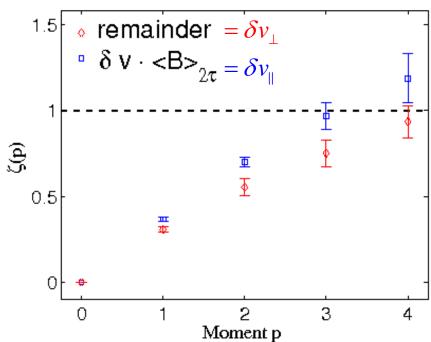
## Velocity fluctuations parallel and perpendicular to the local B field direction

Exponents 
$$\zeta(p)$$
 for  $< |\delta v_{\parallel,\perp}|^p > \sim \tau^{\zeta(p)}$  for  $\delta v_{\parallel} = \delta \mathbf{v}.\hat{\mathbf{b}}$  and its remainder  $\delta v_{\perp} = \sqrt{\delta \mathbf{v} \cdot \delta \mathbf{v} - (\delta \mathbf{v}.\hat{\mathbf{b}})^2}$ 

ACE 64s av. 1998-2001 Chapman et al GRL (2007)

$$\overline{\mathbf{B}} = \mathbf{B}(t) + ... + \mathbf{B}(t + \tau'), \ \hat{\mathbf{b}} = \frac{\overline{\mathbf{B}}}{|\overline{\mathbf{B}}|}, \text{here } \tau' = 2\tau \text{ and } \delta \mathbf{v} = \mathbf{v}(t + \tau) - \mathbf{v}(t)$$





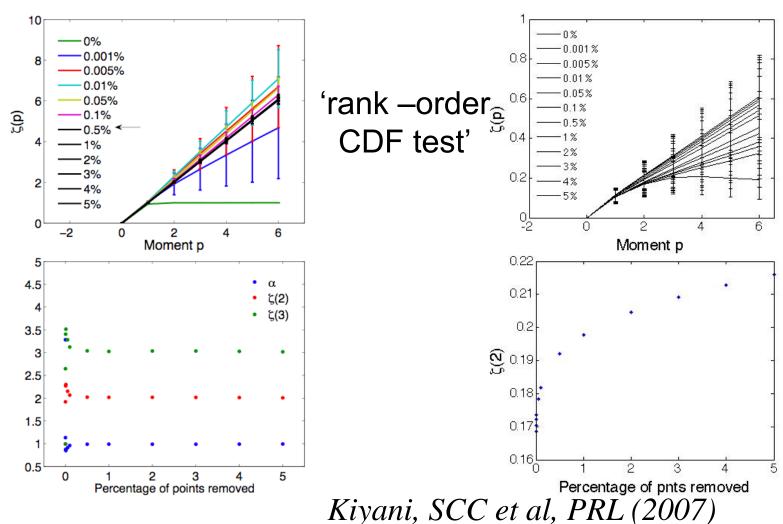




### Distinguishing self- affinity (fractality) and multifractality

Levy flight -- Fractal

P-model -- Multifractal

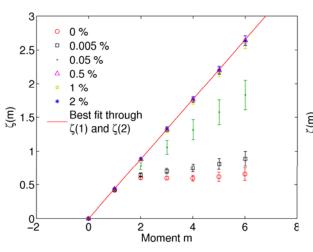




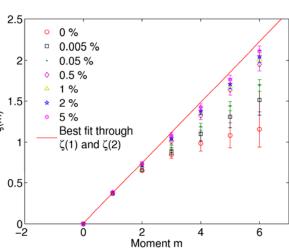


## Solar cycle variation WIND Inertial Range-- |B|<sup>2</sup>

#### 2000 - Solar max

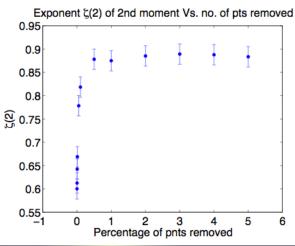


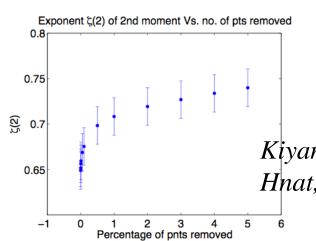
#### 1996 - Solar min



Fractal signature 'embedded' in (multifractal) solar wind inertial range turbulence -coincident with complex coronal magnetic topology Max/min:

Distinct topology of coronal fields?





Kiyani, SCC et al, PRL (2007), Hnat, SCC et al, GRL, (2007)

Distinct fast wind?





#### Anisotropy and intermittency free parameters-Kolmogorov vz MHD scaling

velocity difference  $d_r v = v(l+r) - v(l)$ , energy transfer rate  $\varepsilon_r \sim \frac{d_r v^2}{T}$ 

Kolmogorov: simply have T as the eddy turnover time  $T \sim \frac{r}{d_r v}$  so that  $\varepsilon_r \sim \frac{d_r v^3}{r}$ 

MHD: now T is due to (say) Alfvenic collisions  $T \sim \frac{r}{d_r v} \left( \frac{v_0}{d_r v} \right)^a$  giving  $\varepsilon_r \sim \frac{d_r v^{3+\alpha}}{r}$ 

intermittency  $\langle \varepsilon_r^p \rangle \sim \overline{\varepsilon}^p \left( r / L \right)^{\tau(p)}$ 

$$\Rightarrow$$
 Kolmogorov:  $\langle d_r v^p \rangle \sim r^{\frac{p}{3}} \overline{\varepsilon}^{\frac{p}{3}} \left( \frac{L}{r} \right)^{\tau \left(\frac{p}{3}\right)} \sim r^{\zeta(p)}$ 

$$\Rightarrow$$
 MHD: same with  $\frac{p}{3} \rightarrow \frac{p}{(3+\alpha)}$  intermittency free  $E(k) \sim \left\langle dv^2 \right\rangle / k \sim k^{-(5+\alpha)/(3+\alpha)}$ 

 $\langle \varepsilon_r \rangle = \overline{\varepsilon}$  independent of r (steady state) so  $\tau(1) = 0$  and  $\zeta(\alpha + 3) = 1$ 

what is  $\alpha$ ?

Kolmogorov Obukhov (1941) hydrodynamic:  $\alpha = 0$ 

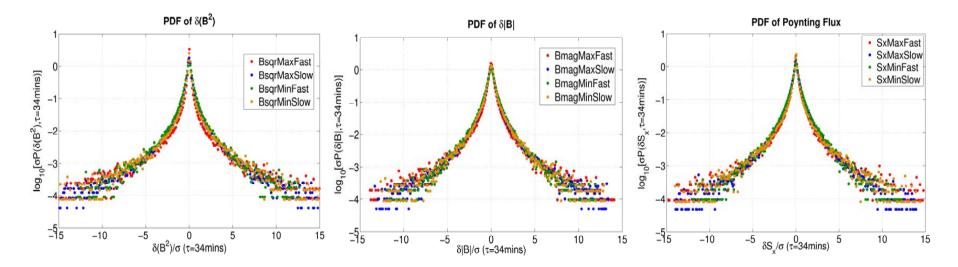
Irosnikov Kraichnan (1964) weak isotropic MHD  $\alpha=1$ ,

Goldreich Sridhar (1994-5) strong MHD  $\alpha_{\perp} = 0$ 

Boldyrev (2005) strong, background field anisotropic MHD  $\alpha_{\perp} = 1$ 



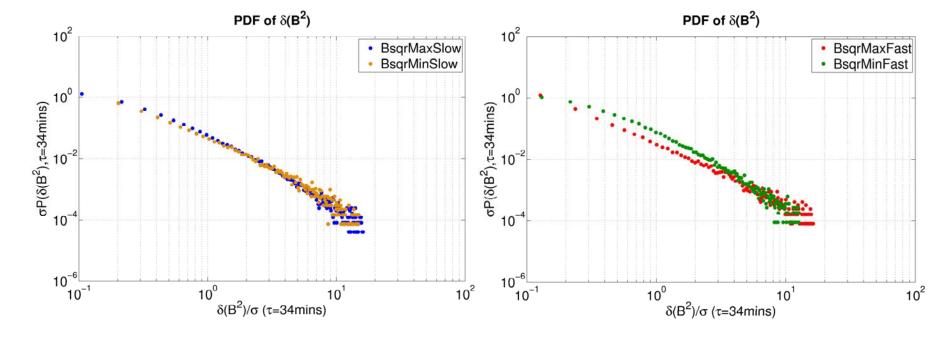




PDF functional form of fluctuations- require a more careful look..





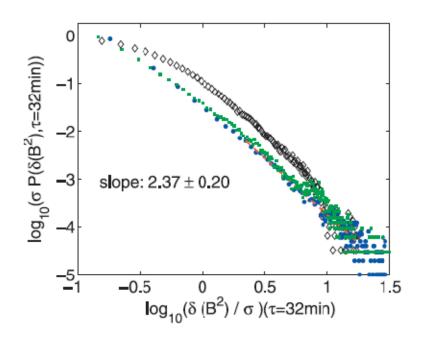


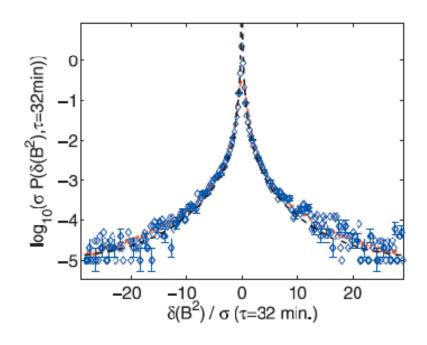
Fast and slow wind have different PDFs of fluctuations. For fast wind, these also vary with solar cycle.





### Left: B<sup>2</sup> fluctuation PDF solar max and solar min Right: solar max, FP and Lévy fit



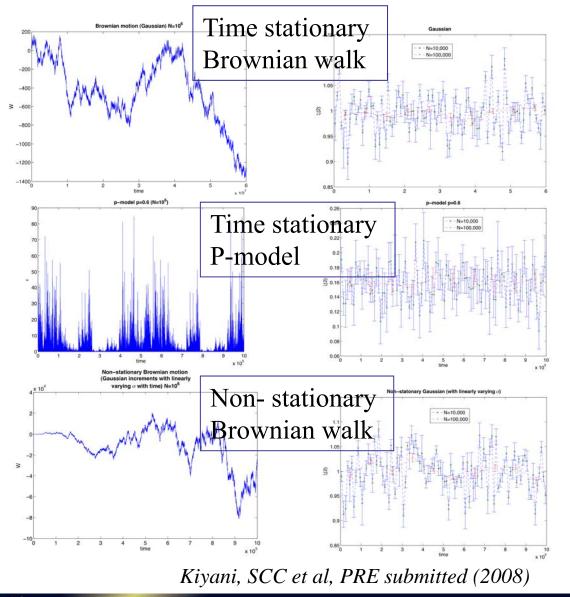


WIND 1996 min (⋄), 2000 max (∘), ACE 2000 max (□) *Hnat, SCC et al, GRL, (2007)* 





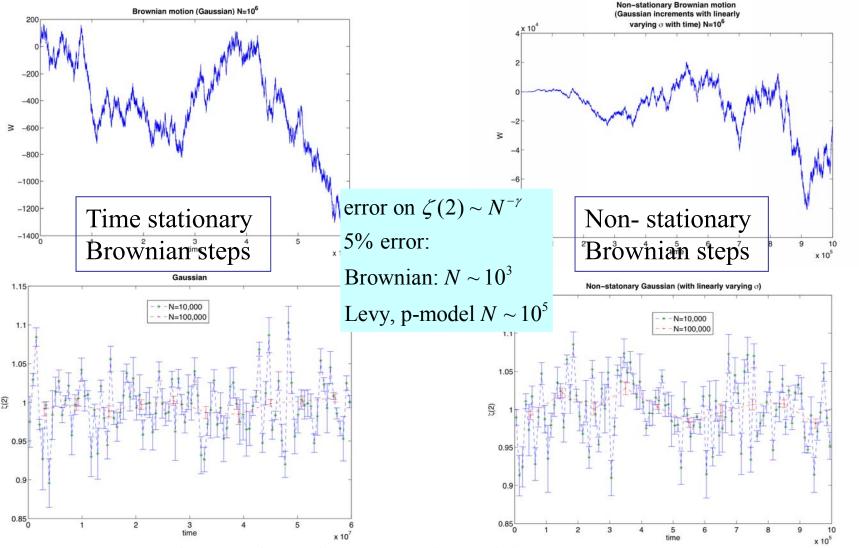
Finite sample effect- error on exponent  $\zeta(2)$  as a function of sample size N







#### Finite sample effect- error on exponent $\zeta(2)$ as a function of sample size N



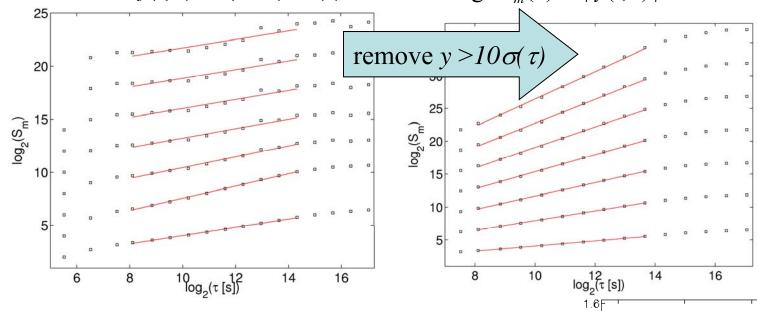
Kiyani, SCC et al, PRE submitted, 2008. See also Dudok De Wit, PRE, 2004





#### Structure functions- uncertainties (example - $\rho$ in slow solar wind)

$$y(t,\tau) = x(t+\tau) - x(t)$$
 test for scaling -  $S_m(\tau) = \langle |y(t,\tau)|^m \rangle \propto \tau^{\zeta(m)}$ 



2 sources of uncertainty in exponent

- 1) Fitting error of lines (error bar estimates)
- 2) Outliers- Shown: removed < 1% of the data ACE 98-01 (4years)-10<sup>6</sup> samples. Threshold 450 km/sec.

fractal or multifractal?

fractal (self- affine) 
$$\zeta(p) \sim \alpha p$$
  
multifractal  $\zeta(p) \sim \alpha p - \beta p^2 + ...$ 

a 20**o** 

€ 0.8

0.6

0.4

0.2

unconditioned

cf Fogedby et al PRE 'diffusion in a box'





Slow solar wind

# Dynamical model for self similar fluctuations

If the PDF of fluctuations  $y = x(t + \tau) - x(t)$  on timescale  $\tau$  is selfsimilar:

$$P(y,\tau) = \tau^{-\alpha} P_s(y\tau^{-\alpha})$$

P is then a solution of a Fokker- Planck equation:

$$\frac{\partial P}{\partial \tau} = \nabla [AP + B\nabla P]$$
, where transport coefficients  $A = A(y), B = B(y)$ 

with  $A \propto y^{1-1/\alpha}$ ,  $B \propto y^{2-1/\alpha}$  we solve the Fokker-Planck for  $P_s$ 

This corresponds to a Langevin equation: 
$$\frac{dx}{dt} = \beta(x) + \gamma(x)\xi(t)$$

and we can obtain  $\beta$ ,  $\gamma$  via the Fokker- Planck coefficients see Hnat, SCC et al. Phys. Rev. E (2003), Chapman et al, NPG (2005)



