

# PDF tails and self-organization of shear flows

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# Outline

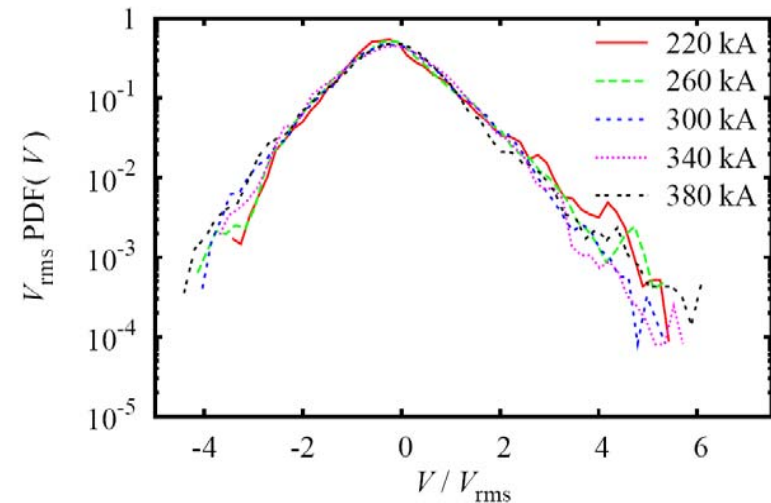
- Goals and motivation
- Probability distribution functions
- Previous results
- Instanton method
- Coherent structures
- Model equations + instanton solutions
- Model of shear flows
- Results and discussion

# Goals and motivation

- Goal: To find the generic analytical expression for the PDF tails.
- The tails are often qualitatively different from a Gaussian distribution. The method used is the so-called instanton method.
- Motivation: There are theoretical and experimental evidence that for understanding transport (involving many scales and amplitudes) a probabilistic description is needed.
- Intermittent systems are badly described by mean field theory and the turbulent transport coefficients are invalid.
- Note that the term "intermittent" will be used for all phenomena that exhibit strong non-linear features.

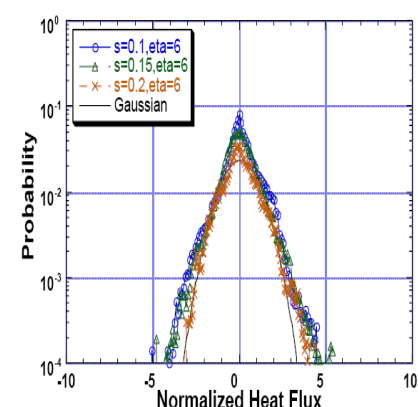
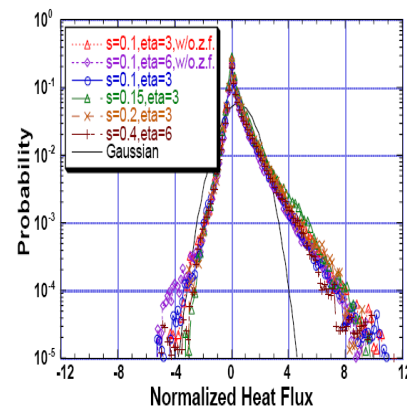
# Probability distribution function

- Near the center, the PDF is often close to Gaussian but reveals a significant deviation from Gaussianity at the tails (intermittency - the events contributing to the tails are strongly non-linear.).
- Rather than a transport coefficient, a flux PDF is required in order to substantively characterize the transport process.
- PDF tail – rare events, but large amplitude (e.g. large heat load on the wall.)

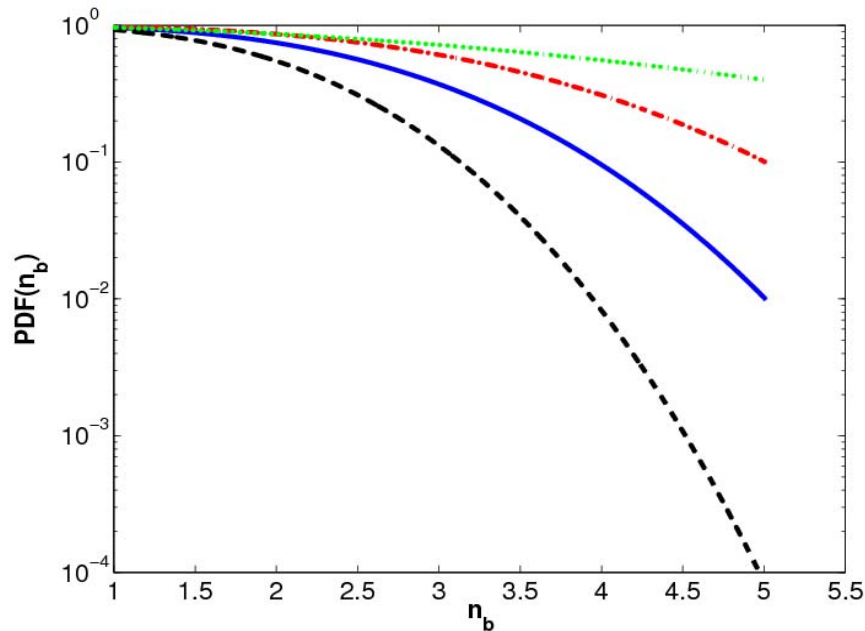


Radial velocity PDF measured at TCV, Garcia EPS2006

Turbulent plasma  $\eta_e = 3 - 6$   
 $s = 0.1 - 0.4$  Z.F. dominated plasma

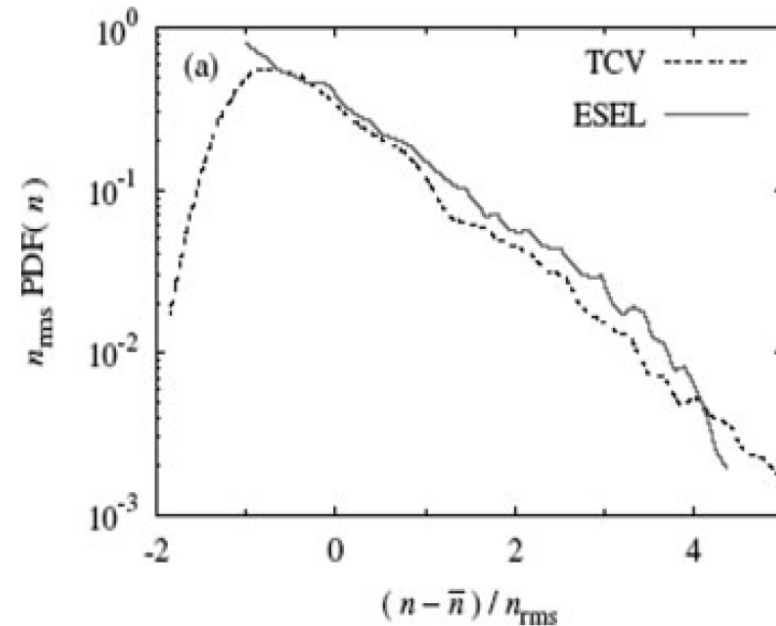


# Previous results – Blob density PDF



$$P(n) \propto e^{-cn^3}$$

$$c = \frac{4}{27\alpha^2}$$



$$\propto e^{-cn^\Gamma}$$

$$\frac{1}{\alpha^2} = 1.5 \pm 0.5 \quad \Gamma = 2.5 - 4.0$$

Anderson et al PoP **15** 122303 (2008)

# A coupled drift-wave zonal flow system

Anderson et al submitted to NF 2008

A coupled system of drift waves  $\phi_1$  and zonal flows  $\phi_0$  ( $\xi$  is the X-coordinate and  $\zeta$  is the time-coordinate).

$$C_1 \frac{\partial \tilde{\phi}_1}{\partial \zeta} + iC_2 \frac{\partial^2 \tilde{\phi}_1}{\partial \xi^2} + C_3 \tilde{\phi}_0 \tilde{\phi}_1 = -i\nu C_4 \tilde{\phi}_1 + f$$

$$D_1 \frac{\partial \bar{\phi}_0}{\partial \zeta} + D_2 \frac{\partial \tilde{\phi}_0}{\partial \xi} = D_3 \frac{\partial |\tilde{\phi}_1|^2}{\partial \xi}$$

PDF tails of ZF formation

$$P(\phi_0) \propto e^{-c\phi_0^3}$$

PDF tails of Momentum flux

$$P(R) \propto e^{-cR^2}$$

Without the influence of ZF the PDF tails of momentum flux is  $\propto e^{-cR^{3/2}}$   
Also found experimentally in CSDX by Z. Yan APS2007

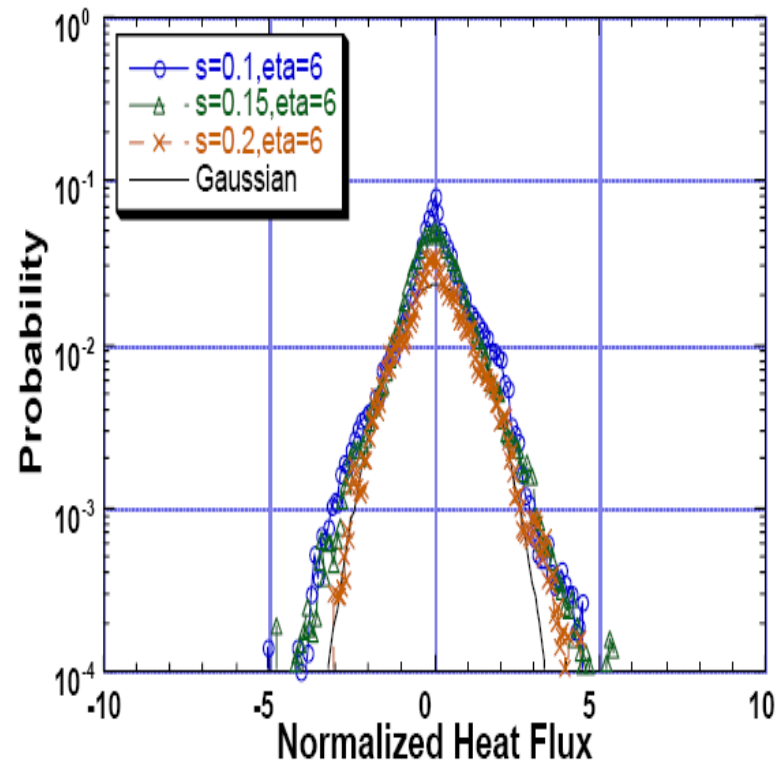
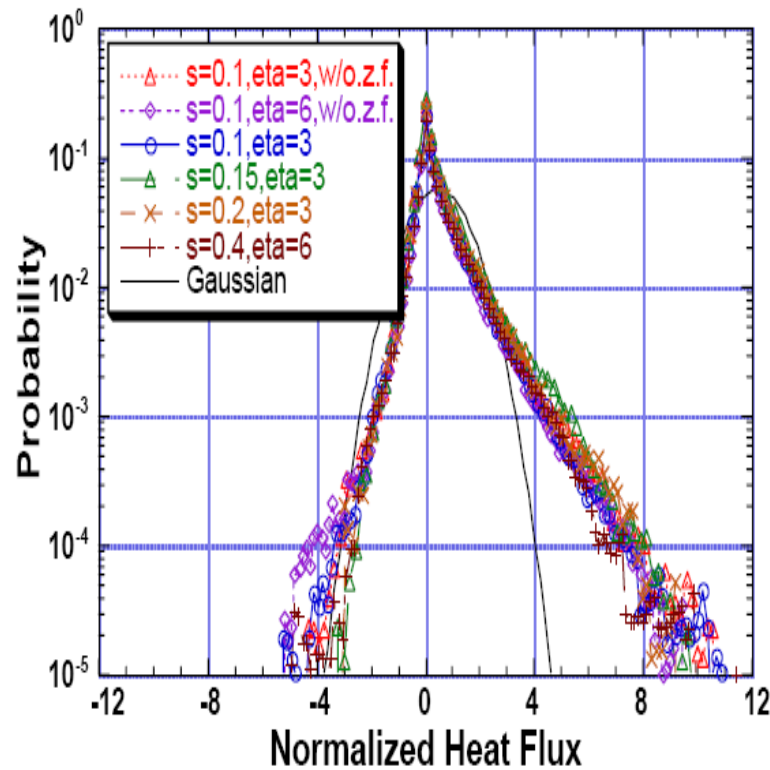
# PDFs of fluctuations vs ZF dominated plasma

Turbulent plasma

$$\eta_e = 3 - 6$$

$$s = 0.1 - 0.4$$

Z.F. dominated plasma

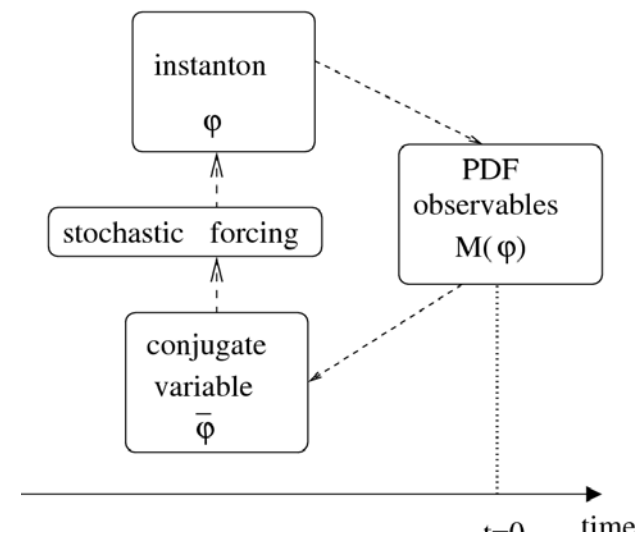
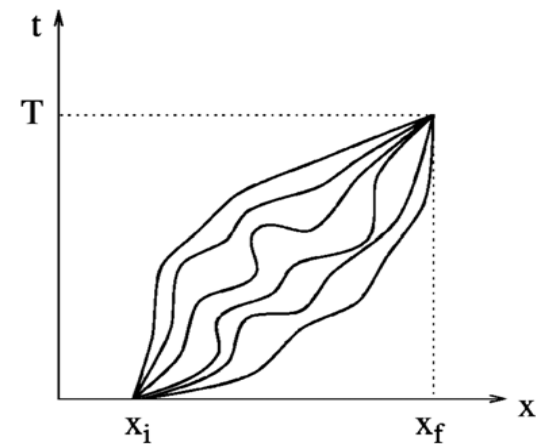


Matsumoto, USJP Workshop 2007

# Instanton method

Kim and Anderson PoP in press (2008)

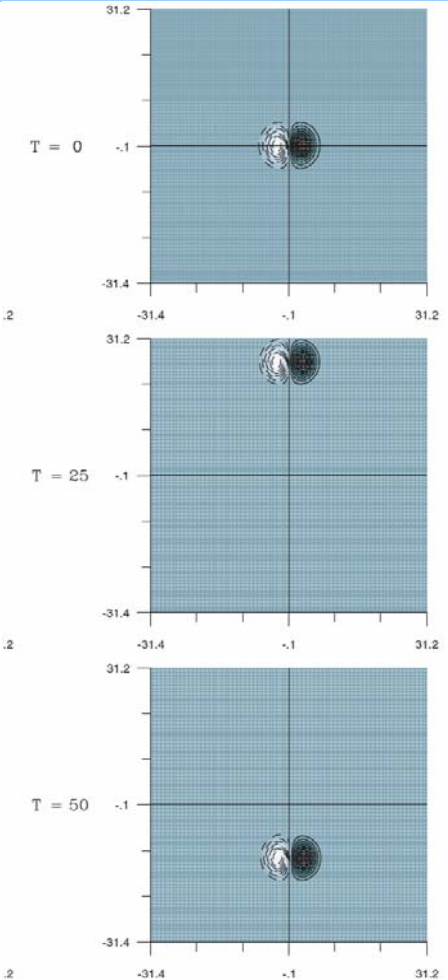
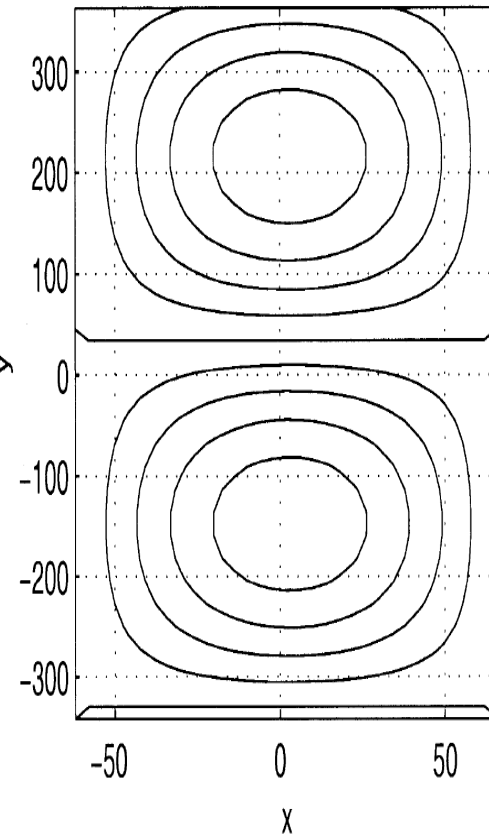
- The instanton method is a non-perturbative way of calculating the Probability Distribution Function tails.
- The PDF tail is viewed as the transition amplitude from a state with no fluid motion to a final state governed by the coherent structure.
- The creation of the coherent structure is associated with the bursty event.
- The optimum path is found by using the saddle-point method.





# Coherent structures

- Coherent structures are major players in transport dynamics through the formation of avalanche-like events with large amplitude.
- There are several examples of coherent structures (c.f. modon or bipolar vortex soliton) to the non-linear governing equations.
- Strong theoretical evidence that a probabilistic formulation is needed to characterize the problem.



Left: Dastgeer IEEE TPS 2003, Right: Waelbroeck et al PPCF 46 1331 (2004)

# Model Equations

Time evolution of the potential is governed by an N order Interaction term.

$$\frac{\partial \phi}{\partial t} + N(\phi) = f \quad N(\phi) \propto \phi^n$$

The forcing is assumed to be Gaussian with a short correlation time:

$$\langle f(x, t) f(x', t') \rangle = \delta(t - t') \kappa(x - x')$$

$$\langle f \rangle = 0$$

# The model for calculating the PDF tails

The PDF of the  $m^{\text{th}}$  moment can be defined as:

$$P(R) = \langle \delta(\langle v_x v_y \rangle - R) \rangle = \int d\lambda e^{i\lambda R} \langle -i\lambda v_x v_y \rangle = \int d\lambda e^{i\lambda R} I_\lambda$$

The integrand can be re-written as a path-integral:

$$I_\lambda = \int D\phi D\bar{\phi} e^{-S_\lambda}$$

Here, the effective action can be written:

$$\begin{aligned} S_\lambda = & -i \int dx dt \bar{\phi} \left( \frac{\partial \phi}{\partial t} + N(\phi) \right) \\ & + \frac{1}{2} \int dx dx' dt \bar{\phi}(x) \kappa(x - x') \bar{\phi}(x') \\ & + i\lambda \int dx dt M(\phi) \delta(t) \delta(x - x_0) \end{aligned} \quad M(\phi) \propto \phi^m$$

The forcing  $\kappa$  is a Gaussian with a delta-correlation in time.

# Instanton (saddle-point) solutions

- The path-integral will be solved using a saddle point method.
- Assuming that the coherent structure has a spatial profile  $\phi_0(x)$  and a temporal evolution  $F(t)$  and similarly for the conjugate variable.

$$\phi(x, t) = \phi_0(x)F(t)$$

$$\bar{\phi}(x, t) = \bar{\phi}_0(x)\mu(t)$$

The action can be recast as:

$$\begin{aligned} S_\lambda = & -i \int dt \mu c_1 (\dot{F} + c_2 F^2) \\ & + \frac{1}{2} \int dt \mu^2 c_1 c_3 \\ & + i\lambda \int dt F^m \delta(t) c_1 c_4 \end{aligned}$$

Constants  $c$  are projections on the conjugate structures

$$c_1 = \int dx \bar{\phi}_0(x) \phi_0(x)$$

$$c_1 c_2 = \int dx \bar{\phi}_0(x) \phi_0^n(x)$$

$$c_1 c_3 = \int dx dy \bar{\phi}_0(x) \kappa(x-y) \phi_0(y)$$

$$c_1 c_4 = \int dx \phi_0^m(x) \delta(x-x_0)$$

# Steepest descent method or saddle point integral

Assume the function  $f$  has a unique global maximum at  $x_0$

$$\int dx e^{Mf} \approx e^{Mf(x_0)} \int e^{-M|f''(x_0)|(x-x_0)^2/2} dx = \sqrt{\frac{2\pi}{M|f''(x_0)|}} e^{Mf(x_0)} \quad \text{As } M \rightarrow \infty$$

In the case of the path-integral we have a similar situation, however instead of stationary points we must look for functions that optimize the action.

Consider the functional derivatives:

$$\frac{\delta S_\lambda}{\delta F} = 0 \quad \frac{\delta S_\lambda}{\delta \mu} = 0$$

This gives us two equations in  $F$  and  $\mu$ , respectively

$$\dot{F} + c_2 F^n = -ic_3 \mu$$

$$\dot{\mu} - nc_2 F^{n-1} \mu = -\lambda c_4 m F^{m-1} \delta(t)$$

$$F(-\infty) = 0 \text{ and} \\ \mu(t > 0) = 0$$

# Instanton solutions

We find the solution:

$$F^{-n+1} = F_0^{-n+1} + c_2(-n+1)t$$

$$F_0^{n-m+1} = q\lambda$$

To calculate the path-integral we now have to evaluate the saddle point action (input the solution above into the action).

$$\begin{aligned} S_\lambda &= -i \int dt \mu c_1 (\dot{F} + c_2 F^n) + \frac{1}{2} \int dt \mu^2 c_1 c_3 \\ &\quad + i\lambda \int dx dt F^m \delta(t) c_1 c_4 \\ &= \int dt c_1 (\dot{F} + c_2 F^n)^2 + i\lambda F_0^m c_1 c_4 \\ &= Q \lambda^{(n+1)/(n-m+1)} \end{aligned}$$

# The PDF tails + Corrections

To determine the PDF tails we have to evaluate the  $\lambda$  integral:

$$P(\xi) = \int d\lambda e^{-\lambda\xi + Q\lambda^{(n+1)/(n-m+1)}} \quad \text{put} \quad f(\lambda) = -\lambda\xi + Q\lambda^{(n+1)/(n-m+1)}$$

And find the saddle point:

$$f'(\lambda_0) = 0 \quad \lambda_0 = \left( \frac{\xi (n - m + 1)}{Q (n + 1)} \right)^{(n - m + 1) / (n + 1)}$$

This gives the PDF tails as:

$$P(\xi) \propto \xi^{(n+1-2m)/(2m)} e^{-c\xi^{(n+1)/m}}$$

The first factor comes from the Gaussian integral correction in the steepest descent method.

# PDF tail of a general moment

The PDF tails of moment ( $m$ ) and with the order of the highest non-linear interaction term ( $n$ )

$$P(Z) \propto \exp(-\xi Z^s) \quad s = \frac{n+1}{m}$$

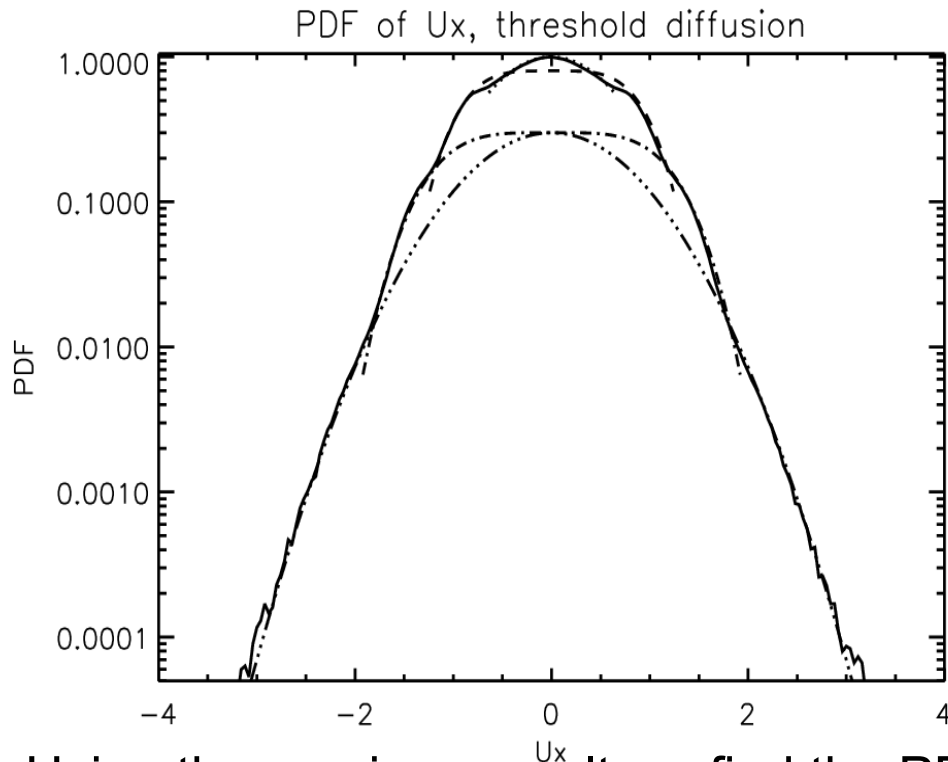
Examples:

1. Linear system with PDF tails of first moment – Gaussian  $s=2$ .
2. Linear system with PDF tails of flux ( $n*v$ ) –  $s=1$
3. Hasegawa–Mima system with PDF tails of momentum flux –  $s=3/2$

The PDFs tails can be calculated provided that the integral mean value over the considered coherent structure is non-zero. A coherent structure For the HM system is the modon. The mean value of Reynolds stress over this structure is zero. This is solved by having several coupled modons.



# Threshold diffusion



A forced model of shear flow that  
 Been used for a wide range of  
 phenomena (solar/atmospheric)

$$\frac{\partial u_x}{\partial t} = \frac{\partial^2}{\partial x^2} (D(u)u_x) + f$$

$$D(u) = \nu + \beta u_x^2$$

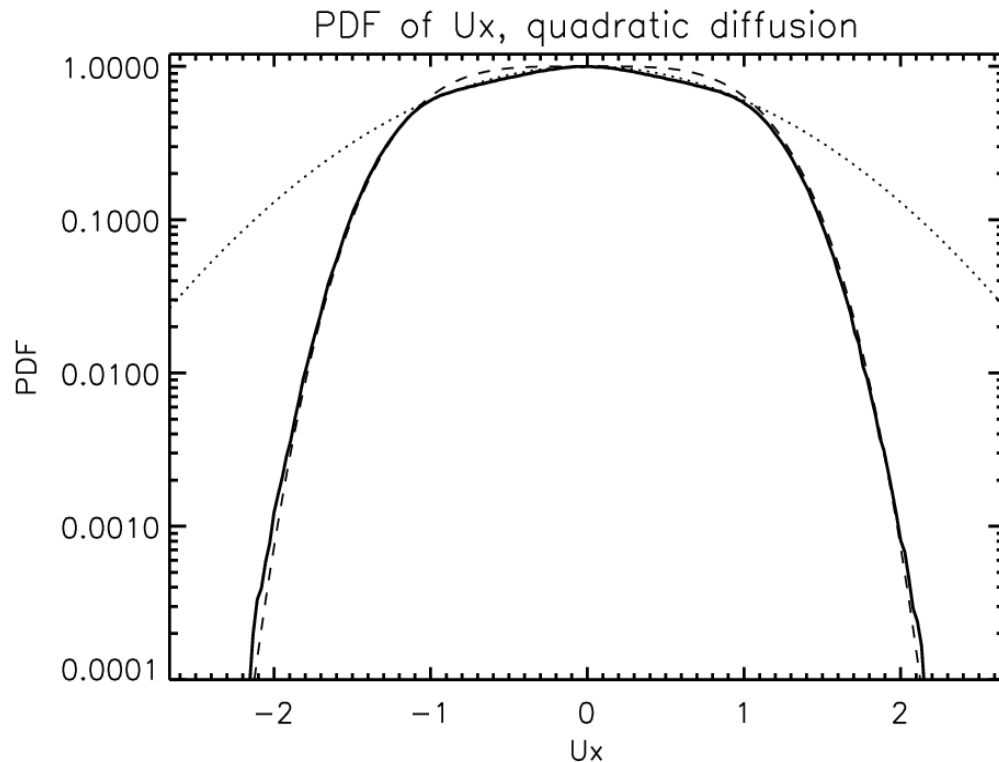
HL Liu J. Atmos. Sci., 64, 579-593, 2007.

Using the previous result we find the PDF:  $P(\xi) \propto e^{-cU_x^4}$

A comparison of numerical calculations and the estimated PDFs. In the numerical calculations a Gaussian forcing is used. First an extreme case: Apply forcing only when  $|u_x| < u_{xc}$  to allow for relaxation is faster than the disturbance. Result PDF mainly Gaussian!

# Quadratic diffusion

Submitted to PRL 2008



Solid line: Non-linear numerical calculation.

Dotted line: Gaussian fit

Dashed line: A fit to the PDF.

$$P(\xi) \propto e^{-cU_x^4}$$

The same PDF may be found  
Using the Fokker-Planck  
PDF equation.

Close to 0 the PDF is close to Gaussian whereas the tails are strongly intermittent.

There is a cross-over between occurs roughly at the expected critical gradient  $u_{xc} \cong \text{sqrt}(v/\beta) = 0.98$ .

# Future work

- Work out corrections to some specific physical equations (HM, Burgers etc)
- PDF tails in an electromagnetic model.
- Self consistent forcing. No external forcing instead use the linear instability as the driving force.
- PDF tails of multi-structures and multi-instantons.
- PDF tail for L-H transition.

# Summary

- We have found the PDF tails for general  $n$  (degree of the highest non-linear term) and  $m$  (moment) as well as subleading corrections coming from the saddle point method.
- By calculating PDFs we may easily discriminate between models and experiments. We need only to know the slope in the log-log plot.
- We have presented a statistical theory of self-organisation of shear flows by a simplified non-linear diffusion model for the shear flow.
- We have compared the PDF tails from numerical calculations and two analytical methods and found very good agreement.

# References

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- **J. Anderson** and E. Kim, Analytical theory of probability distribution function of structure formation, Physics of Plasmas **15** 082312 (2008) ([arXiv:0901.2239v1](#) [physics.plasm-ph])
- **J. Anderson** and E. Kim, The momentum flux probability distribution function for ion-temperature-gradient turbulence, Physics of Plasmas **15**, 052306 (2008) ([arXiv:0901.2235v1](#) [physics.plasm-ph])