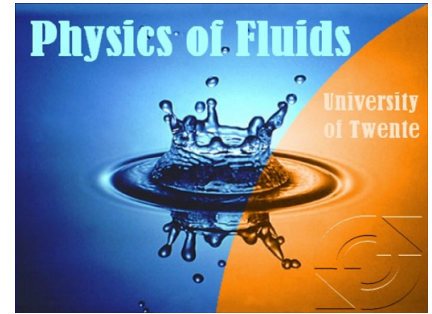
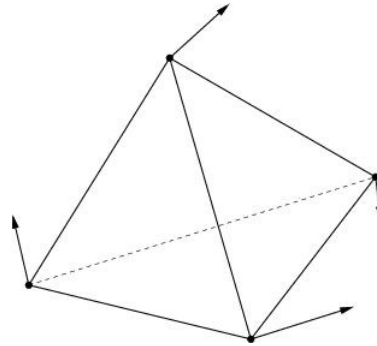




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Geometry and statistics in fully developed turbulence



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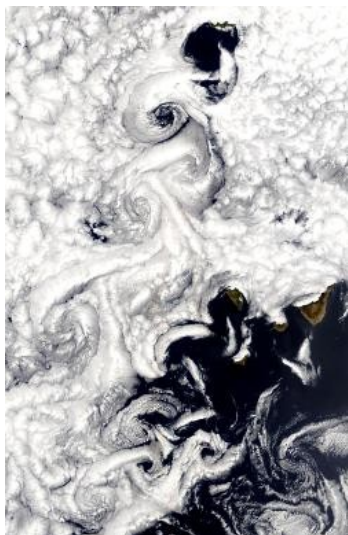
Alain Pumir, CNRS & Université de Nice, France

Michael Chertkov, Theoretical Division, Los Alamos National Laboratory, USA

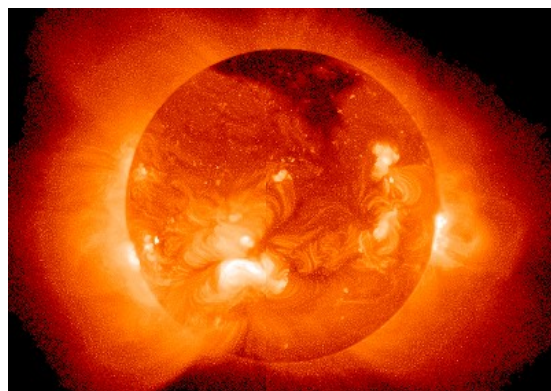
★ A fluid flow becomes turbulent when the **source of energy** which excites the motions in the fluid is sufficiently **intense** compared to the viscous resistance of the fluid.

★ Turbulence is characterized by very **disordered motions** leading to a very **important mixing** of the fluid.

★ Turbulence is ubiquitous:



(NASA)



(SOHO)



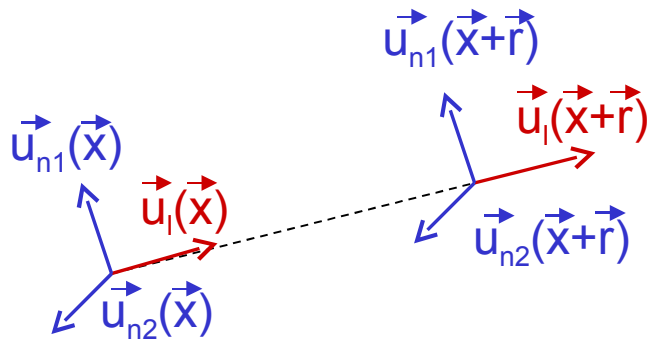
(NASA)

Roughly speaking, most investigations of turbulence consider separately either of the two aspects :

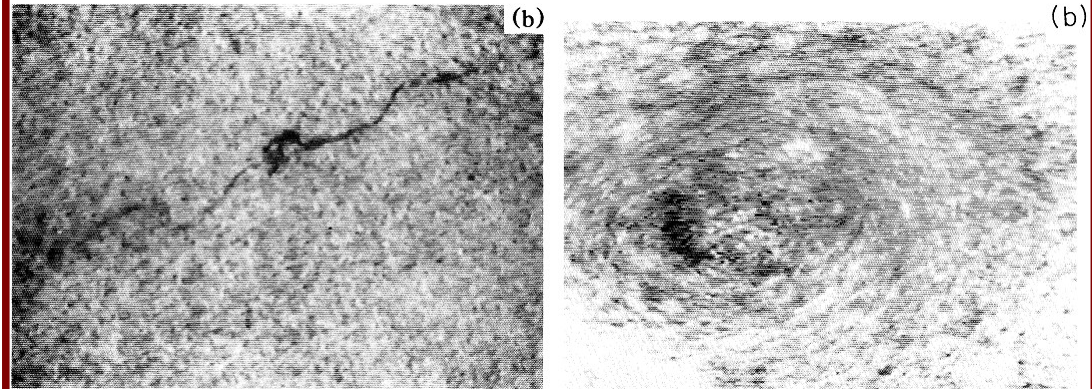
structure functions

$$S_n(r) = \langle (u_l(\vec{x} + \vec{r}) - u_l(\vec{x}))^n \rangle$$

and their dependence with respect to the scale r



the local structure (or geometry) of intermittent regions of the flow (vorticity filaments, ...)



Douady, Couder and Brachet, PRL 91

→ Aim here: capture both aspects, by investigating **multipoint correlation functions**.

Objective of the work:

Develop a theoretical understanding and a description of the fluctuating velocity field that captures both the **scaling** and **structural aspects** of the flow.

★ Idea: describe the **velocity gradient tensor**:

$$m_{ab} = \partial_a u_b$$

or its **coarse-grained** generalization:

$$M_{ab} = \frac{1}{V} \int d\vec{r} \partial_a u_b(\vec{r}) \quad \ll \text{coarse-grained} \gg$$

Statistics as a
function of **r**

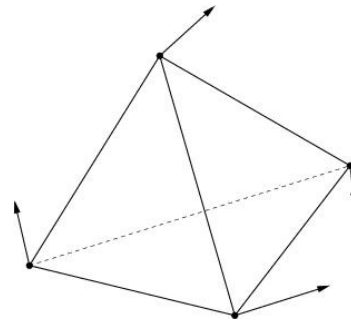
Topology:

$$\omega_i = \varepsilon_{ijk} m_{jk}$$

$$S = \frac{1}{2} (m + m^t)$$

★ **Lagrangian concepts** have shown recently to be extremely useful, in particular to the passive scalar problem (see Shraiman and Siggia, 2000, and Falkovich, Gawedzki and Vergassola, 2001).

★ **Extension to the problem of the velocity field**: follow 4-points - a tetrahedron- (or more) to construct the finite difference approximation of the velocity derivative tensor M .



→ « **tetrad model** »

★ This phenomenological model describes the dynamics of:

■ M : coarse-grained (filtered) **velocity gradient** tensor

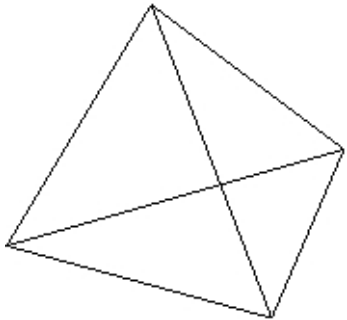
■ g : **moment of inertia** tensor (geometrical deformation of the tetrad)

Ref.: M. Chertkov, A. Pumir and B.I. Shraiman, Phys. Fluids **11**, 2394 (1999).

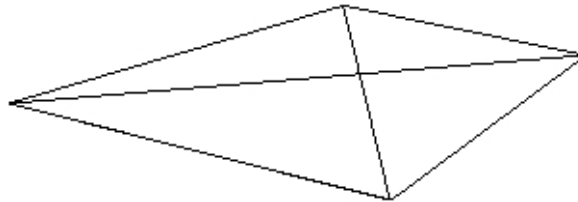
g: moment of inertia tensor

★ The eigenvalues of g give information about the **shape** of the volume:

$$g_1 \approx g_2 \approx g_3:$$



$$g_1 \approx g_2 \gg g_3:$$



$$g_1 \gg g_2 \approx g_3:$$



★ and about its **size**:

$$\text{Tr}(g) = g_1 + g_2 + g_3 = r^2$$

- **Purpose of the work here:** the evolution of the tetrahedron and of M can be modelled in terms of a system of **stochastic differential equations** (Chertkov et al, 1999).

Study this system of stochastic differential equations.

★ Potential pay-offs of this approach:

- get insight into the **energy transfer processes** between scale (Pumir, Shraiman and Chertkov, 2001)
- potentially, particle-based **Large-Eddy Simulation schemes** (Pumir and Shraiman, 2003)
- possible applications to **different kinds** of turbulent flows
- **new way of thinking** about the issue of turbulence (Chevillard and Meneveau, 2006)

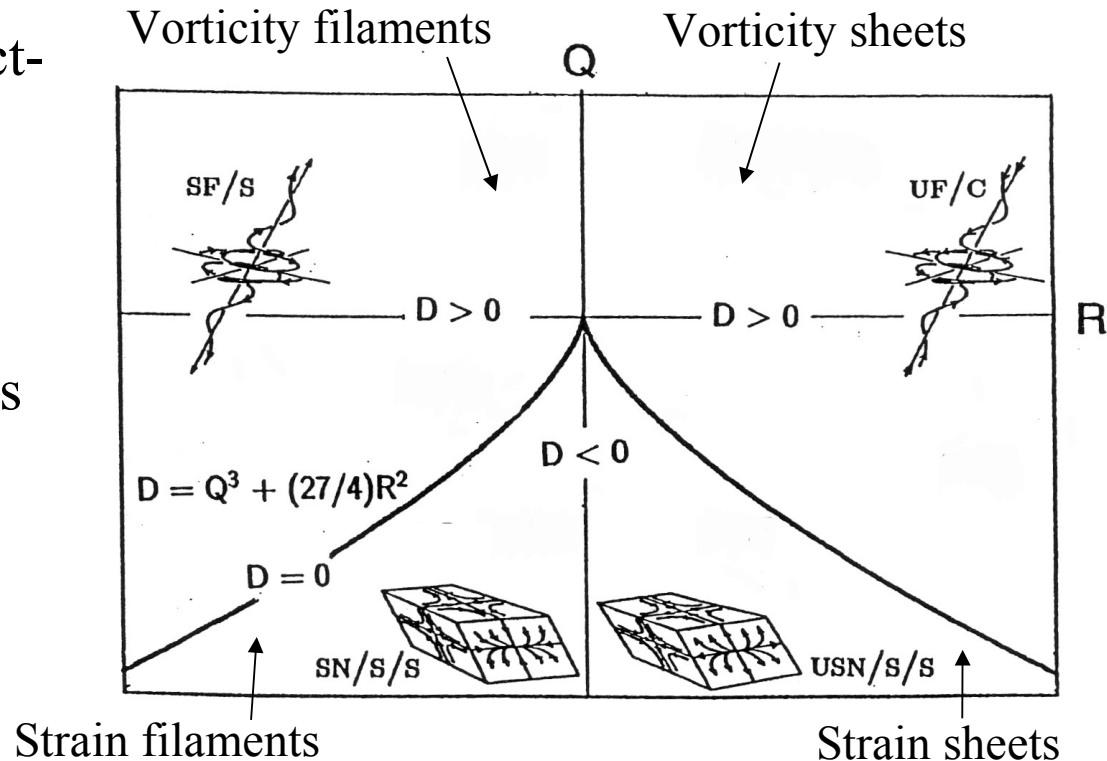
M as a diagnostics of flow topology

★ The eigenvalues of M characterize the **local topology** of the flow (at the considered scale)

★ They depend on 2 parameters only (Cayley-Hamilton):

$$Q = -\frac{1}{2} \text{Tr}M^2$$

$$R = -\frac{1}{3} \text{Tr}M^3$$



Interesting flow diagnostics: calculate **as a function of scale** the **joint probability distributions** of Q and R, as well as **densities of dynamical quantities** in the (R, Q) plane.

Outline of the presentation

- Derivation and definition of the « tetrad model »
- Semiclassical method of resolution of the system
- Semiclassical solutions with isotropic forcing
- Semiclassical solutions with large scale shear
- Recent developments
- Conclusion and outlook

1. Derivation and definition of the model

(3D, incompressible,
homogeneous, stationary turbulence)

★ Write the Navier-Stokes equation for the velocity gradient tensor $m = \partial v$:

$$\frac{dm_{ab}}{dt} + m_{ab}^2 = -\partial_{ab} p + \text{viscosity} + \text{forcing}$$

Closing issue: **pressure Hessian**

★ Isotropic approximation (**Restricted Euler dynamics**)
(Vieillefosse, Cantwell):

$$\partial_{ab} p = -\frac{1}{3} \text{Tr}(m^2) \delta_{ab}$$

The resulting system can be completely solved, with the help of the invariants Q and R ($Q = -\frac{1}{2} \text{Tr}(m^2)$; $R = -\frac{1}{3} \text{Tr}(m^3)$)

→ **finite time singularity !**

To go beyond the Vieillefosse singularity, one needs to introduce the geometry of the Lagrangian set of points.

Equation for the geometry, derived from:

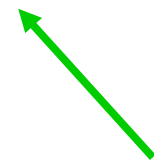
$$\frac{d\rho}{dt} = v = \rho M + \xi \quad \left\{ \begin{array}{l} \rho M : \text{coherent component of the velocity (k} \sim 1/R) \\ \xi : \text{fluctuating component (k} \gg 1/R) \end{array} \right.$$

$$\text{or} \quad \left| \begin{array}{l} \vec{\rho}_1 = (\vec{r}_1 - \vec{r}_2) / \sqrt{2} \\ \vec{\rho}_2 = (\vec{r}_1 + \vec{r}_2 - 2\vec{r}_3) / \sqrt{6} \\ \vec{\rho}_3 = (\vec{r}_1 + \vec{r}_2 + \vec{r}_3 - 3\vec{r}_4) / \sqrt{12} \end{array} \right. \quad \text{and} \quad \rho_i^a = (\vec{\rho}_i)_a$$

Introduce the **moment of inertia tensor**: $g = \rho^t \rho$

★ Equation for the coarse-grained velocity gradient tensor
 (obtained from an approximation of the pressure Hessian,
 based on analytical and numerical results):

$$\frac{dM}{dt} + \left(M^2 - \Pi \text{Tr} M^2 \right) = \alpha \left(M^2 - \Pi \text{Tr} M^2 \right) + \eta$$



local component of the pressure

$$\left(\Pi = \frac{g^{-1}}{\text{Tr} g^{-1}} \right)$$

nonlocal part of the pressure
 (analytical + numerical evidence)
 → reduction of the nonlinearity

fluctuating component

★ Reduction of the nonlinearity through the pressure Hessian:
 the importance of this effect is measured by α .

★ One finally obtains the following system of stochastic differential equations:

$$\left\{ \begin{array}{l} \frac{dM}{dt} + (1 - \alpha)(M^2 - \Pi \text{Tr}M^2) = \eta \\ \frac{dg}{dt} - gM - M^t g - \beta \sqrt{\text{Tr}(MM^t)}(g - \text{Tr}(g)Id) = 0 \end{array} \right. \quad \Pi = \frac{g^{-1}}{\text{Tr}(g^{-1})}$$

★ One assumes that the major effect of the noise acting on g is to (essentially) **prevent the growth of anisotropy** of the tetrad.

★ η is modelled by a **Gaussian white** noise term, obeying **K41 scaling** ($\rho^2 = \text{Tr}(g)$):

$$\langle \eta_{ab}(\rho; t) \cdot \eta_{cd}(0; 0) \rangle = \gamma \left(\delta_{ac} \delta_{bd} - \frac{1}{3} \delta_{ab} \delta_{cd} \right) \frac{\varepsilon}{\rho^2} \delta(t)$$

Summary: the problem reduces to a set of stochastic differential equations, with 3 dimensionless parameters:

- 'reduction of nonlinearity' by pressure: α
- intensity of fluctuations in the g-equation that tend to isotropize g: β
- intensity of fluctuations in the M-equation: γ

Energy balance

★ Define the energy at scale ρ by $E = Tr(VV^t) / 2$ with
 $V_i^a = \rho_i^b M_{ba}$

Equation of evolution of the energy:

$$\partial_t E(\rho) = - \frac{\partial}{\partial \rho_i^a} \langle V_i^a Tr(VV^t) \rangle_\rho + \alpha \langle Tr(VV^t M) \rangle_\rho + \text{coupling with the small scales}$$

★ **Physical interpretation:**

✚ $-\frac{\partial}{\partial \rho_i^a} \langle V_i^a Tr(VV^t) \rangle_\rho$: large scale energy flux

✚ $\alpha \langle Tr(VV^t M) \rangle_\rho$: eddy damping term

(see Borue and Orszag, 1998, Meneveau and Katz, 2000, ...)

The model should provide a way to compute the **statistical properties** of the M tensor as a **function of scale** !

What is the **qualitative behavior** of the solutions of this system of equations ?

n.b. : it depends on three dimensionless parameters, **α** , **β** , **γ** .

2. Resolution of the system in the semiclassical approximation

The equation satisfied by the Eulerian PDF ...

★ A Fokker-Planck equation for the Eulerian PDF can be derived from this stochastic system:

$$\partial_t P(M, g, t) = L P(M, g, t)$$

★ The stationary solutions must satisfy the system:

- * $LP = 0$

- * $\int dM P(M, g) = 1$

- * $P(M, g = L^2 Id) \sim \exp\left[-\frac{\text{Tr}(MM^t)}{(\varepsilon L^{-2})^{2/3}}\right]$ (Gaussian distribution at the integral scale)

... and its solution in terms of path integral:

This system can be solved by using Green's functions method:

$$P(M, g) = \int dM' \int dT G_{-T}(M; g | M'; g') P(M', g')$$

(G : Green function) (boundary condition)

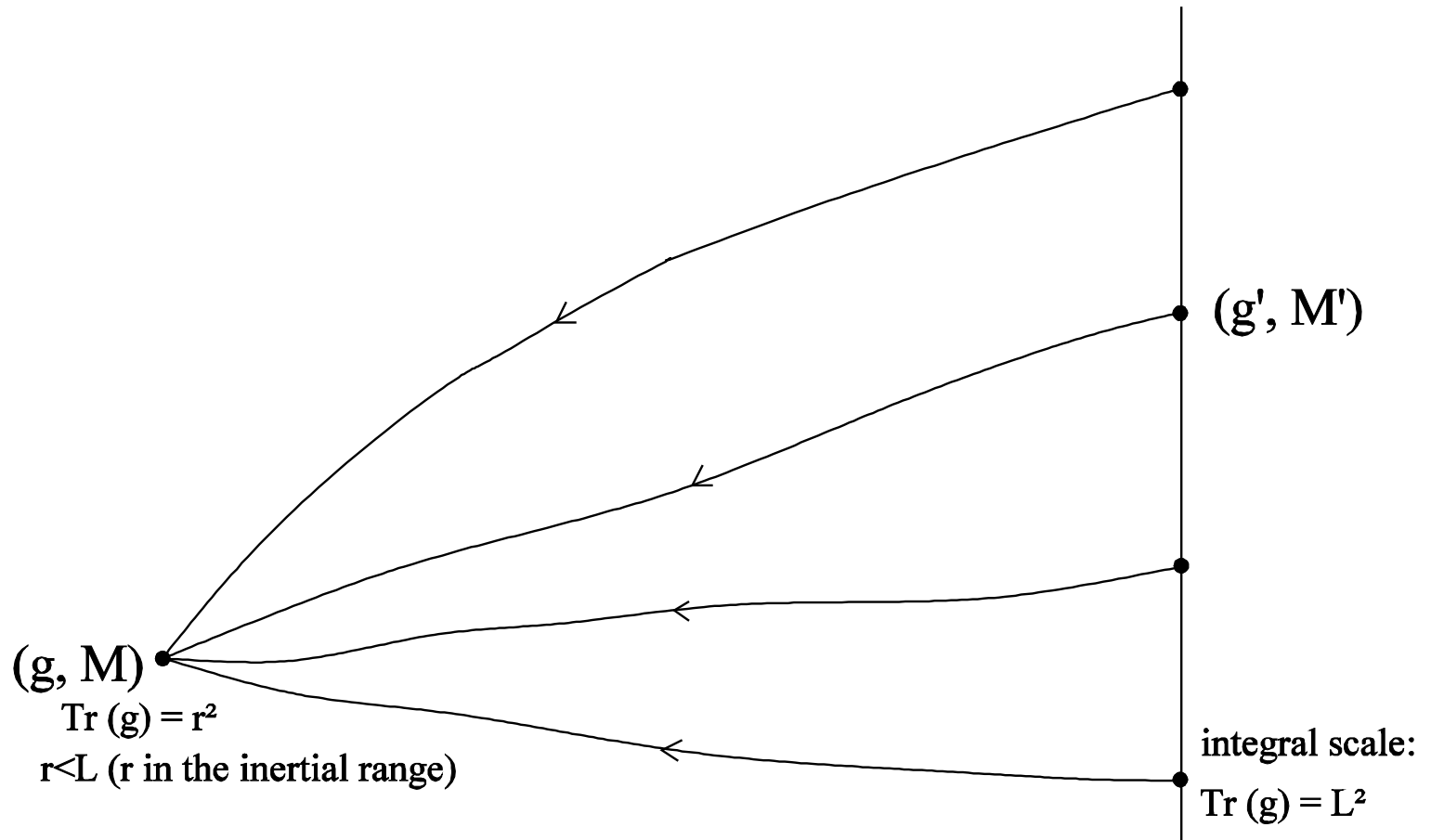
With:

$$G_{-T}(M; g | M'; g') = \int [DM''] \int [Dg''] \exp[-S(M''; g'')]$$

Hence:

$$P(M, g) = \int dM' \int dT \int [DM''] \int [Dg''] \exp - \left[S(M''; g'') + Tr(M' M'^t) / (\epsilon L^{-2})^{2/3} \right]$$

(Green function) (boundary condition)



Starting from an initial condition at the integral scale, one integrates the system until a fixed scale r (in the inertial range). It is in principle necessary to take into account all these trajectories in phase space.

(Approximate) methods of resolution:

- We could use a straightforward **Monte-Carlo method** (in principle, exact)

Difficulty: * This method is relatively inefficient because configurations have statistical weights which vary by (many) orders of magnitude.

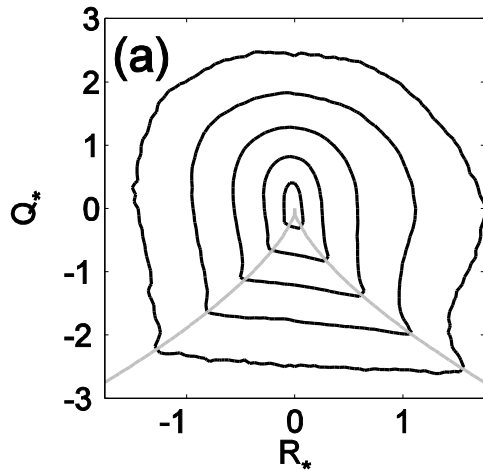
- * It is therefore hard to obtain reliable results, particularly at small scales.

- Or look for the solutions in the **deterministic approximation** ($\gamma=0$)

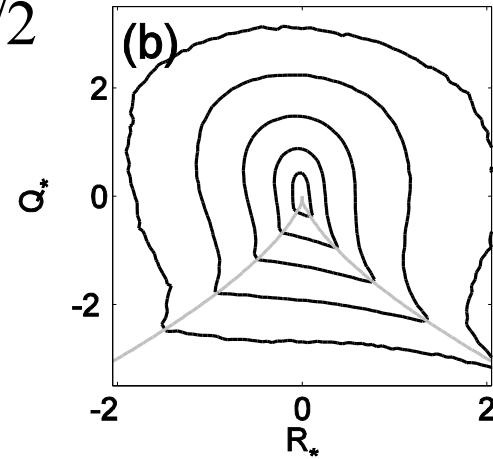
→ encouraging results when compared with DNS
(see Chertkov et al, 1999)

Evolution of $P(R, Q)$ as a function of scale:
solutions calculated by **DNS** ($R_\lambda = 130; 256^3$)

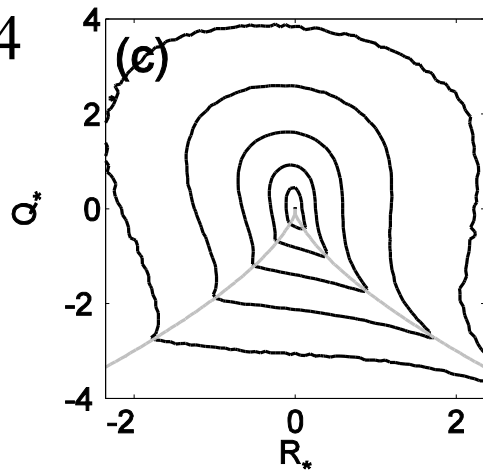
$r/L = 1$



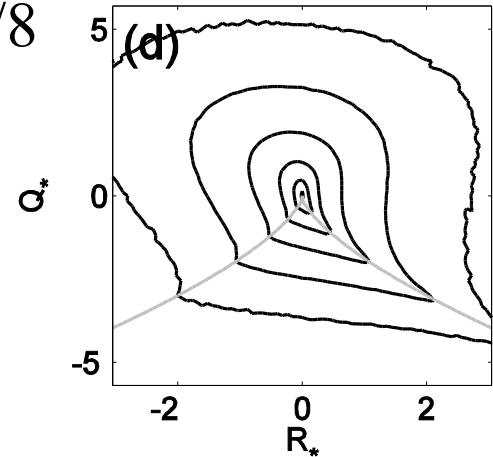
$r/L = 1/2$



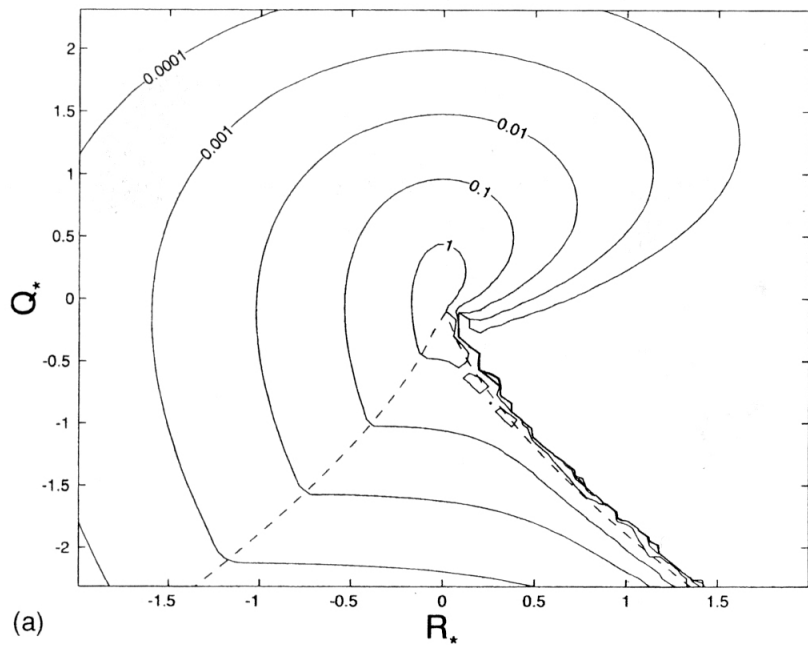
$r/L = 1/4$



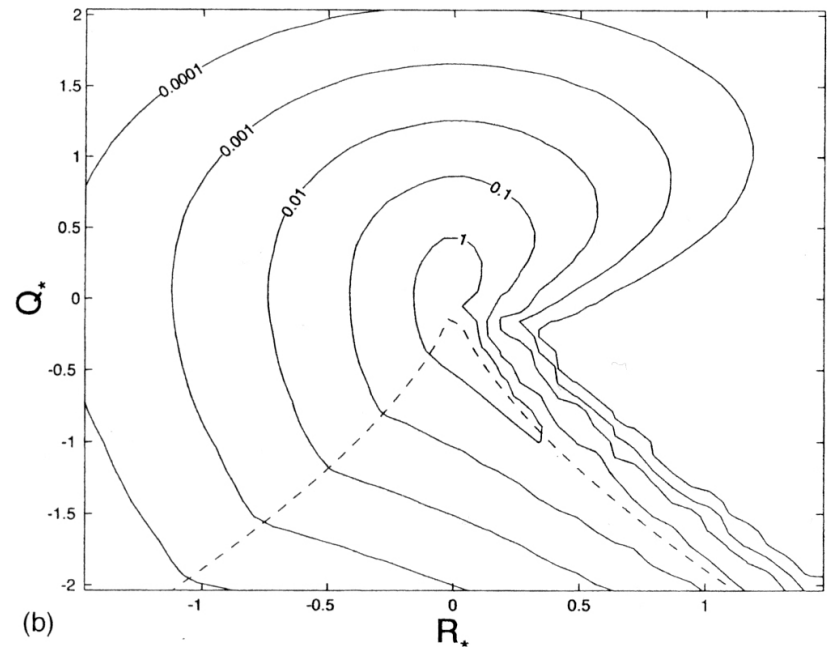
$r/L = 1/8$



$P(R, Q)$ solutions of the model in the **deterministic approximation**



(a) $r = L/5$



(b) $r = L/2$

(Chertkov *et al*, 1999)

★ One rather uses the **semiclassical approximation** (saddle approximation on the path integral).

◆ **Method:** one considers only the trajectory for which the **action** is **minimal** (the one with the largest statistical weight).

◆ **Aim:** This method should provide **important information**, especially since many trajectories do not contribute much.

◆ The method is **not rigorous**; it is difficult to control the errors made

⇒ A better algorithm has to be implemented to understand the effect of fluctuations (**~Monte-Carlo**), and to really estimate the errors made by using the semi-classical approximation.

3. Numerical solutions of the system
in the semiclassical approximation
with isotropic forcing

-

Comparison with experimental
and DNS data

A. Naso and A. Pumir, Phys. Rev. E **72**, 056318 (2005)

Model's prediction:

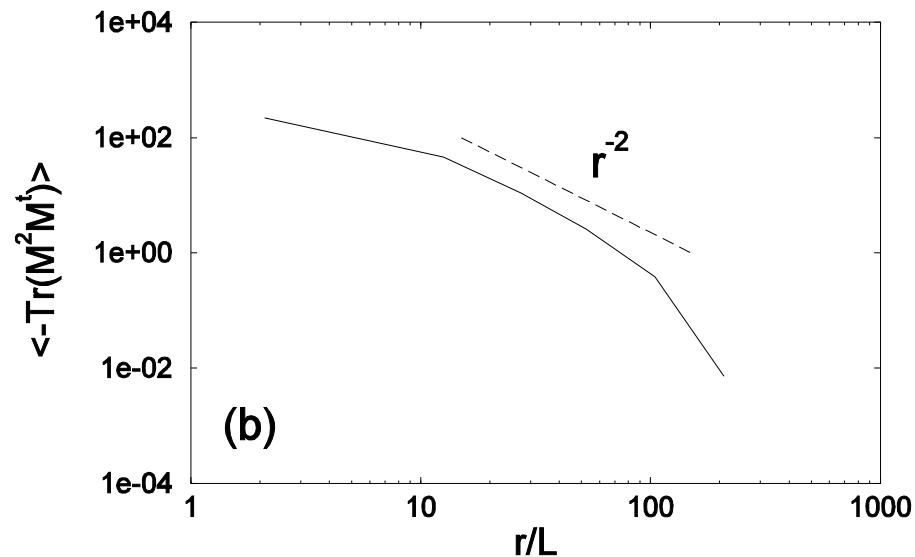
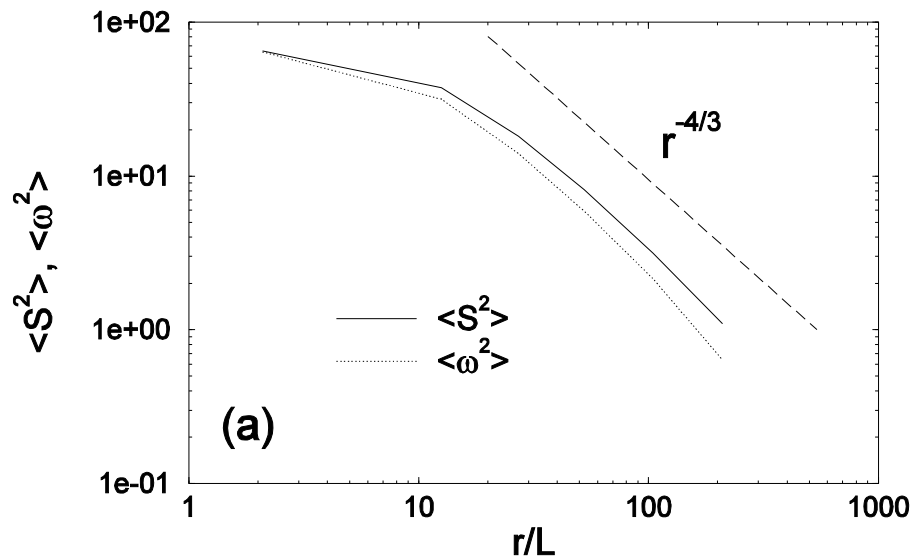
- ★ The parameter that has the **most crucial influence** is α (reduction of nonlinearity).
- ★ The predictions of the model are in agreement with DNS results provided α is in a small interval,
 $\alpha \sim 0.45$

Scaling laws of 2nd and 3rd order moments of M: solutions calculated by **DNS** ($R_\lambda=130; 256^3$)

According to the **K41** law, $\langle \Delta u(r) \rangle \propto r^{1/3}$ therefore $\langle M(r) \rangle \propto r^{-2/3}$

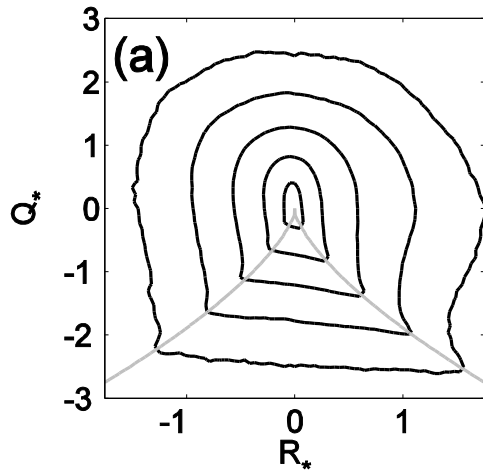
and $\langle \omega^2 \rangle$ et $\langle S^2 \rangle \propto r^{-4/3}$ $\langle -Tr(M^2 M^t) \rangle \propto r^{-2}$

DNS results: these three quantities satisfy the Kolmogorov scaling:

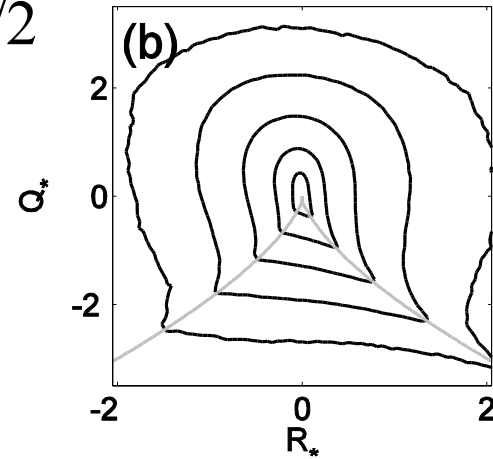


Evolution of $P(R, Q)$ as a function of scale:
solutions calculated by **DNS** ($R_\lambda = 130; 256^3$)

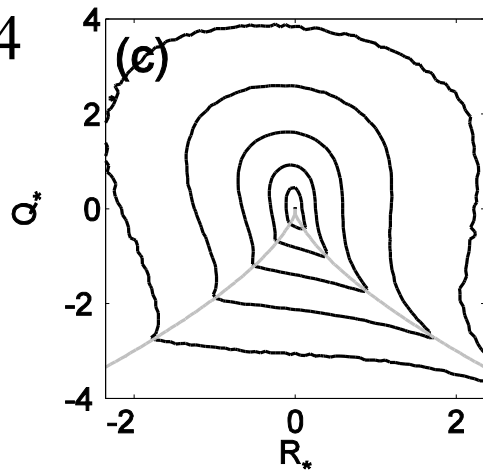
$r/L = 1$



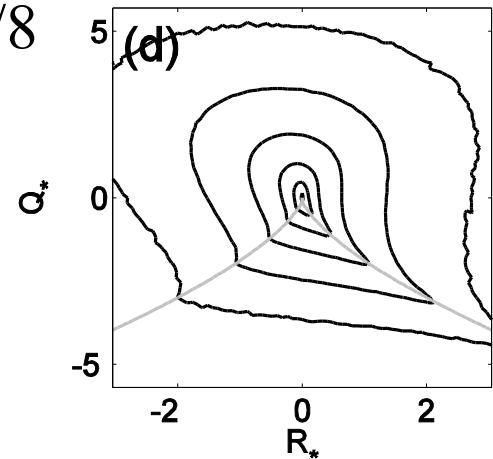
$r/L = 1/2$



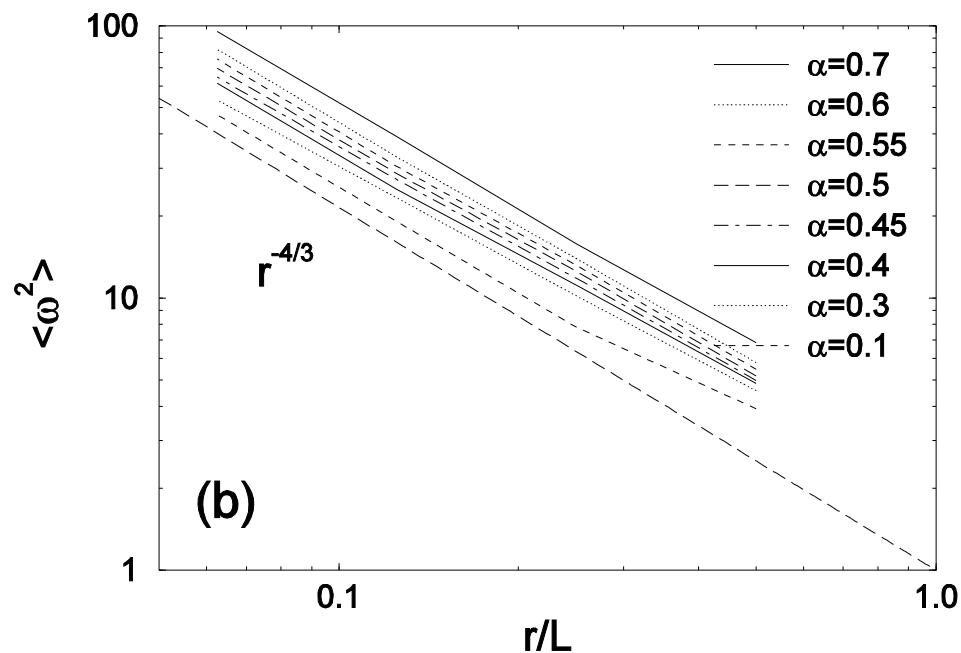
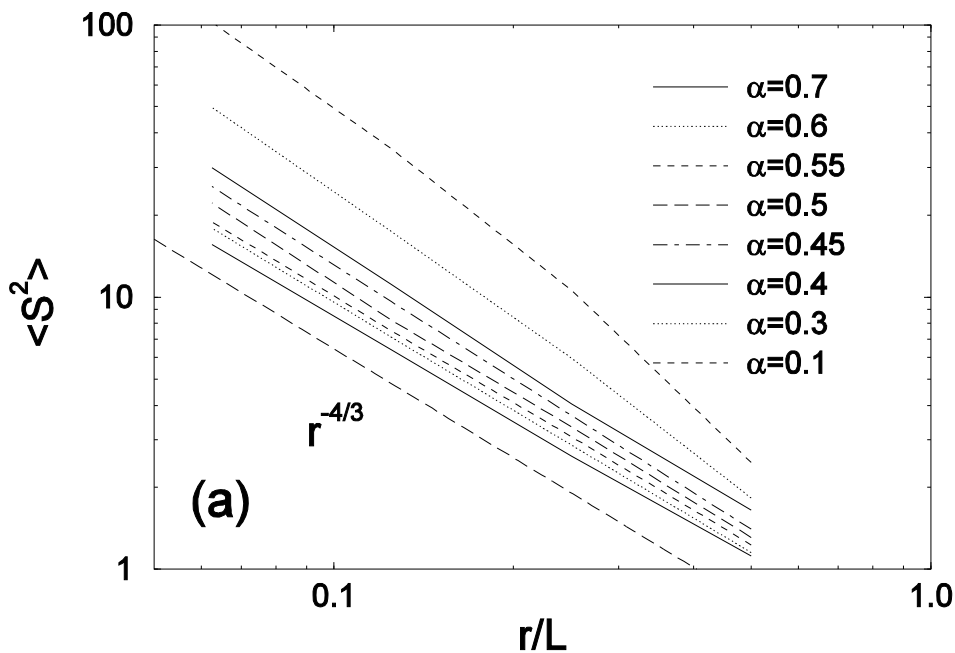
$r/L = 1/4$



$r/L = 1/8$

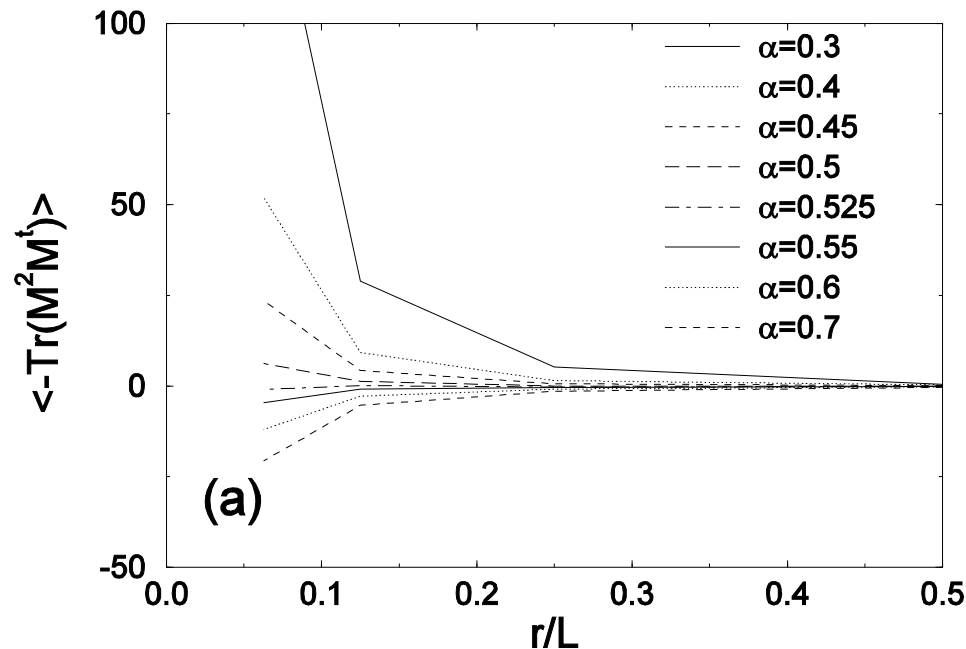


Scaling laws of 2nd order moments of M: semiclassical solutions of the model



The second moment of M has the right scaling provided the “nonlinearity reduction” α is not too small !

Scaling laws of 3rd order moments of M: **semiclassical** solutions of the model



The sign of the energy transfer is positive, as it should, provided the “**nonlinearity reduction**” α is not too large !

Influence of the other parameters

✓ Influence of the parameter β :

Not much effect provided β is large enough.

✓ Influence of the parameter γ :

Main effect : change the numerical value of

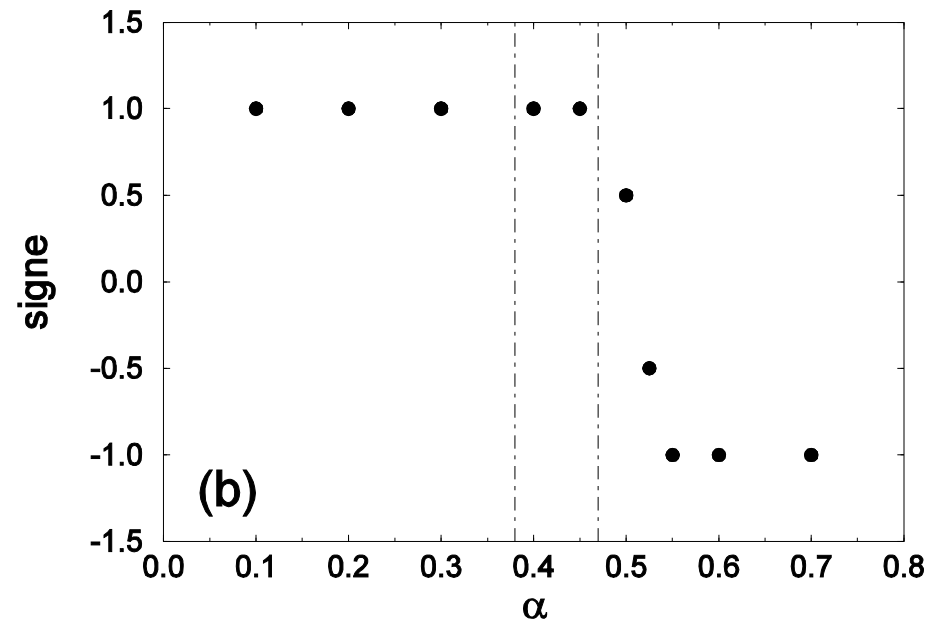
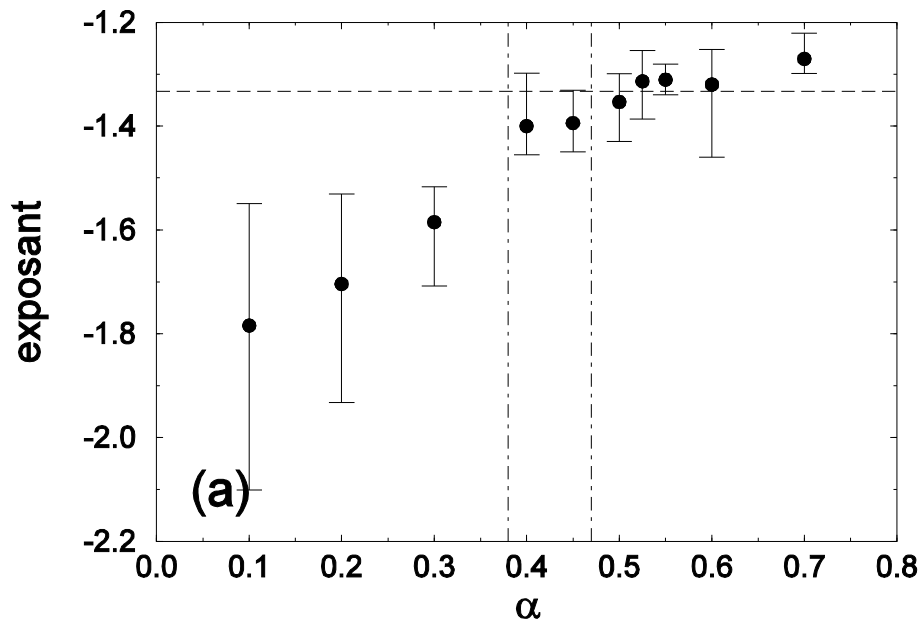
$$\langle \omega^2 \rangle \times r^{4/3}$$

Scaling laws of 2nd and 3rd order moments of M: **semiclassical** solutions of the model

■ $\langle \omega^2 \rangle$ scales according to K41 **for any value of α** .

■ $\langle S^2 \rangle$ scales according to K41 **for large values of α** :

■ The energy transfer, $\langle -r^2 Tr(M^2 M^t) \rangle$, has the **right sign** for **small values of α** :

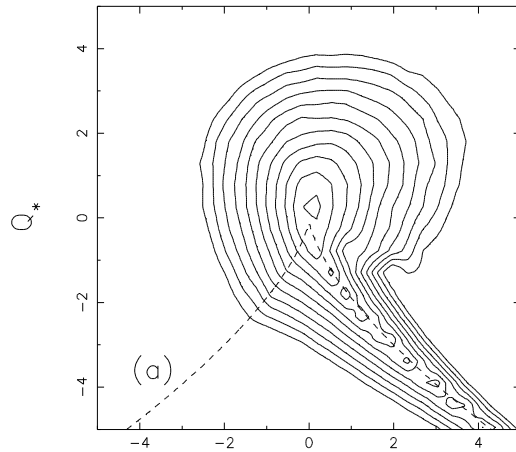


The solutions are quantitatively acceptable if α is in a narrow interval $\sim 0.4-0.5$!

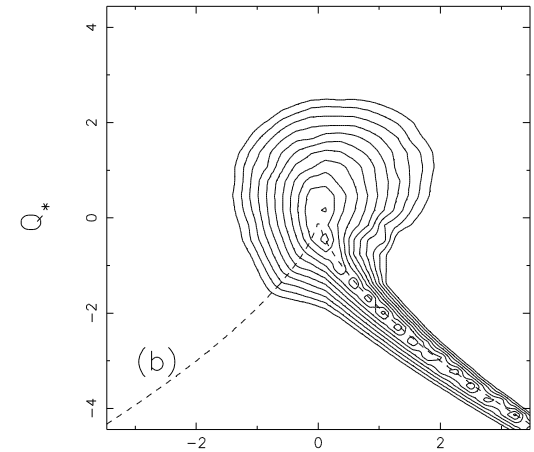
Evolution of $P(R, Q)$ as a function of scale: **semiclassical** solutions of the model (1)

Parameters: $\alpha = 0.2$, $\beta = 0.4$, $\gamma = 0.25$

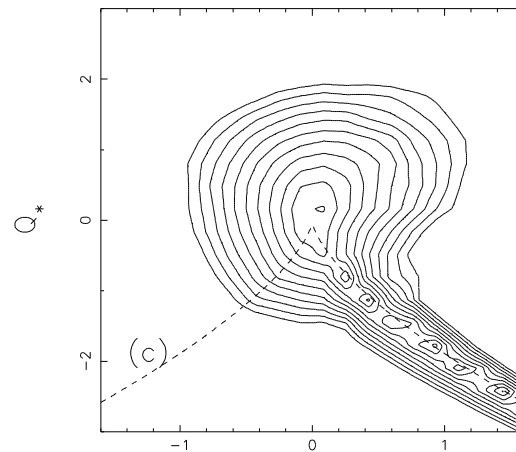
$r/L = 1/2$



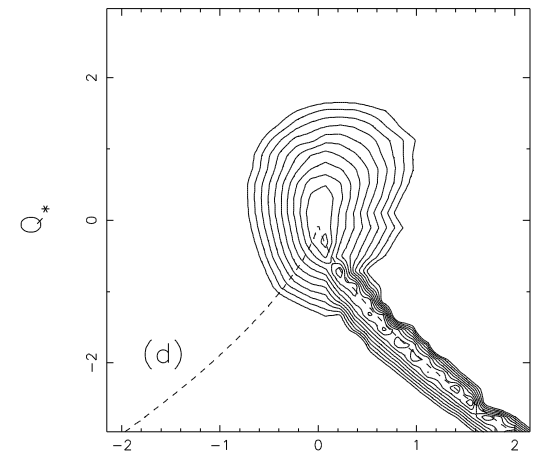
$r/L = 1/4$



$r/L = 1/8$



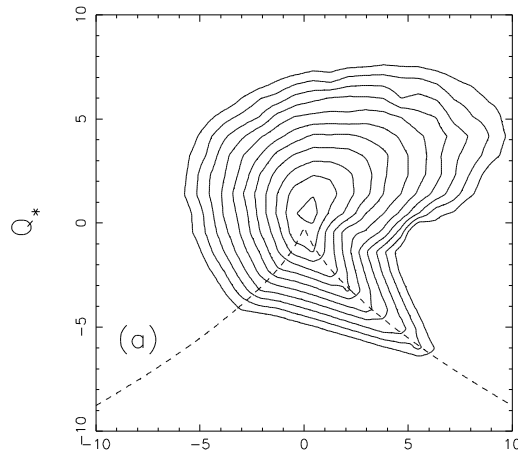
$r/L = 1/16$



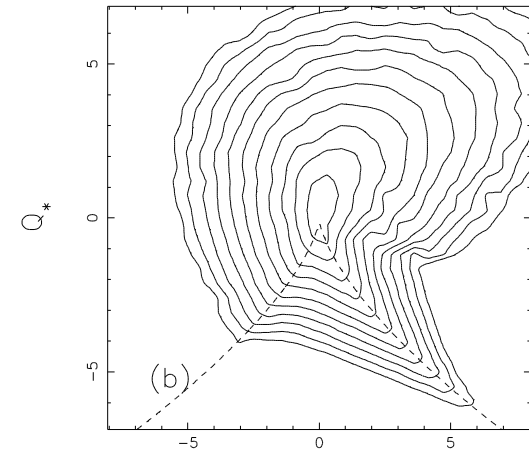
Evolution of $P(R, Q)$ as a function of scale: **semiclassical** solutions of the model (2)

Parameters: $\alpha = 0.6$, $\beta = 0.4$, $\gamma = 0.25$

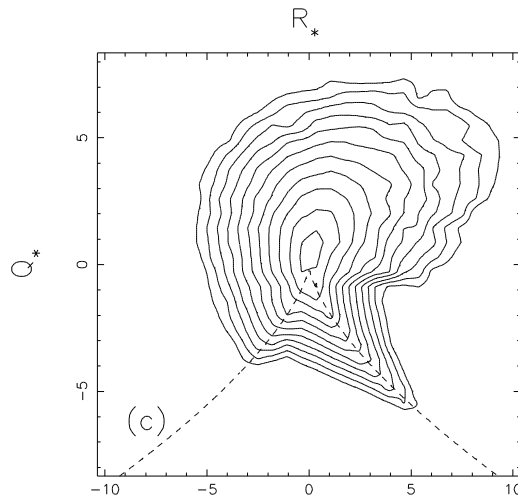
$r/L = 1/2$



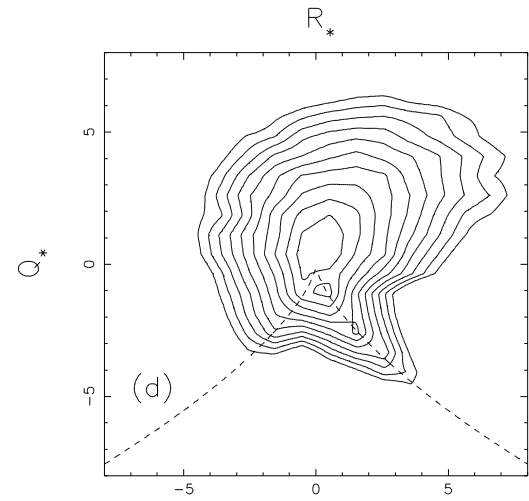
$r/L = 1/4$



$r/L = 1/8$



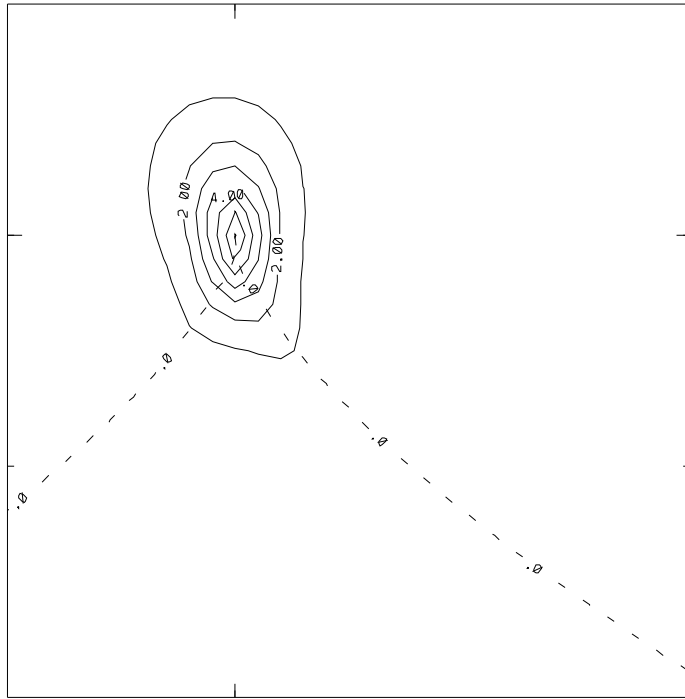
$r/L = 1/16$



Scale dependence of the enstrophy density: *solutions calculated by DNS*

$r/L = 1/2$

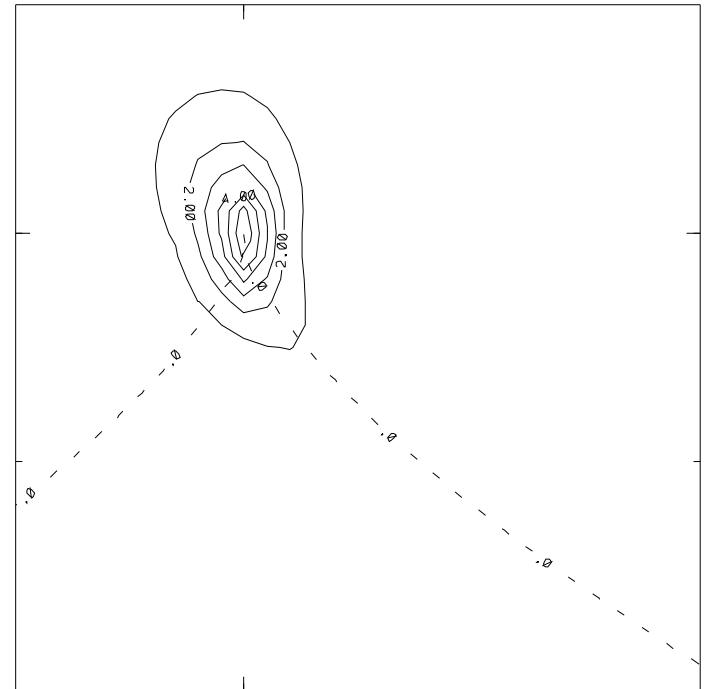
Run V8: $\langle \omega^2 | R, Q \rangle$; $r/L=1/2$; $R_{lam}=135$



X, Y LIMITS - 5.00 1.00 -2.00 1.00
CONTOUR FROM .00000E+00 TO 700000E+00 CONTOUR INTERVAL OF 100000 P1(3,31) -139000E-02

$r/L = 1/8$

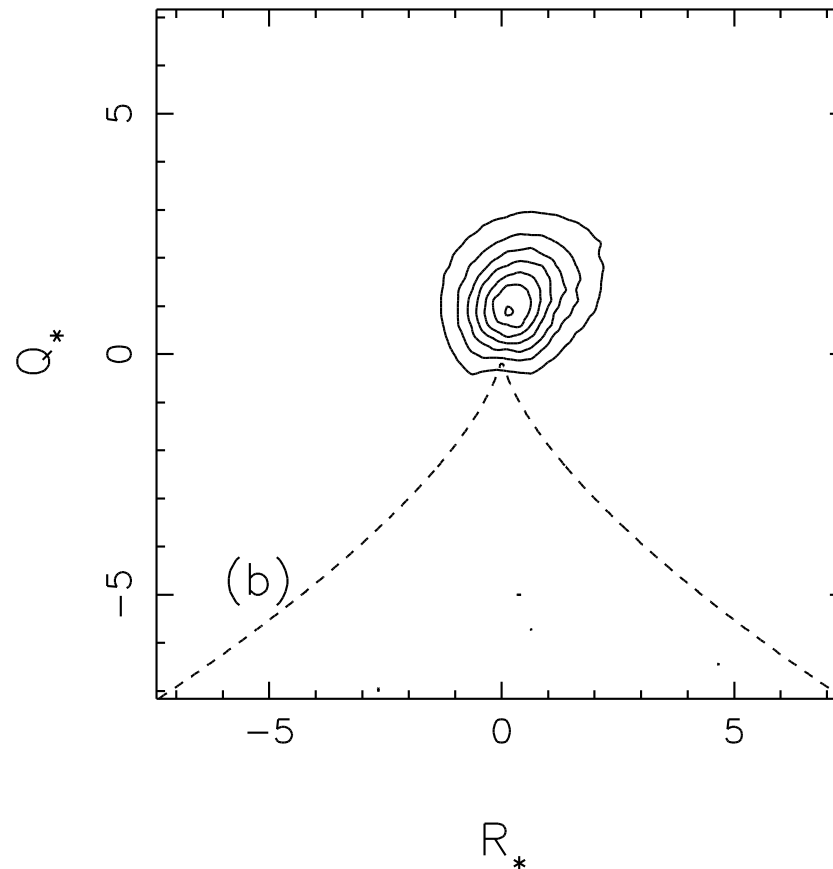
Run V8: $\langle \omega^2 | R, Q \rangle$; $r/L=1/8$; $R_{lam}=135$



X, Y LIMITS - 5.00 1.00 -2.00 1.00
CONTOUR FROM .00000E+00 TO 600000E+00 CONTOUR INTERVAL OF 100000 P1(3,31) -169000E-02

Scale dependence of the **enstrophy** density:
semiclassical solution of the model

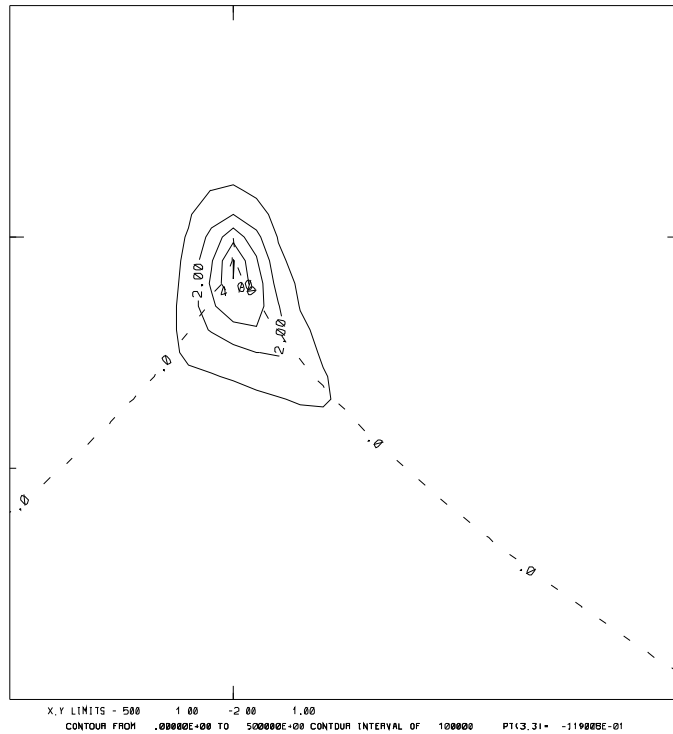
$$r/L = 1/8$$



Scale dependence of the strain variance ($\text{Tr}(S^2)$) density: *solutions calculated by DNS*

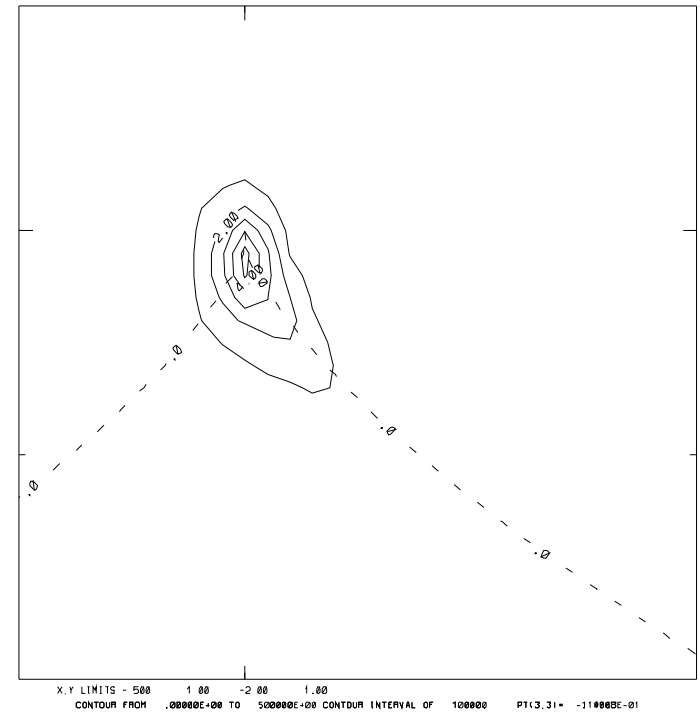
$r/L = 1/2$

Run V8: <tr(s^2);R,Q>: r/L=1/2: R_lam=135



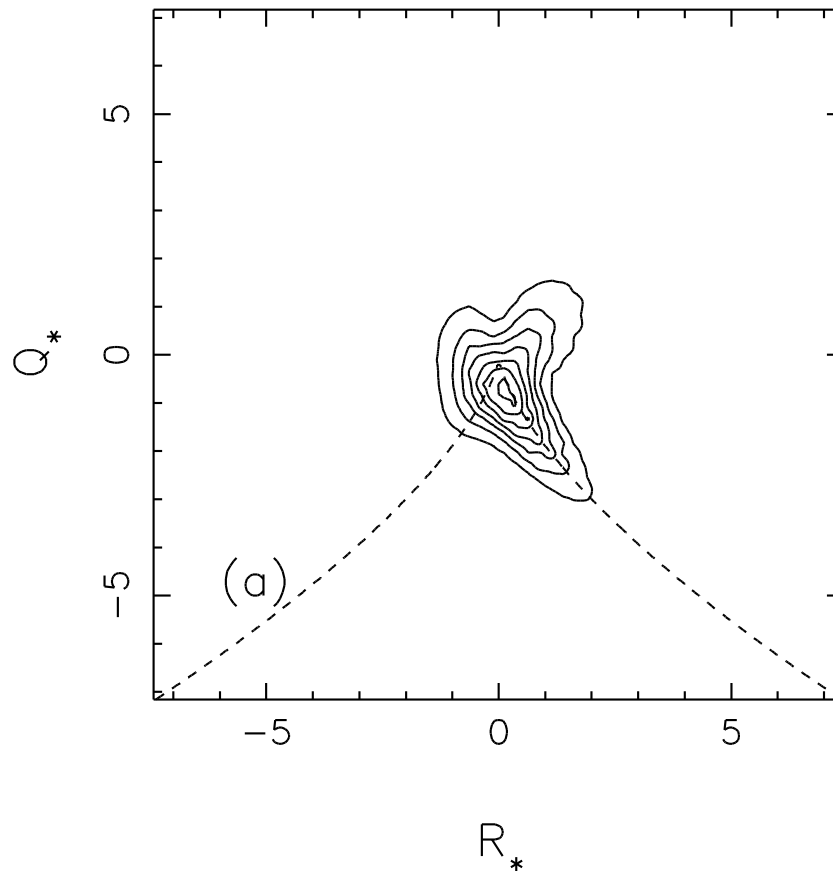
$r/L = 1/8$

Run V8: <tr(s^2);R,Q>: r/L=1/8: R_lam=135



Strain variance ($\text{Tr}(S^2)$) density:
semiclassical solution of the model

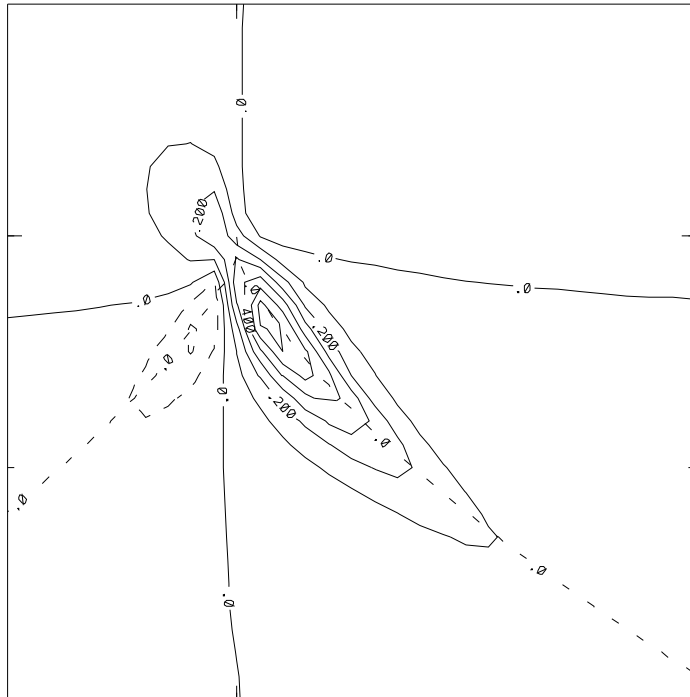
$$r/L = 1/8$$



Scale dependence of the energy transfer density: solutions calculated by *DNS*

$r/L = 1/2$

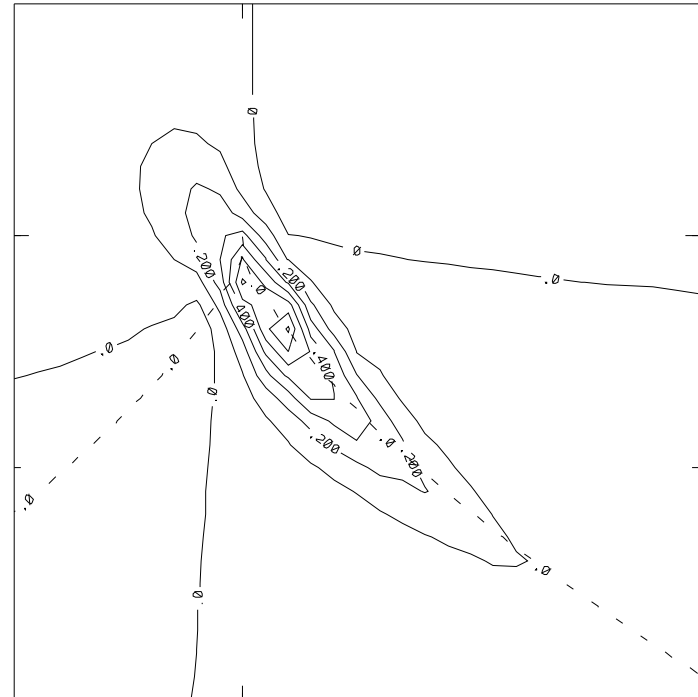
Run V8: $-\langle \text{tr}(M^2 M^T) \rangle; R, Q \rangle$; $r/L=1/2$; $R_{\text{lam}}=135$



X,Y LIMITS - 500 1.00 -2.00 1.00
CONTOUR FROM -.00000E+00 TO .00000E+00 CONTOUR INTERVAL OF 100000 PT(3,31) -130000E-02

$r/L = 1/8$

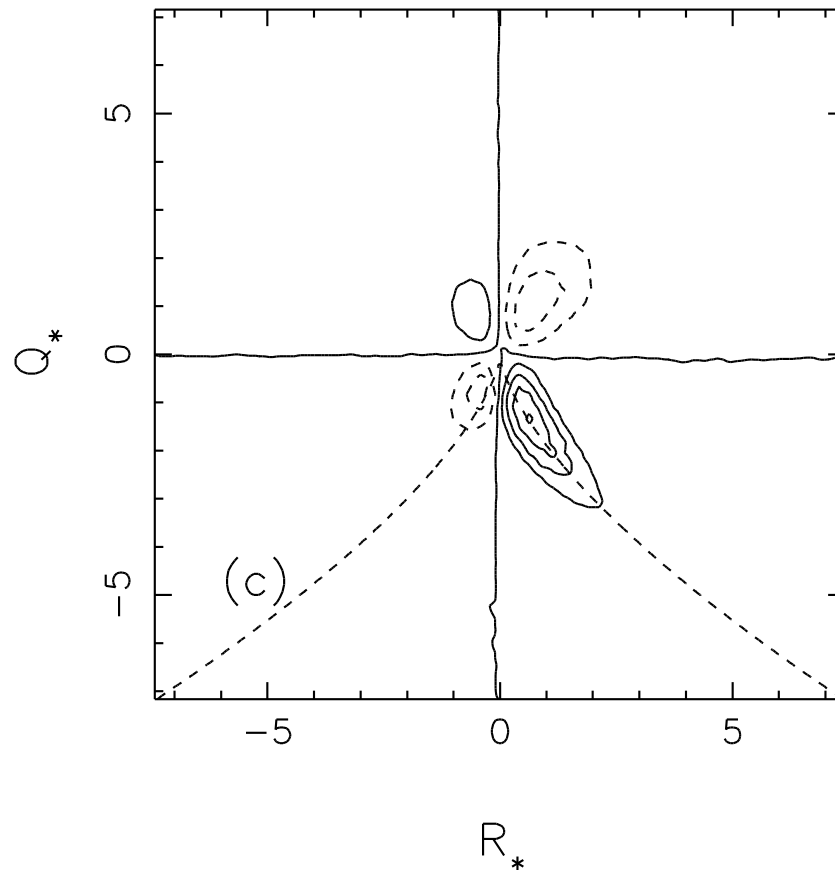
Run V8: $-\langle \text{tr}(M^2 M^T) \rangle; R, Q \rangle$; $r/L=1/8$; $R_{\text{lam}}=135$



X,Y LIMITS - 500 1.00 -2.00 1.00
CONTOUR FROM .00000E+00 TO .00000E+00 CONTOUR INTERVAL OF 100000 PT(3,31) -130000E-02

Scale dependence of the **energy transfer density**:
semiclassical solution of the model

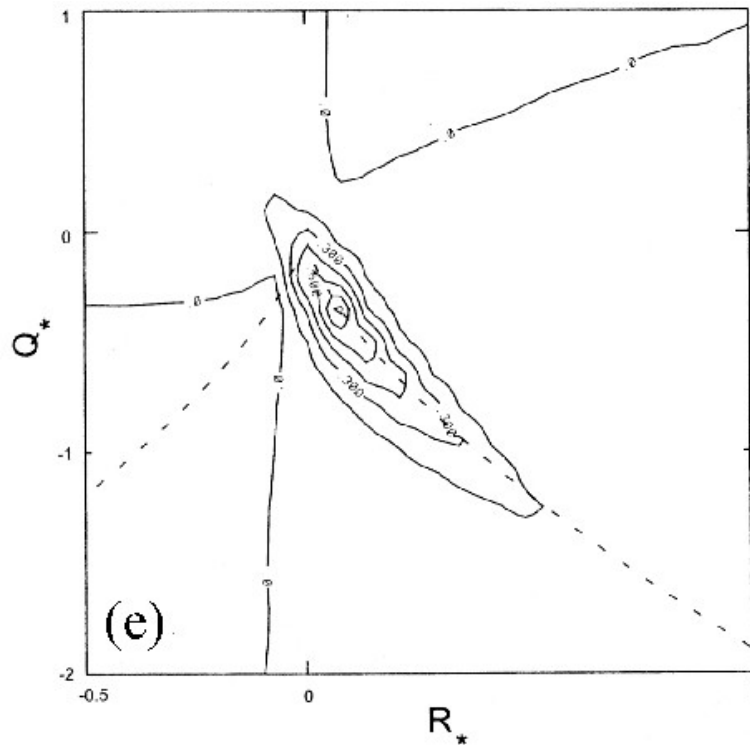
$$r/L = 1/8$$



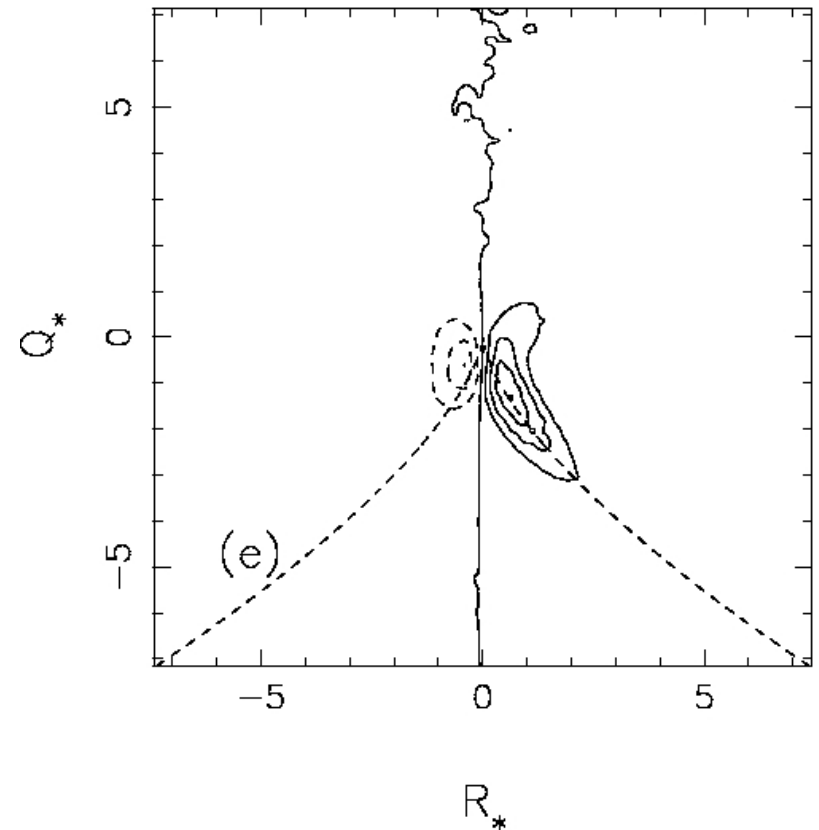
Strain skewness $-\text{Tr}(S^3)$ density:
DNS and *semiclassical* solution of the model

$$r/L = 1/8$$

DNS



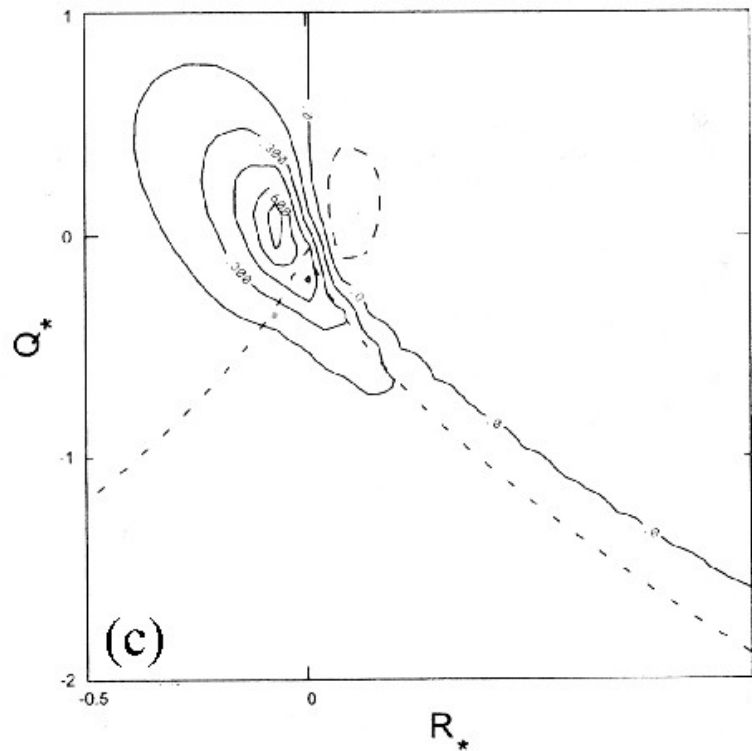
SC



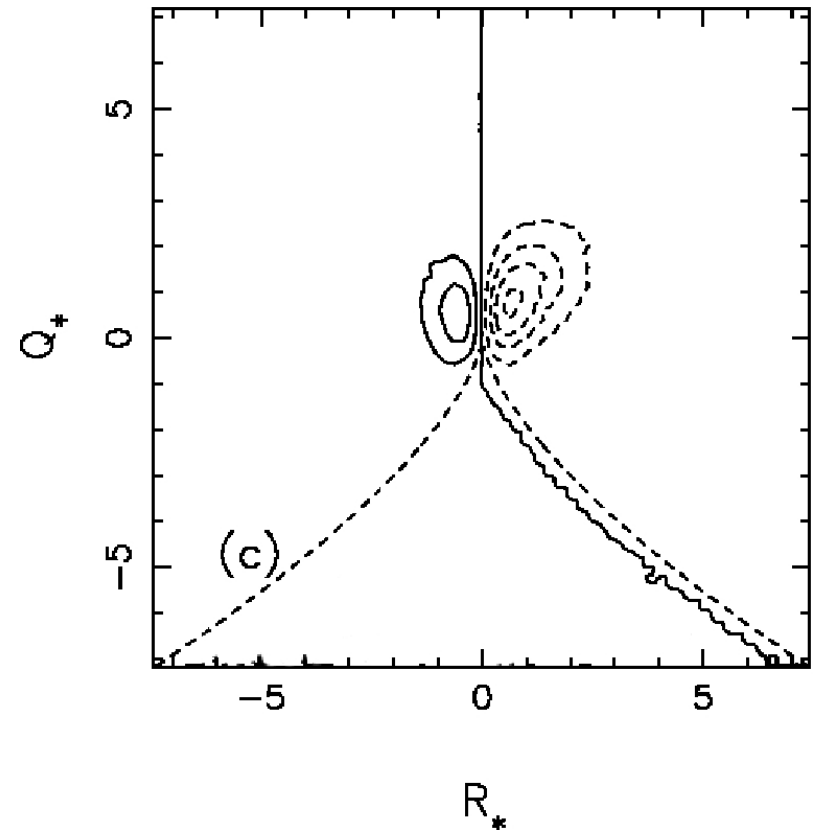
Enstrophy production density:
DNS and *semiclassical* solution of the model

$$r/L = 1/8$$

DNS



SC



4. Numerical solutions of the system in
the semiclassical approximation
with large scale shear

A. Naso, M. Chertkov and A. Pumir, J. Turbul. **7**, N41 (2006)

★ One of the postulates of turbulence theory is the **universality of small scale velocity fluctuations**. In particular, these fluctuations should be **isotropic** for any large scale forcing (at least for large enough Re). Equivalently, the effect of anisotropy should **diminish** for decreasing scales.

★ One of the simplest flow configurations to study this effect is the **homogeneous shear turbulence**.

★ **Experimental** (Shen and Warhaft, 2000) and **numerical** (Pumir and Shraiman, 1995; Pumir, 1996) studies of homogeneous shear turbulent flows actually show that the **decrease of the shear** effects is **much slower** than naively expected...

★ **Idea:** the tetrad model can be applied to all kinds of forcing, simply by changing the large scale condition
→ impose a **large scale shear**, and calculate the **scale dependence** of $P(R,Q)$ and of the dynamical quantities, for different values of the shear intensity.

★ The equations are the same than those considered in the isotropic case. We simply change the **large scale condition** for the velocity field:

$$P(M, g = L^2 Id) \sim \exp \left[\frac{-\text{Tr}[(M - \Sigma)(M - \Sigma)^t]}{(\varepsilon L^{-2})^{2/3}} \right]$$

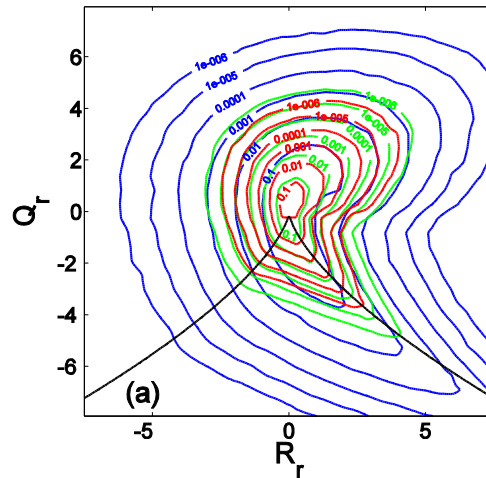
where:

$$\Sigma \equiv \begin{pmatrix} 0 & s & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{pmatrix} ; s \text{ measures the shear intensity}$$

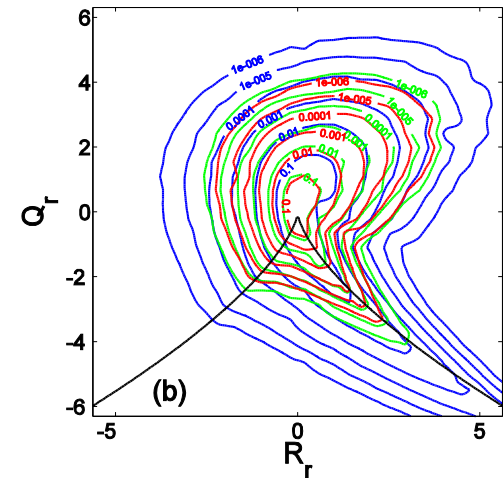
Scale dependence of $P(R, Q)$: semiclassical solutions of the model with $s=0, 1, 6$

Parameters: $\alpha = 0.6, \beta = 0.4, \gamma = 0.25$

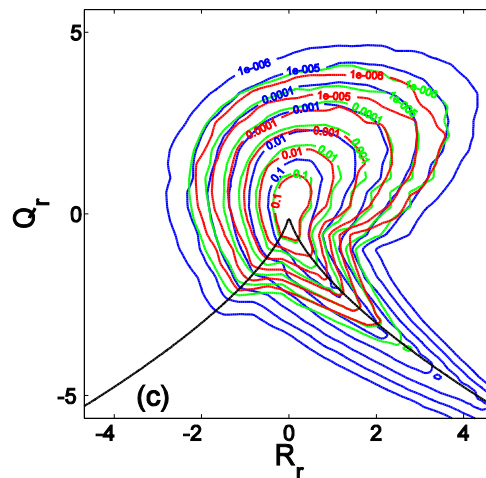
$r/L = 1/2$



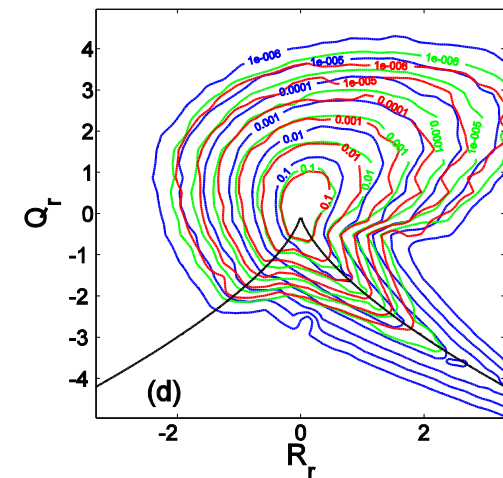
$r/L = 1/4$



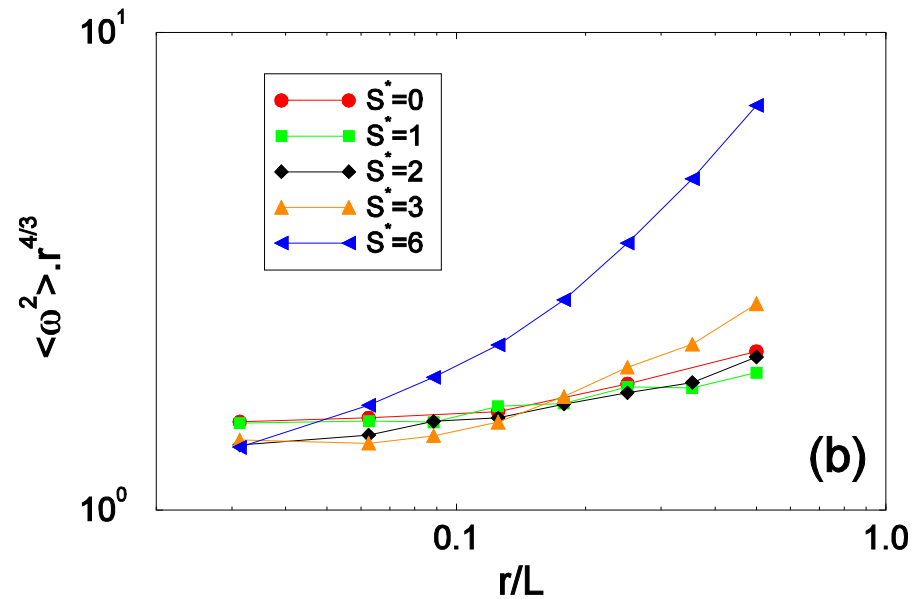
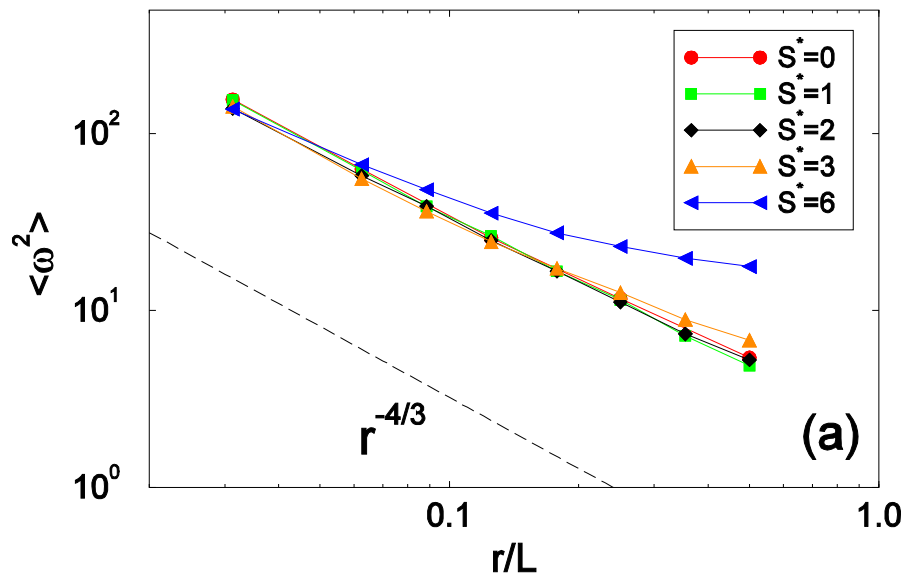
$r/L = 1/8$



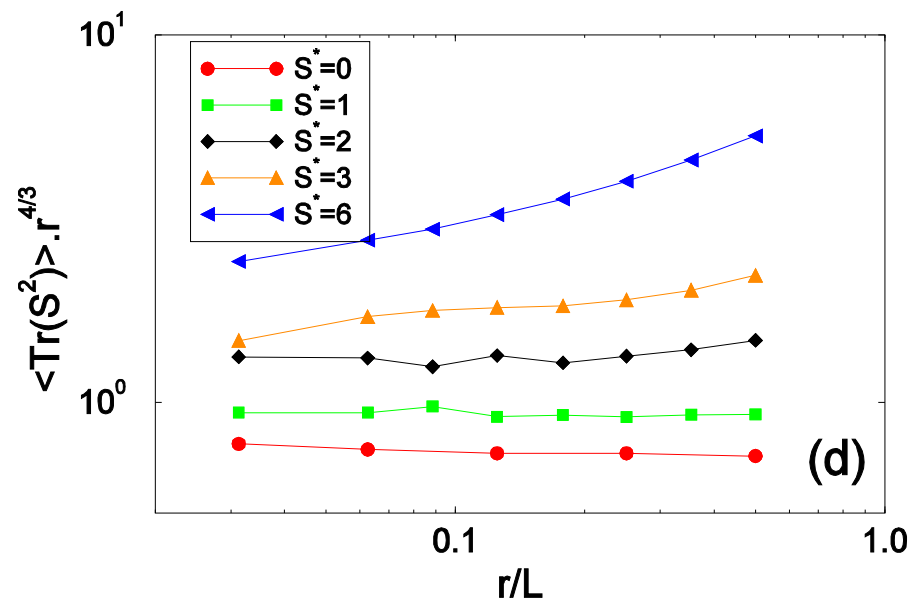
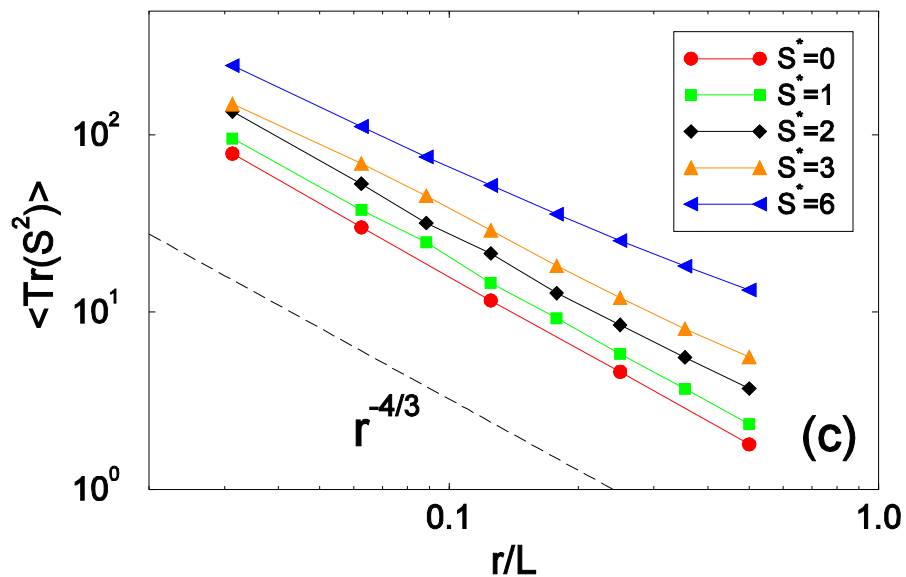
$r/L = 1/16$



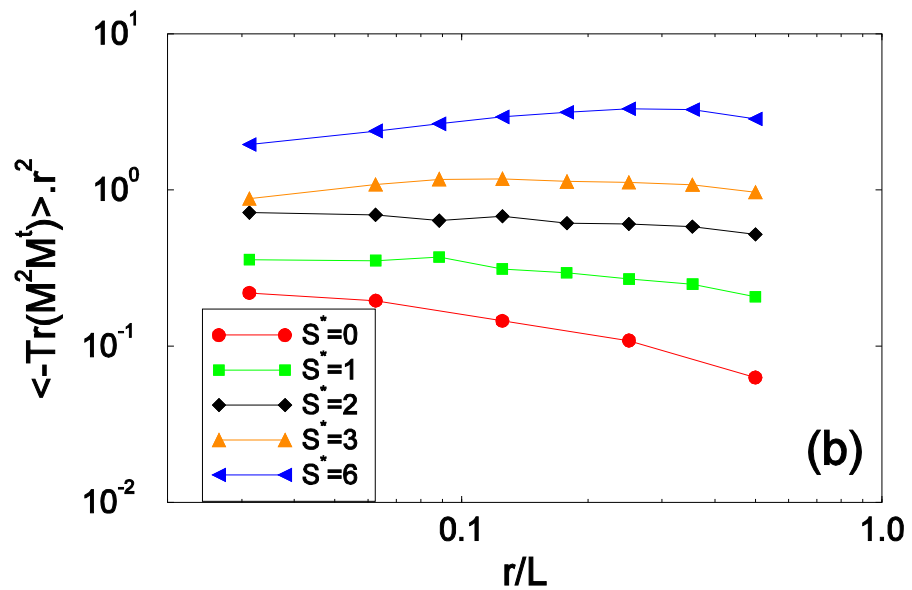
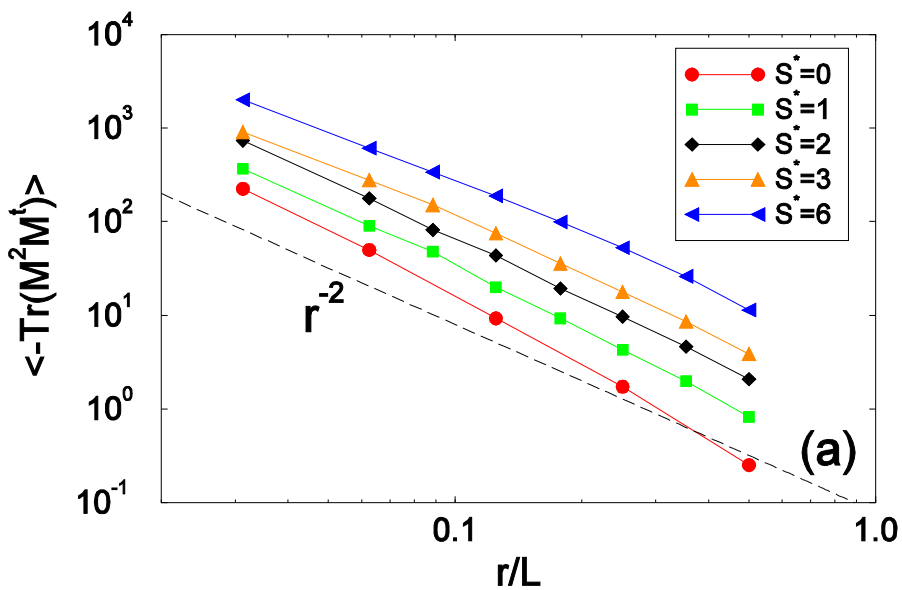
Scale dependence of $\langle \omega^2 \rangle$ for different values of s



Scale dependence of $\langle \text{Tr}(S^2) \rangle$ for different values of s



Scale dependence of the **energy transfer** for different values of s



★ Our results are consistent with the accepted view that the effects of **large scale anisotropy decrease** when the scale decreases.

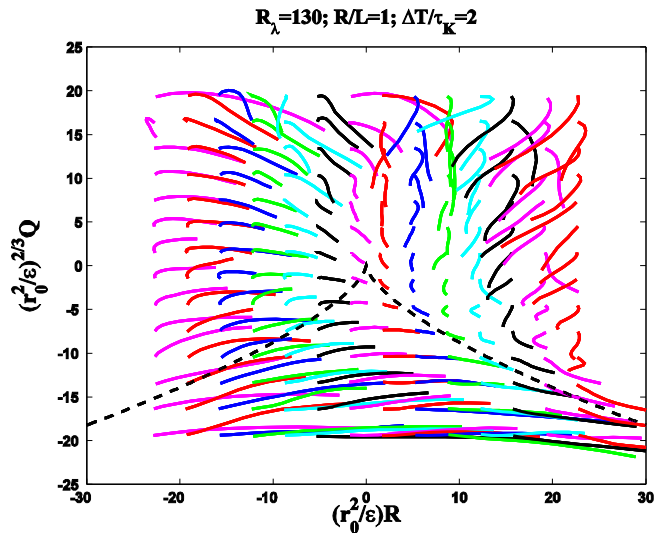
★ **New result: difference of behavior** between vorticity dominated and strain dominated structures. The **anisotropy** effects diminish significantly faster for **vorticity** dominated structures (enstrophy) than for **strain** dominated ones (strain variance, energy transfer).

★ The faster relaxation of vorticity dominated structures towards isotropy is consistent with the observation that vortical structures in turbulent flows are generally **more intense** than strain structures. They are therefore **less sensitive** to a moderate, large scale effect (imposed shear).

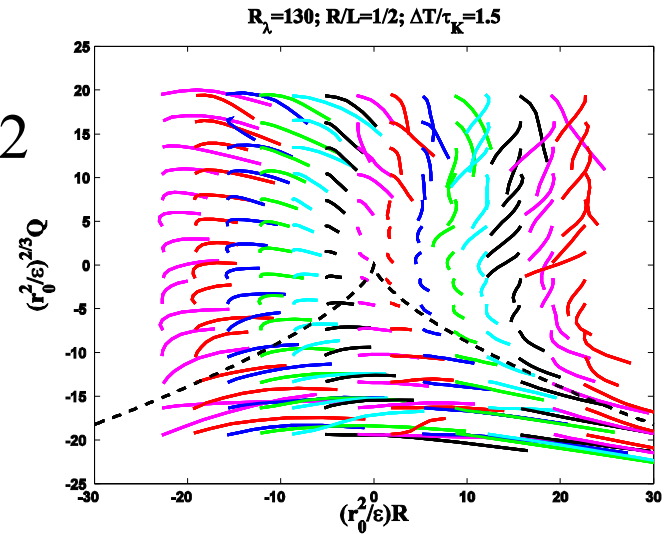
5. Lagrangian trajectories

Lagrangian trajectories in the (R,Q) plane: DNS results (1)

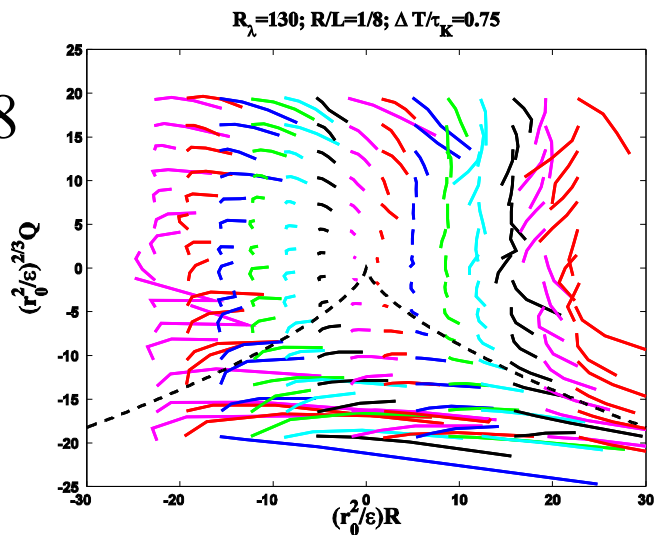
$r/L = 1$



$r/L = 1/2$



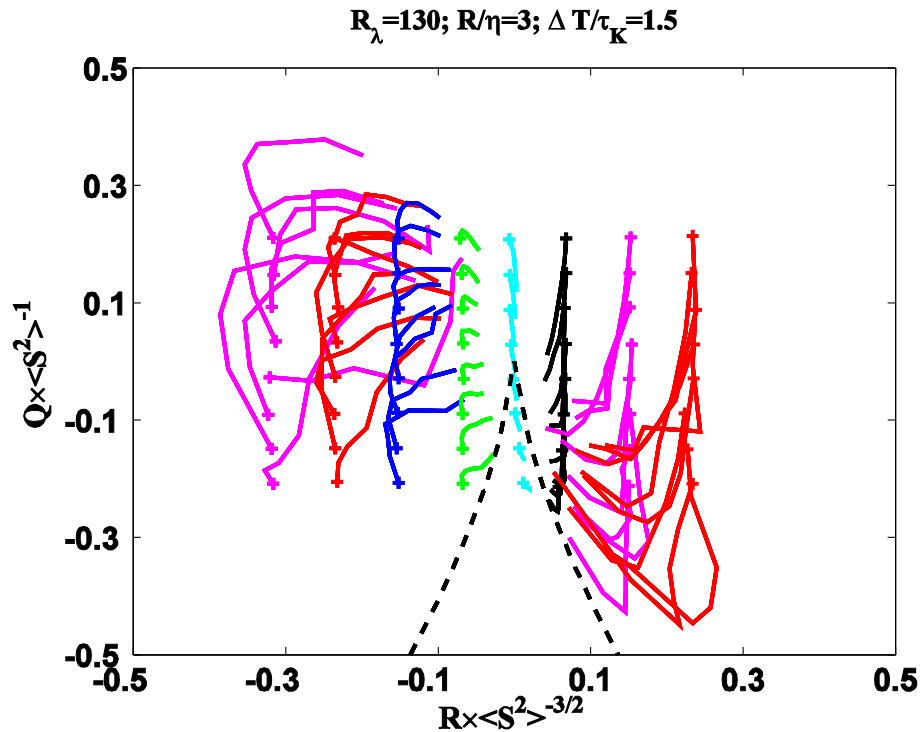
$r/L = 1/8$



Trajectories similar while r
is in the **inertial range**

Lagrangian trajectories in the (R,Q) plane: **DNS** results (2)

$r/L =$
 $1/32$
($r/\eta=3$)

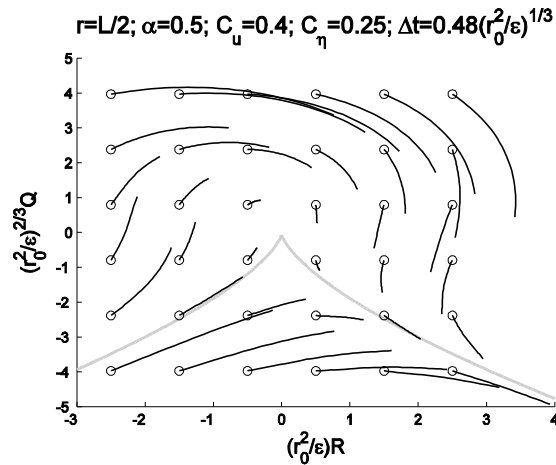


The character of the trajectories is not the same in the **dissipative range** !

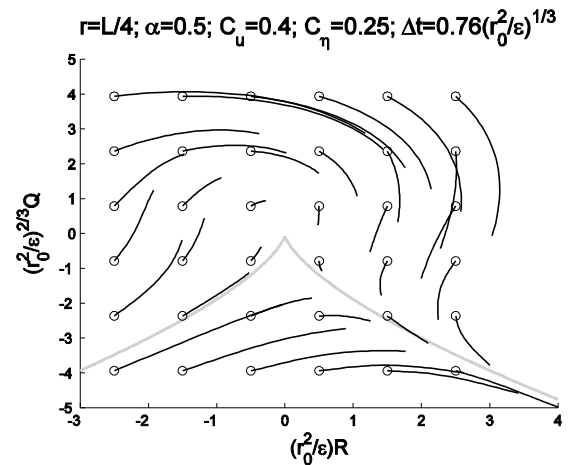
Difference with Chevillard and Meneveau, 2006

Lagrangian trajectories in the (R,Q) plane: model solutions

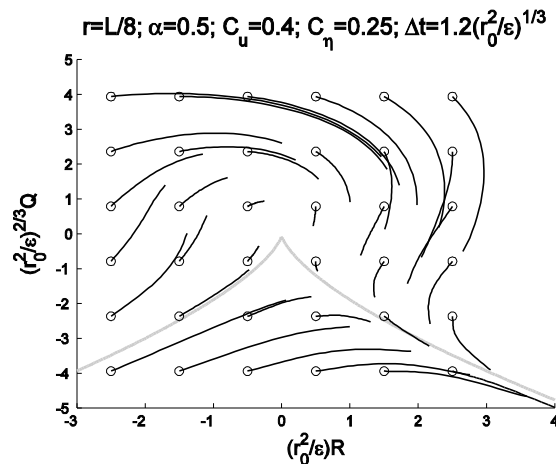
$r/L = 1/2$



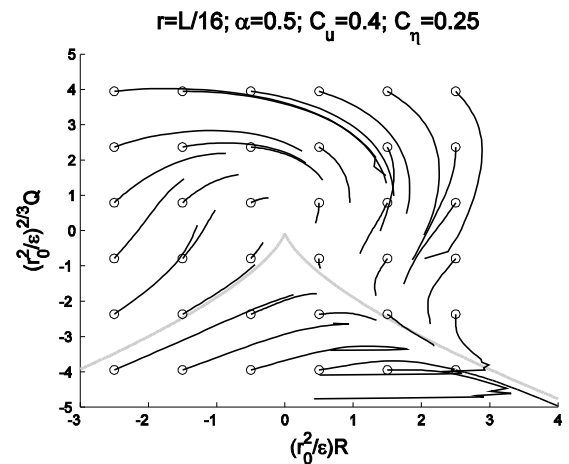
$r/L = 1/4$



$r/L = 1/8$



$r/L =$
 $1/16$



6. Conclusion and Outlook

■ We have formulated a **dynamical model** of **turbulent velocity fluctuations**, involving several key ingredients of fluid dynamics turbulence.

■ Three dimensionless parameters are involved in this model, formulated as a **set of stochastic ODE's**.

- We have studied approximate solutions of this model:
- * with isotropic forcing: the numerical results show several possible behaviors. The **nonlinearity reduction** α plays the key role
 - * with large scale shear: **anisotropy** effects decrease significantly faster for **vorticity dominated structures** than for **strain dominated ones**

■ A major advantage of this model is the fact that it can be applied to **all kinds of turbulent flows**, simply by changing the boundary condition (at large scale)

→ easy to study the effect of **large scale anisotropy** on small scales (rotation, stretchings/contractions, Rayleigh-Taylor turbulence, ...).

■ Thanks to the semiclassical results, we have also designed a **hybrid method of resolution** (Monte-Carlo/saddle node) that incorporates more precisely the **fluctuations** in the dynamics (beyond the semiclassical approximation).

Expected output: find out about the importance of the **fluctuations** as a function of the **flow structures**.

see A. Naso, A. Pumir and M. Chertkov, to appear in J. Turbul. (2007)

■ **Very recent development** : new **experimental** results from the Göttingen, Zürich, Risø and Lyon groups

=> exciting new developments expected !!!

Danke !!!

References:

- ❖ M. Chertkov, A. Pumir and B.I. Shraiman, Phys. Fluids **11**, 2394 (1999)
→ *derivation of the model*
- ❖ A. Naso and A. Pumir, Phys. Rev. E **72**, 056318 (2005)
→ *semiclassical solution in homogeneous and isotropic turbulence*
- ❖ A. Naso, M. Chertkov and A. Pumir, J. Turbul. **7**, N41 (2006)
→ *semiclassical solution in shear turbulence*
- ❖ A. Naso, A. Pumir and M. Chertkov, to appear in J. Turbul. (2007)
→ *hybrid method of resolution*

Method of resolution in the semiclassical approximation

In the solution, expressed as a path-integral, look for the trajectory for which the integrand of the exponential:

$$\exp - \left[S \left(m; g; \frac{dm}{dt}; \frac{dg}{dt} \right) + Tr(mm^t) \Big|_{r=L} \right]$$

is **minimal**.

- ★ Solve the **Euler-Lagrange equations** for the Lagrangian associated to S, with arbitrary initial conditions, compatible with the constraints (R,Q,r).
- Find the **minimum value** over all possible initial conditions (*amebsa* \equiv simplex method + simulated annealing).