# Particle motion and irreversibility of turbulent flows

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### Preamble

- What is at stake in turbulence: many problems of crucial importance in the natural sciences (geo-, astro-physics, etc) or in engineering.
- From the point of view of fundamental physics: turbulence is a challenging non-equilibrium statistical mechanics problem.

~ one needs to find the right concepts/methods to cope with a highly non-equilibrium, nonlinear system.

• Here: explore the problem from the point of view of the motion of individual particles (the "lagrangian approach").

## The Lagrangian point of view

Accurate measurements of particles moving (very fast) in a turbulent flow (Cornell/Göttingen; Lyon; Zürich; Copenhagen ...). DNS results of similar quality.



What can we learn about turbulence by following particles?

# Turbulent motion from a particle perspective

• Classical results:

- *At long times,* GI Taylor (1922) showed that the motion is diffusive, with a coefficient of diffusion:

$$D = \int_0^\infty \left\langle u(x(t), t)u(x(0), 0) \right\rangle dt$$

- Dispersion of a set of particles by a turbulent flow (Richardson, 1928):

$$\left\langle R^2(t)\right\rangle \propto \varepsilon t^3$$

# Turbulent motion from a particle perspective

#### New perspective:

With the newly available possibilities in experiments or numerical simulations, describe the motion of particles at small spatial and temporal scales.

- How does turbulence affect the motion of one particle ?
- ... of several particles ?
- Any connection with "stochastic thermodynamics" ?

## **Time irreversibility**

### Turbulent dynamics (Navier-Stokes eqns) ~ energy flux through scale ~ time irreversible process.

"A trained eye viewing a movie of turbulence run backwards can tell that something is going wrong..."

(Falkovich & Sreenivasan, Physics Today 2006)

Can one really distinguish "the arrow of time" ? (see e.g. Pomeau, 1982).

## "training the eye":

## **Two-particle statistics**

## Training the eyes by following pairs of particles

Deduce the equation for the evolution of the relative evolution of two particle relative distance:

$$R(t) = r_2(t) - r_1(t); \ \delta R(t) = R(t) - R(0)$$

Introduce: 
$$\delta u = u_1(t) - u_2(t)$$
;  $\delta a = a_1(t) - a_2(t)$   
=>  $\left\langle \delta R(t)^2 \right\rangle = \left\langle \delta u(0)^2 \right\rangle t^2 + \left\langle \delta u(0) \right\rangle \cdot \delta a(0) \right\rangle t^3 + O(t^4)$ 

Identity: (Ott and Mann 2000, Pumir et al 2001, Falkovich et al 2001)

$$\frac{1}{2}\frac{d}{dt}\left\langle (u_2 - u_1)^2 \right\rangle = \left\langle \delta u(0), \ \delta a(0) \right\rangle = -2\varepsilon$$

# Training the eyes by following pairs of particles

Consequence:

$$\left\langle \delta R(-t)^2 \right\rangle - \left\langle \delta R(t)^2 \right\rangle = -2 \left\langle \delta u(0), \ \delta a(0) \right\rangle t^3 + O(t^5)$$



Use different initial separations,  $R_0$ , different Reynolds numbers + rescale time with  $t_0 = (R_0^2 / \varepsilon)^{1/3}$ 

Good data collapse !

(Jucha et al, PRL 2014)

# Training the eyes by following pairs of particles

**Physical content:** particles separate faster backward in time than they separate forward in time !

=> Measuring how particles separate does provide a way of distinguishing forward- and backward- evolution by looking at pairs of particles. Using more particles to "train the eye"

### More particles => more info !



<u>Analysis</u>: relate the observed time-asymmetry to fundamental properties of the velocity gradient tensor.



Chertkov, Pumir, Shraiman (Phys. Fluids, 1999)

## Quantifying the shape evolution



Pumir, Shraiman, Chertkov (Phys. Rev. Lett., 2000)

## **Shape deformation**

Evolution for the shape of the set of particles (disregard the motion of the center of mass):

$$d\rho/dt = M \cdot \rho$$

Take as an initial condition a regular tetrahedron of size  $R_0$ Expand S in Taylor series:  $S = S_0 + t S_1 + t^2/2 S_2 + ...$ 

Work in the eigen-basis of  $S_0$ : eigenvalues of  $S_0$ :

$$S_{0,i}$$
, with  $S_{0,1} > S_{0,2} > S_{0,3}$ 

Obtain the following expression for  $\langle g_i(t) \rangle$ :

$$\langle g_i(t) \rangle = \frac{1}{2} R_0^2 [1 + 2 \langle S_{0,i} \rangle t + \langle 2 S_{0,i}^2 + S_{1,i} \rangle t^2 + O(t^3) ]$$

## Shape deformation and time asymmetry t -> -t

The distribution of the eigenvalues of the  $S_0$ , the strain tensor based on tetrads, is skewed; such that

 $< S_{0,2} > > 0$ 

**A fundamental property** of turbulence (Betchov 1956, Siggia 1981, Ashurst et al, 1987)..



Jucha et al, 2014

## Shape deformation and time asymmetry t -> -t

#### **Consequence:**

The intermediate eigenvalue  $\langle g_2(t) \rangle$  is sensitive to the  $t \rightarrow -t$  asymmetry, at *first* order in t !



Jucha et al, PRL 2014

## Shape deformation and time asymmetry t -> -t

**Physical meaning:** 

An extended, initially isotropic object, flattens differently depending on the arrow of time

~ consequence of the statistical asymmetry of the rate of strain tensor, which is itself a consequence of the small-scale generation in turbulence. Can one "train the eye" by following one particle only ?

### Lagrangian velocity increments

$$\mathbf{u}(t+\tau)$$

$$\delta_{\tau}\mathbf{u} = \mathbf{u}(t+\tau) - \mathbf{u}(t)$$

$$\mathbf{u}(t)$$

Lagrangian structure functions:  $D_n(\tau) = \langle (\delta_{\tau} \ u)^n \rangle$ . If one flips the direction of time:  $t \to -t$ ,  $D_2(\tau) = \langle (\delta_{\tau} u)^2 \rangle$  is unchanged (Falkovich et al, 2012) ! See Leveque and Naso, EPL 2014, for a more precise analysis.

# Can one detect irreversibility from one single particle trajectory ?

Observation: large velocity jumps of one given trajectory are associated with a stronger particle deceleration than acceleration.



### Detecting time irreversibility from singleparticle trajectory

Consider the kinetic energy increments:  $W(\tau) = E(t+\tau) - E(t)$ 

and their moments:  $\langle W^n( au)
angle$ 

The odd moments are not invariant under  $t \to -t$ They can pick up the lack of symmetry seen experimentally !

n.b.: the moments  $\; \langle W^n(\tau) \rangle \;$  cannot be expressed in terms of velocity increments only

#### Detecting time irreversibility from single-particle trajectory

3D



The third moment of  $W(\tau)$  is negative, and remains ~ constant when  $\tau/\tau_{\rm K}$  is larger than ~2.



Note that plateau range is much more significant than that of the velocity structure functions.

## Asymmetry of the PDF of W and breaking of detailed balance

The observed lack of symmetry  $W \rightarrow -W$  from the PDFs implies that:

$$P(E \to E + \Delta E) \neq P(E + \Delta E \to E)$$

**Detailed balance is broken !!** 

## ... no obvious connection with the existing results on statistical thermodynamics...



## A quantitative measure of irreversibility

## How to measure irreversibility in a turbulent flow ?

• When the Reynolds number increases, the range of excited scale becomes larger.

Can one quantify the irreversibility, and get a notion as how it depends on the Reynolds number ?

First problem: find a proper measure of irreversibility !

#### A quantity measuring Irreversibility (Ir)

A naïve suggestion:

#### Origin of irreversibility: the energy flux $\varepsilon$ . $Ir = \varepsilon$ ??

Problem:  $\varepsilon$  is dimensional – ie, it can be made arbitrarily large or small by changing the units.

At short times:

$$\langle W^{3}(\tau) \rangle = \left\langle \left(\frac{dE}{dt}\right)^{3} \right\rangle \tau^{3} + h.o.t.$$
$$= \langle (\mathbf{a} \cdot \mathbf{v})^{3} \rangle \tau^{3} + h.o.t.$$

The observation of nonzero odd moments of W suggests that time-irreversibility should also be reflected in the statistics of the instantaneous power on a fluid particle

$$p \equiv \mathbf{a} \cdot \mathbf{v}$$

In particular, it implies that the PDF of power *p* is *negatively skewed*.

#### A quantity measuring Irreversibility (Ir)

A better suggestion:

Use the simplest non-obvious moment of p,  $< p^3 >$ , made properly dimensionless.

~notice that p and  $\varepsilon$  have the same dimension.

$$Ir = - \langle p^3 \rangle / \varepsilon^3$$

### Scaling of Ir



Ir ~  $R_{\lambda}^{2}$ 





## Small scale generation in 3d turbulence and irreversibility

## What is the content of <*p*<sup>3</sup>> ?

 $< p^3 > \propto -\varepsilon^3 R_{\lambda}^2$ 

**<u>Main result</u>:** in 3D flows:  $<p^3 > < 0 \iff <\omega.S.\omega > > 0$ 

*In other words*: the manifestation of *irreversibility* observed from the motion of individual particles is a consequence of small-scale generation by turbulence.

Irreversibility "equals" small scale generation

## **Decomposition of acceleration**

• Use the identify:  $a = du / dt = \partial_t u + (u.\nabla) u$ =>  $p = a.u = u.\partial u / \partial t + u.(u.\nabla u)$   $= p_L + p_C$ where  $p_L = u. \ \partial u / \partial t$  and  $p_C = u. \ (u.\nabla)u$ (see also Tsinober et al, 2001).

n.b.:  $p_C$  can be expressed as  $p_C = u.S.u$ , where S is the (symmetric) rate of strain tensor.

## An identity

• Assume that the statistical properties of

#### <u>u and S are statistically independent</u>

(reasonable, since *u* is controlled by the largest scales of the flow, whereas *S* is controlled by the smallest scale quantity, which are expected to be only weakly coupled).

Then: 
$$\langle p_C^3 \rangle = \langle (u, S, u)^3 \rangle = \frac{8}{105} \langle u^6 \rangle \langle tr(S^3) \rangle$$

• Use the relation for homogeneous flows (Betchov 1956):

$$\langle tr(S^3) \rangle = -\frac{3}{4} \langle \omega. S. \omega \rangle$$

Consequence:

$$\langle \omega.S.\omega \rangle > 0 \Rightarrow \langle p_C^3 \rangle < 0$$

## **Elementary scaling considerations**

• The usual scaling arguments impy that:

$$\left\langle p_{C}^{3} \right\rangle \propto \varepsilon^{3} R_{\lambda}^{3} ; \left\langle p_{L}^{3} \right\rangle \propto \varepsilon^{3} R_{\lambda}^{3}$$
  
 $\left\langle p_{C}^{2} \right\rangle \propto \varepsilon^{2} R_{\lambda}^{2} ; \left\langle p_{L}^{2} \right\rangle \propto \varepsilon^{2} R_{\lambda}^{2}$ 

• How come does one find

$$\langle p^2 \rangle \propto \varepsilon^2 R_{\lambda}^{4/3}; \langle p^3 \rangle \propto \varepsilon^3 R_{\lambda}^2$$

... and what does it imply for the moments of  $p_C$ ,  $p_L$ ???

### Partial cancellation between p<sub>L</sub> and p<sub>C</sub>

• Observation: to a large extent,  $p_c$  and  $p_L$ cancel each other!  $|p_c + p_L| << |p_c|, |p_L|$ 



### Partial cancellation between p<sub>L</sub> and p<sub>C</sub>

 Weak correlations between p<sub>C</sub>, and p; almost no correlation between p<sub>L</sub> and p.



## Implication for the moments of p

• Taking into account the independence of  $p_L$  and p, obtain:  $< p^2/p_C > \approx (1-\beta) p_C^2$ 

so 
$$<\!p^2\!>\approx (1\!-\!\beta)<\!p_C^2\!>$$

• For the third moment:

(...) 
$$< p^3 > \approx (1 - \beta') < p_C^3 >$$

where  $(1-\beta')$  is a number smaller than  $(1-\beta)$ , but positive.

Consequence: 
$$(1-\beta) \sim R_{\lambda}^{-2/3}$$
 and  $(1-\beta') \sim R_{\lambda}^{-1}$ 

## Independence of u and S



Velocity does not show any particular alignment with any of the eigenvectors of strain nb: here,  $\lambda_1 > \lambda_2 > \lambda_3$  The strain eigenvalues conditioned on  $u^2$  depend weakly on the magnitude of velocity.

# Implication of $< p_C^3 > < 0$ for frozen flows

- In fact, the 3<sup>rd</sup> moment of  $W(\tau)=1/2 [u^2(\tau)-u^2(0)]$  are negative.
  - Corresponding to negatively skewed distributions of  $W(\tau)$ .



Action of the different forces acting on tracer particles

#### A breakdown of the contributions to *p*

$$p = \mathbf{a} \cdot \mathbf{v} = -\mathbf{v} \cdot \nabla P + \mathbf{v} \cdot \mathbf{f} + \mathbf{v} \cdot \mathbf{D}$$

In 3D: 
$$\mathbf{D}=
u 
abla^2 \mathbf{v}$$

In 2D: 
$$\mathbf{D} = 
u \nabla^2 \mathbf{v} - lpha \mathbf{v}$$

For stationary homogeneous turbulence:

$$\langle \mathbf{v} \cdot \nabla P \rangle = 0$$
$$\langle \mathbf{v} \cdot \mathbf{f} \rangle = -\langle \mathbf{v} \cdot \mathbf{D} \rangle = \epsilon$$

#### A breakdown of the contributions to p



The magnitude of the pressure gradient term also grows faster than the dissipation term.

#### A breakdown of the contributions to *p*

**3D** 

#### 2D



The magnitude of the pressure gradient term overwhelms the others.

# Main contributions to the third moment of the power

In 2D,  $-\langle \mathbf{v} \cdot \nabla P \rangle$  contributes to 2/3 of the third moment of p. Pressure contributes to the large, negative accelerations.

$$\langle p^3 \rangle \approx \langle (-\mathbf{u} \cdot \nabla P)^3 \rangle + \langle 3(-\mathbf{u} \cdot \nabla P)^2 (-\alpha \mathbf{u}^2) \rangle$$

In **3D**, the third moment of the pressure gradient term does not contribute; the third moment of p comes from cross-terms.

$$\langle p^3 
angle pprox 3 \langle (
u {f u} \cdot 
abla^2 {f u}) (-{f u} \cdot 
abla P)^2 
angle + 3 \langle ({f u} \cdot {f f}) (-{f u} \cdot 
abla P)^2 
angle$$

*Pressure forces*: in 3D, if anything, they contribute more to *large energy increases* than *energy losses*...

## Pressure gradient term is differently *skewed* in 2D and 3D!

3D





In 2D,  $-\langle \mathbf{v} \cdot \nabla P \rangle$  contributes to 2/3 of the (negative) skewness of p. In 3D, pressure gradient term is slightly positively skewed!

### Where does the skewness of *p* come from?

3D

2D



Dissipation term is skewed, but its third moment is small and does not contribute much to the skewness of power. However, cross terms do matter !



#### Peculiar behavior of pressure gradient

Pressure gradient term conditioned on the kinetic energy of the fluid particle: Note that  $\langle -{\bf v}\cdot \nabla P\rangle = 0$ 



In 3D, pressure gradient tends to take kinetic energy away from *slow* particles and give it to *fast* particles!

#### A runaway mechanism related to the singularity problem of the NSE?

## Summary

Can one detect time-irreversibility from the motion of particles ?

- With **2** particles or more: YES [Jucha et al, PRL, 2014; related to known-properties of turbulent flows]
- With *only 1 particle* ? YES [Xu et al, PNAS, 2014]!
- The irreversibility in the motion of single particles *IS* related to small-scale production [Pumir et al, PRL 2016].
- The normalized third moment of the instantaneous power on a fluid particle provides a good measure of how far the system is away from equilibrium.

### Perspectives

Concerning the physics of turbulence:

*much to be learned from studying the motion of particles in a turbulent flow !* 

From a broader perspective:

Turbulence: system very far from equilibrium [energy flux in 3D, several "fluxes" in other cases].

How does one quantify irreversibility ?

What does one relate possible manifestations of irreversibility to the existing fluxes in the problem ?

How does one generalize "statistical thermodynamics" to systems very far from equilibrium ?

What happens in other flow systems, of more geo/astro-relevance (with rotation and stratification, etc) ?

## THANK YOU !

## **Questions** ??

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### Numerical results



Homogeneous turbulent flow from the Johns Hopkins database ( $\eta$ =0.003; L=1.38).

All pairs have the exactly same length at t = 0, well within the inertial range.