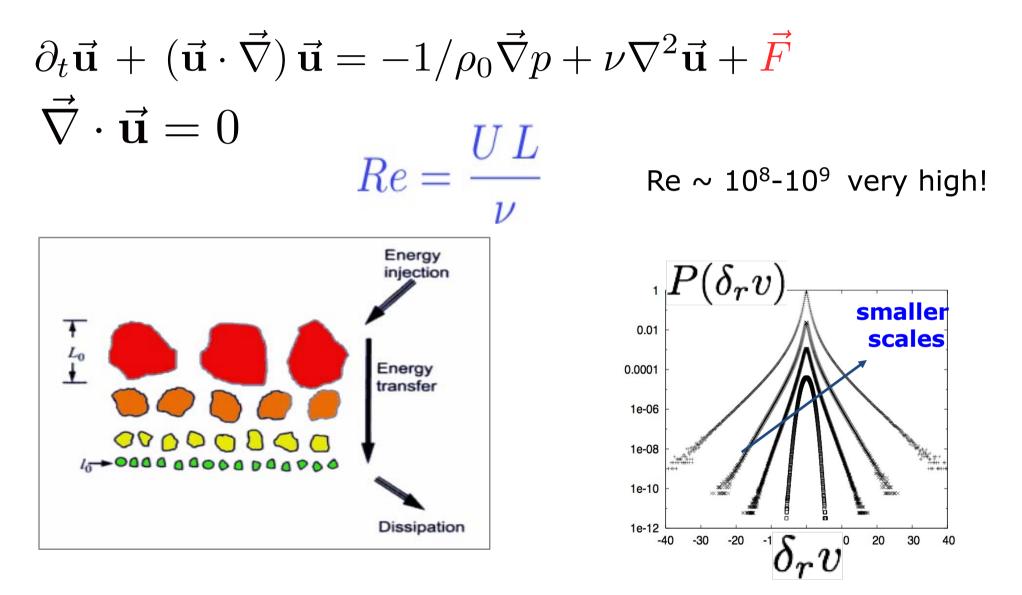
**CNR** Consiglio Nazionale delle Ricerche **ISAC** Istituto Nazionale di Scienze dell'Atmosfera e del clima

NCAR, 19 November 2015



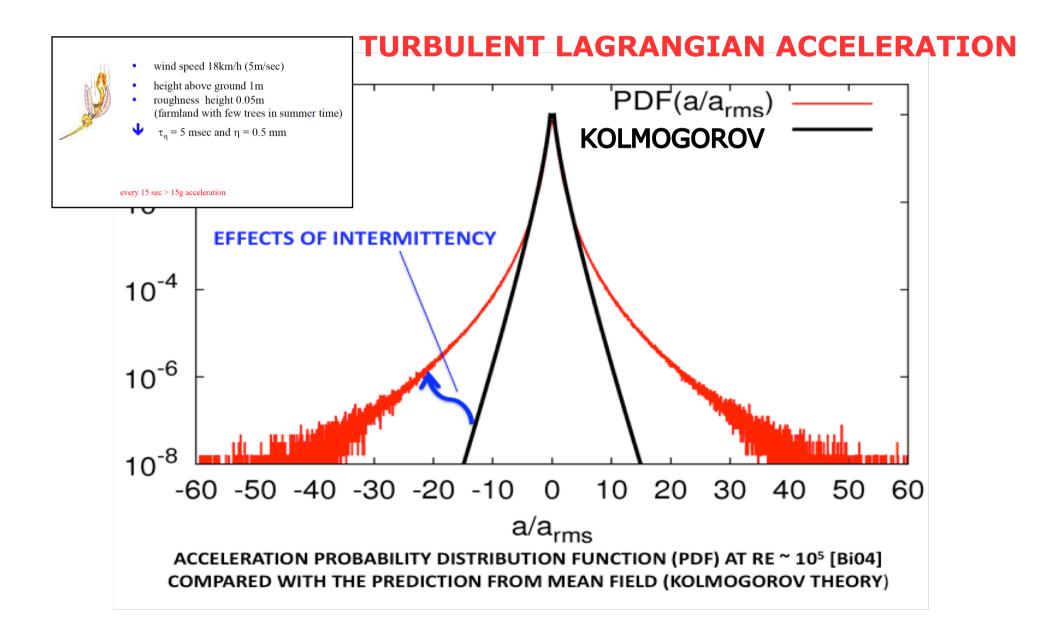
**Alessandra S. Lanotte** 

### Let's make it simple..3D isotropic turbulence



#### MULTI-SCALE PROCESS WITH STRONG BUT RARE FLUCTUATIONS e.g. VELOCITY GRADIENTS

### **TURBULENCE IS MUCH WORST IF YOU RIDE A PARTICLE!**



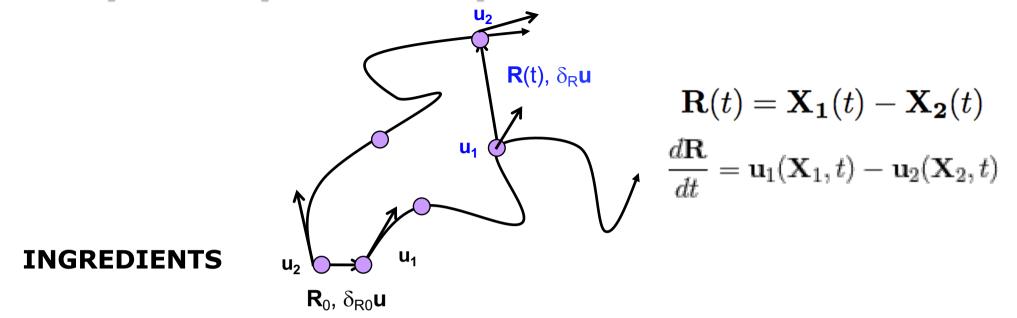
# Which are the difficulties in studying Lagrangian dispersion ?

- 1 need to accurately know the spatial statistics of the flow velocity along Lagrangian paths *high-resolution, high frequency*
- 2 need scale separation to disentangle different dispersion regimes: *exponential, ballistic, turbulent, mean shear, Taylor-like,..*
- 3 need to have high statistical accuracy : *long records* along *many* Lagrangian paths
- 4 need to limit the impact of *inhomogeneities* (walls, borders), *unsteadiness, anisotropies, stratification*

### **DIFFICULT TO FULLFILL ALL THESE!**

So observations have to be carefully examined

### How pairs of particles separate in flows ?



•Pair separation  $\mathbf{R}_0$  at time t=0

•Pair relative velocity at t=0:  $\delta_R \mathbf{u}(t=0) = \mathbf{u}_1(\mathbf{X}_1,t=0) - \mathbf{u}_2(\mathbf{X}_2,t=0)$ 

•Flow velocity statistics at t>0 :  $\delta_R \mathbf{u}(t) = \mathbf{u}_1(\mathbf{X}_1, t) - \mathbf{u}_2(\mathbf{X}_2, t)$ 

•If other forces act on the particles, also need :  $\delta_R \mathbf{a}(t) = \mathbf{a}_1(\mathbf{X}_1, \mathbf{u}_1, t) - \mathbf{a}_2(\mathbf{X}_2, \mathbf{u}_2, t)$ 

#### Looking for the mean behaviour $\rightarrow eddy diffusivity D(R,t) = d < R^2 > /dt$

$$D_{Ric}(R,t) \equiv \frac{1}{2} \frac{d}{dt} \langle \mathbf{R}^2 \rangle \equiv \langle \delta_R \mathbf{u}(\mathbf{R},t) \cdot \mathbf{R}(t) \rangle \equiv \int_0^t \langle \delta_R \mathbf{u}(\mathbf{R}(t),t) \delta_R \mathbf{u}(\mathbf{R}(s),s) \rangle ds$$

Richardson theory in the light of  
Kolmogorov-Obukhov theory
$$R(t) = \mathbf{X}_{1}(t) - \mathbf{X}_{2}(t) \qquad u_{1}(\mathbf{X}_{1}, t)$$

$$R(t) = \mathbf{X}_{1}(t) - \mathbf{X}_{2}(t) \qquad u_{1}(t) - \mathbf{X}_{2}(t) \qquad u_{2}(t) \qquad u_{2}(t) = \mathbf{X}_{2}(t)$$

$$R(t) = \mathbf{X}_{1}(t) - \mathbf{X}_{2}(t) \qquad u_{1}(t) - \mathbf{X}_{2}(t) \qquad u_{2}(t) = \mathbf{X}_{2}(t)$$

$$R(t) = \mathbf{X}_{2}(t) + \mathbf{X}_{2}(t) \qquad u_{2}(t) = \mathbf{X}_{2}(t) \qquad u_{2}(t) = \mathbf{X}_{2}(t)$$

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$$R(t) = \mathbf{X}_{2}(t) \qquad u_{2}(t) = \mathbf{X$$

Having used Kolmogorov 1941 scaling for 3D turbulence

$$\langle \delta_r \mathbf{u}(\mathbf{r}_{\parallel})^2 \rangle \propto \epsilon^{2/3} r^{2/3}; \qquad \tau_r \propto (r^2/\epsilon)^{1/3}$$

### **Richardson's theory for pair dispersion (1926)**



**Diffusive approach: Fokker-Planck eq.** 

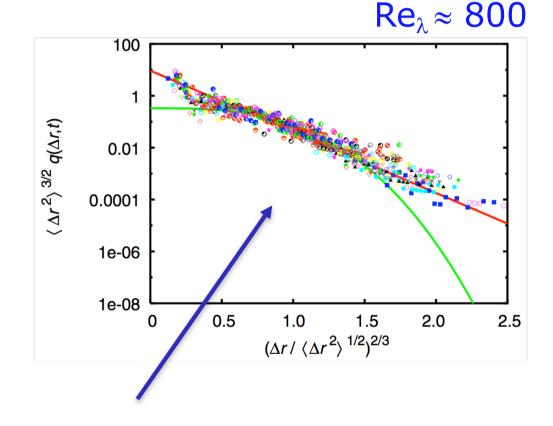
$$\partial_t P(R,t) = \frac{1}{R^2} \frac{\partial}{\partial_R} \left[ D_{Ric}(R,t) \ R^2 \ \frac{\partial P(R,t)}{\partial_R} \right]$$
$$D_{Ric}(R,t) \simeq R^{4/3} \text{ scale-dependent eddy diffusivity}$$

Asymptotic Prob. Density Funtion  $P(R,t) \simeq \frac{R^2}{t^{9/2}} \exp(-CR^{2/3}/t) \quad \begin{array}{l} \textit{PDF P(R,t) is non-Gaussian AND} \\ \textit{non-intermittent} \end{array}$   $\begin{array}{l} \textbf{Second order moment} \\ \textbf{Second order moment} \\ \textbf{Second order moment} \\ \textbf{Super-Diffusive particle} \\ \textit{separation in time} \end{array}$ 

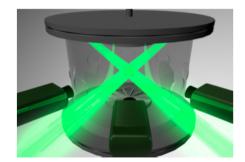
## **Do we observe Richardson dispersion?**

Laboratory experiments for 3D Homogeneous and Isotropic turbulence

An experimental study of turbulent relative dispersion models, Ouellette et al., New Journ. Phys. 2006



f(Hz)	$R_{\lambda}$	$u'_r ({ m ms}^{-1})$	$u'_z$ (ms <sup>-1</sup> )	$\epsilon$ (m <sup>2</sup> s <sup>-3</sup> )	$\eta(\mu m)$	$L/\eta$	$\tau_{\eta}$ (ms)	$T_L/\tau_\eta$	FPS	$\delta t \ ({ m ms})$	$\tau_{\eta}/\delta t$
0.30	200	0.039	0.026	$7.09 \times 10^{-4}$	192	365	36.8	51	1000	1.00	37
0.43	240	0.056	0.038	$2.03 \times 10^{-3}$	146	479	21.3	61	1600	0.625	34
0.62	290	0.083	0.054	$6.26 \times 10^{-3}$	111	630	12.3	74	3000	0.333	37
0.90	350	0.121	0.080	$2.01 \times 10^{-2}$	84	830	7.11	88	5000	0.200	36
1.29	415	0.181	0.116	$6.17 \times 10^{-2}$	64	1090	4.12	106	9000	0.111	37
1.86	500	0.262	0.169	0.196	49	1433	2.39	127	27000	0.037	65
3.50	690	0.487	0.315	1.24	30	2337	0.897	176	27000	0.037	24
5.00	815	0.669	0.440	3.39	23	3087	0.544	208	27000	0.037	15



#### Richardson PDF is observed but in a narrow range

### **POINT SOURCE EMISSION**

DIRECT NUMERICAL SIMULATIONS of 3D HOMOGENEOUS AND ISOTROPIC FLOW

$$\partial_t \vec{\mathbf{u}} + (\vec{\mathbf{u}} \cdot \vec{\nabla}) \vec{\mathbf{u}} = -1/\rho_0 \vec{\nabla} p + \nu \nabla^2 \vec{\mathbf{u}} + \vec{\mathbf{I}}$$

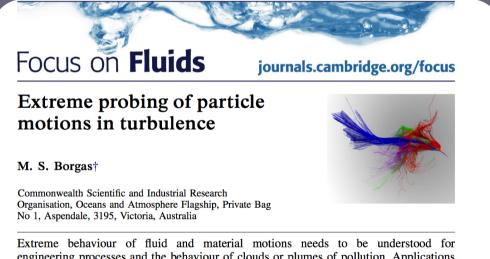
Cubic periodic box  $1024^3$  resolution,  $Re_{\lambda} \sim 300$ Flow is seeded with  $4*10^{11}$  pairs for each particle family from different point sources

# tracer $\dot{\mathbf{X}}(t) = \mathbf{u}(\mathbf{X}(t), t)$

Heavy particle

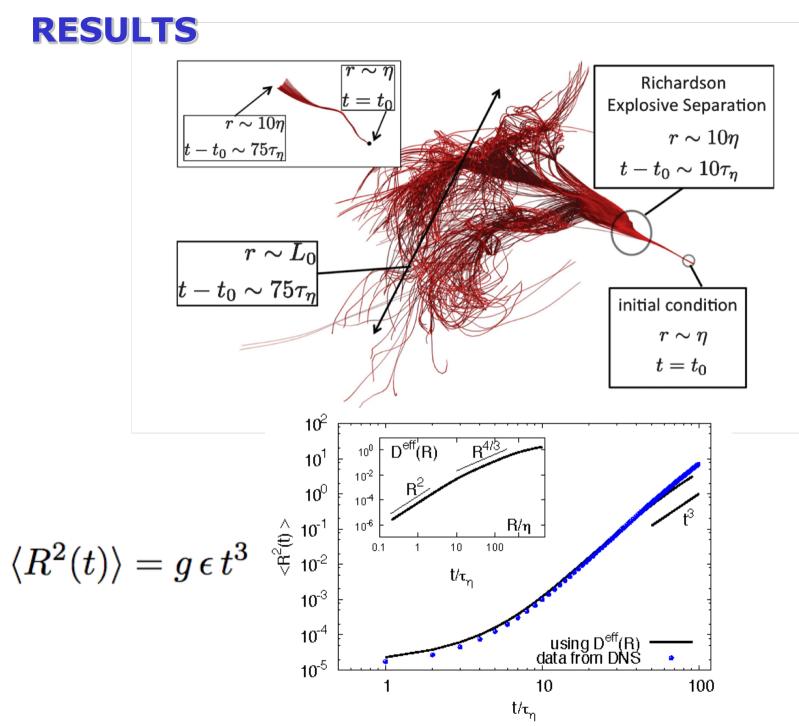
$$\ddot{\mathbf{X}}_p(t) = rac{\mathbf{u}(\mathbf{X}_p(t), t) - \dot{\mathbf{X}}_\mathbf{p}(t)}{ au_p}$$

$$St = 0.1; 0.6; 5$$



engineering processes and the behaviour of clouds or plumes of pollution. Applications in the natural environment require scaling of turbulence behaviour and models beyond current computational or laboratory understanding. New computational studies of Biferale *et al. (J. Fluid Mech.*, 2014, vol. 757, pp. 550–572) are probing new regimes of scaling of extreme random events in nature produced by turbulent fluctuations trending towards applications in environmental prediction.

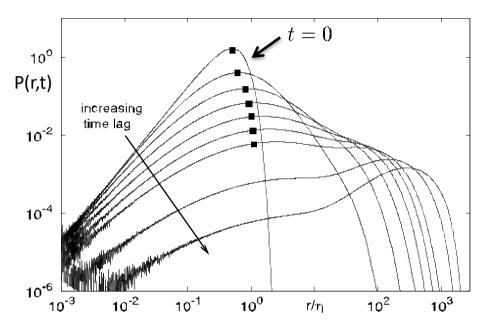
Key words: intermittency, turbulence simulation, turbulent mixing



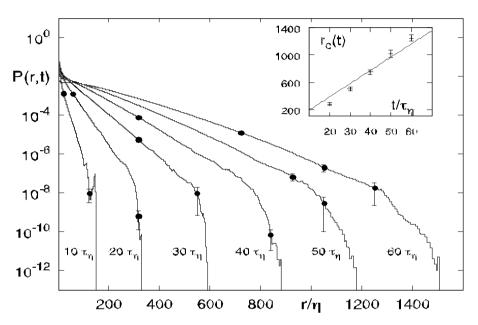
# Slowest and fastest separation events

#### **Slowly separating pairs**

**Fast separating pairs** 

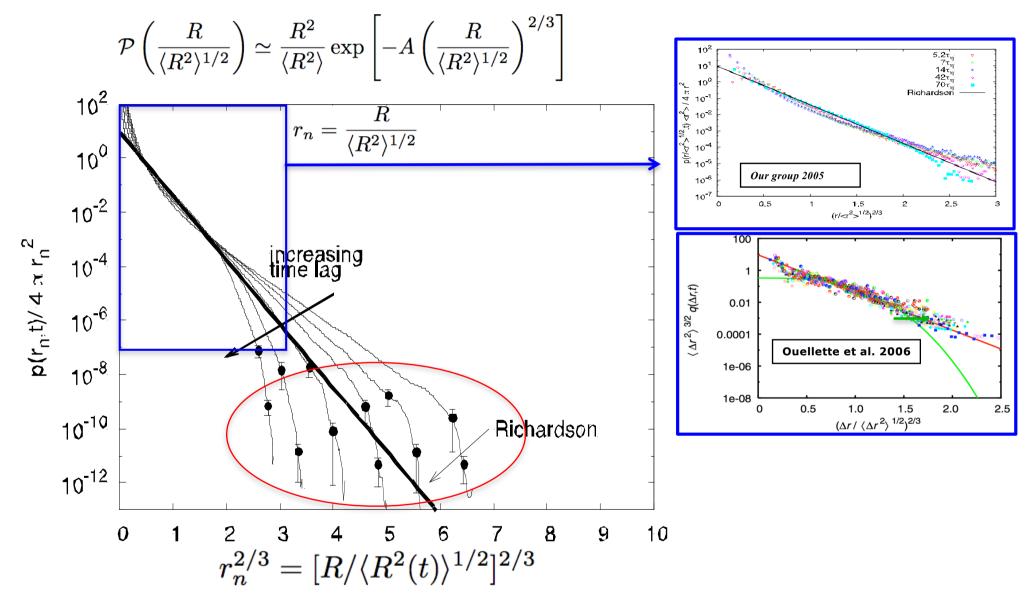


- Presence of a peak at sub-diffusive separations at every time.
- This behavior is due to emissions that do not separate efficiently in the flow (*very small strain at initial times*).



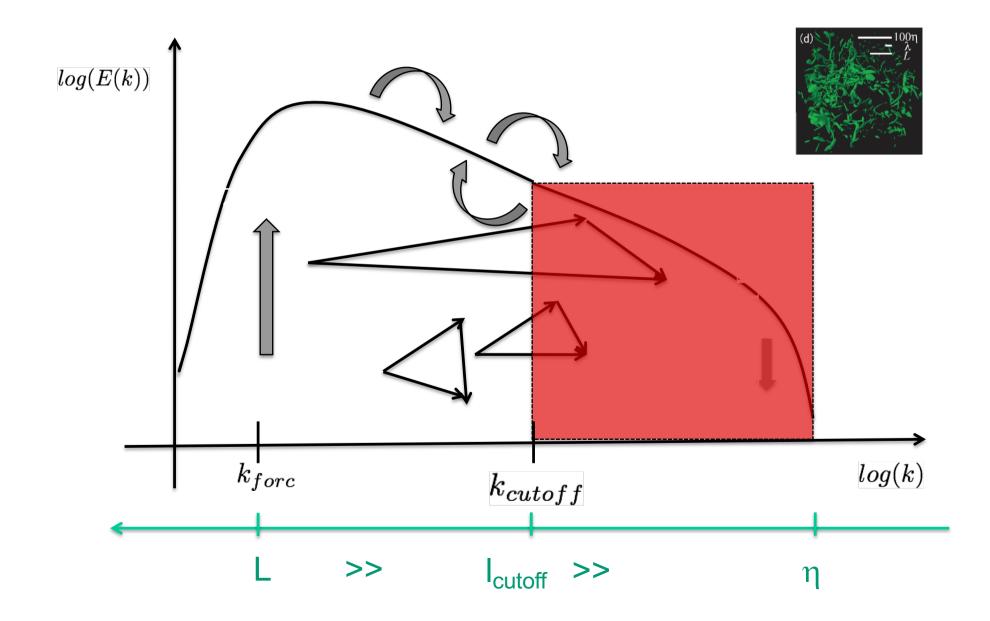
- Exponential-like tails with a sharp drop at a cut-off separation  $r_c(t)$ .
- This cut-off scale is the signature of tracer pairs experiencing a persistent high relative velocity, which is limited by U<sub>rms</sub>

# **PAIR SEPARATION DISTRIBUTION P(R,t)**

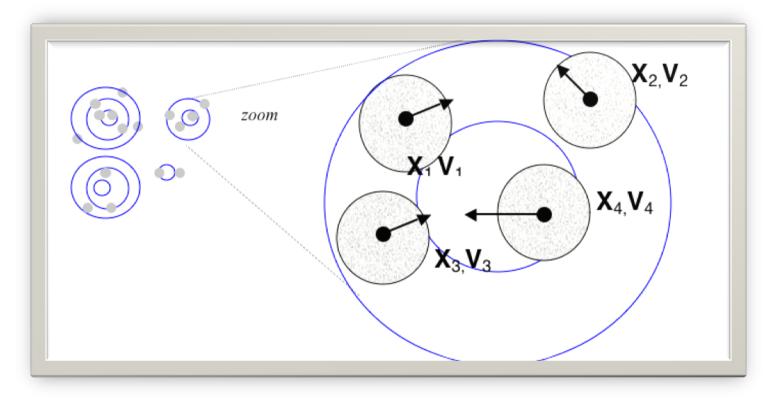


**EXTREME FLUCTATIONS:** are present at all times, detectable with high statistics only (*not high Re!!*)

# **SWITCH TO REAL WORLD!**



#### **NEW NEW: N-particle Lagrangian Sub-Grid Scale Model**

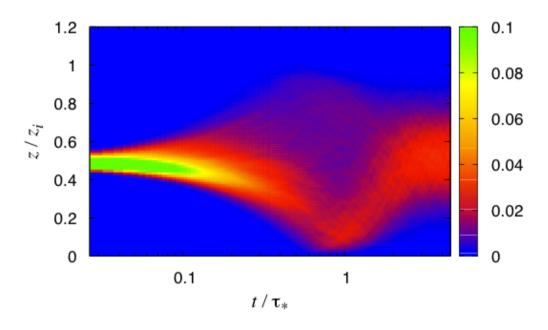


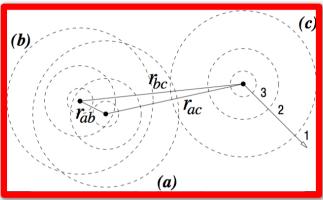
The idea is that all particles within a given **spatial scale** / <= L should be correlated with proper **time scale and energy content**.

Particles should *feel* a multiple scale velocity field, with correct space & time properties, i.e. from Kolmogorov type of spectrum

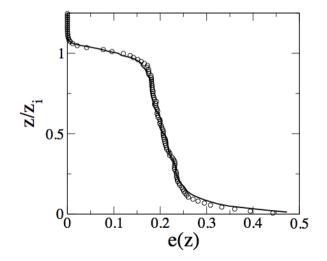
## Large-eddy simulation with Lagrangian Dispersion

*Emission from line source in a Convective Planetary Boundary Layer (PBL)* 



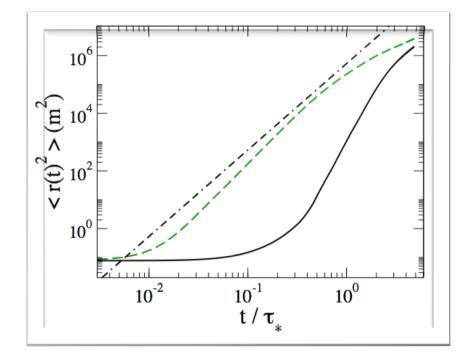


The energy dissipation rate from the SGS particle model(o) and the SGS Eulerian (line)



- 5km x 5km x 2 km domain
- 128 x 128 x 128 grid points  $\rightarrow$  39m x39m x16 m
- Dynamic SGS models for Eulerian fields
- NEW Lagrangian SGS for tracer trajectories
- Npairs ~ 16000
- Ntetrads ~13000
- Particle have N=28 sgs modes, from I=1m to L=78m

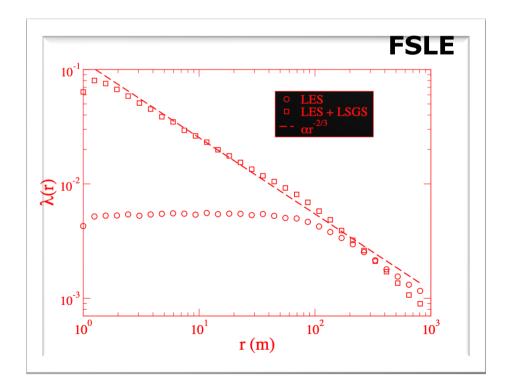
# **Results for pair separation 2<sup>nd</sup> moment**



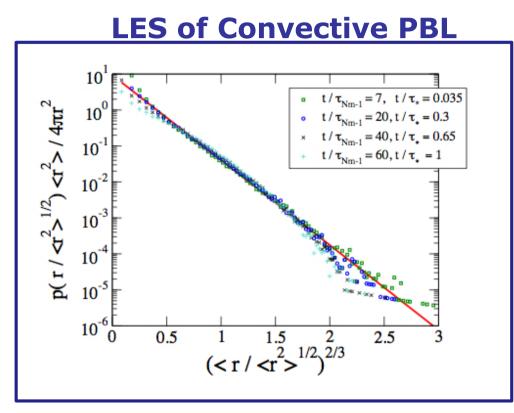
$$\langle R^2 
angle \propto t^3$$

$$\lambda(R) = \frac{1}{\langle T(R) \rangle} \simeq R^{-2/3}$$

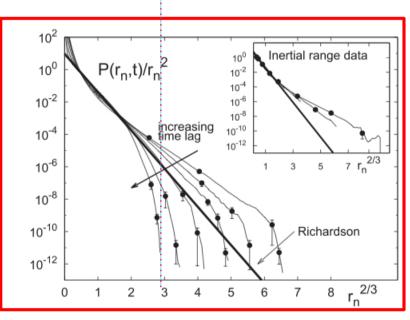
Without the Lagrangian SGS model, the time T(R) it takes for a pair to separate would be independent of R



# **PAIR SEPARATION DISTRIBUTION P(R,t)**



Richardson PDF is observed with good accuracy i agreement with current experiments.



#### **DNS of Homogeneous Isotropic flow**

# Conclusions

- ->**Turbulent relative dispersion is challenging**, theoretically and in applications of transport and mixing
- -> Richardson 4/3 law is the theory of reference, but not fully satisfying difficulties arise from :
- flow intermittency
- finite Reynolds effects
- temporal correlations along Lagrangian trajectories
- -> Lagrangian Particle Models, as the one proposed, have to correctly reproduce N-particle spatial and temporal correlations
- ->Challenges from real flows with **anisotropies**, **stratification**,...need further work

L. Biferale, A.S. Lanotte, R. Scatamacchia, F. Toschi, Journ. Fluid Mech. 757, 2014 Intermittency in the relative dispersion of tracers and heavy particles in turbulent flows

I.M. Mazzitelli ,F. Toschi, A.S. Lanotte, Phys. Fluids 26 (9) 2014 An accurate and efficient Lagrangian subgrid model

I.M. Mazzitelli, F. Fornarelli, A. S. Lanotte, P. Oresta, Phys. Fluids 26 (9) 2014 Pair and multi-particle dispersion in numerical simulations of convective boundary layer turbulence