# Collision of inertial particles in turbulent flows.

Alain Pumir, INLN (France)

Grisha Falkovich, Weizmann Inst. (Israel)

Introduction (1)

Particles advected by a fluid flow, with a mass that does not match the fluid density, have a nonuniform distribution in space.

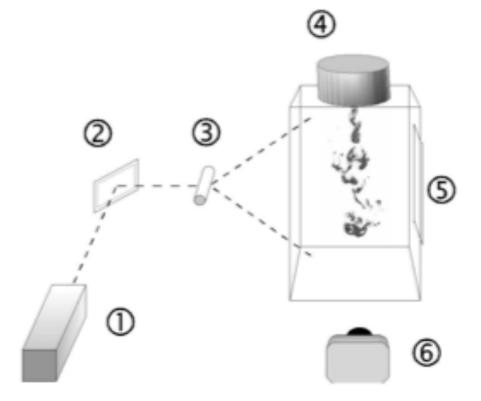
Here, focus on the case of **particles heavier than the fluid.** 

#### Interesting questions:

- characterize the distribution of particles in the flow.
- estimate the collision rates between particles.

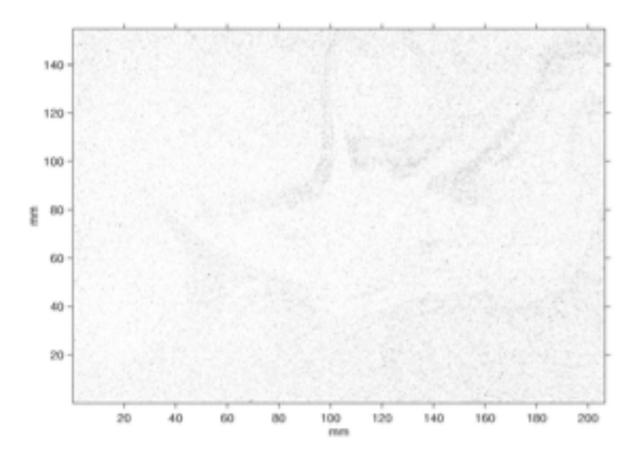
Applications coalescence of droplets in clouds (how long does it take before rain falls ?)

## Preferential concentration in a cloud chamber



Experimental observation (from A. Jaczewski and S. Malinowski, 2005)

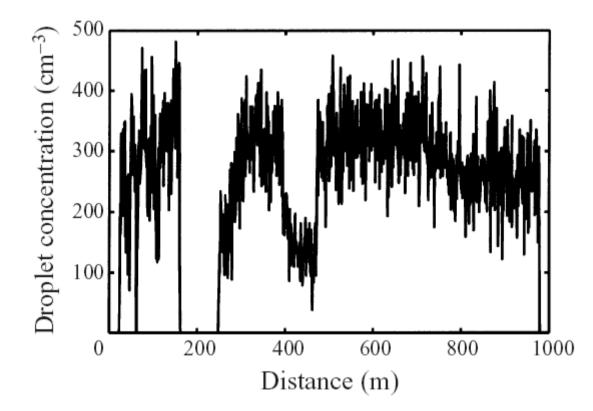
### Preferential concentration in a cloud chamber



Droplet density in a laboratory flow (Re ~  $10^3$ ; St ~ 0.02) (from A. Jaczewski and S. Malinowski, 2005)

### Preferential concentration in clouds

A. B. Kostinski and R. A. Shaw



Recorded density of clouds in a cumulus (Re ~  $10^7$ ; St ~ 0.01) From A. Kostkinski and R. Shaw, 2000.

#### Introduction (2)

Here, consider a *dilute* suspension :

the mean distance between particles is large enough, so the motion of one particle does not influence the motion of other particles.

The particles' density, n(x,t), evolves according to (v = particle's velocity) :

$$\partial_t n(x,t) + \nabla .(v(x,t)n(x,t)) = 0$$

**Preferential concentration** is a *small scale effect*; it is most significant at scales *smaller* than the Kolmogorov scale.

### Physical origin of preferential concentration.

#### Inertial particles do not exactly follow the flow !!

- u = flow velocity; ρ= fluid density;
- v = particle velocity;  $\rho_0$ = particle density;

 $V \neq \mathcal{U}$ 

$$\frac{dv}{dt} = \beta \frac{du}{dt} + \frac{(u-v)}{\tau_s} + g$$

$$\tau_s = (2/9)(\rho_0/\rho)(a^2/\upsilon) \qquad \beta = \frac{3\rho}{(\rho + 2\rho_0)}$$

For very heavy particles :  $\rho \ll \rho_0 \ (\beta \sim 0)$ .

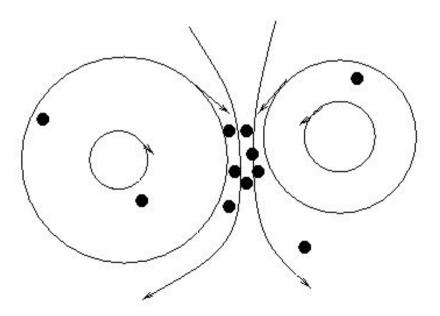
### Preferential concentration : small Stokes numbers (1).

When  $\tau_s$  is short :  $v = u - \tau_s(\partial_t u + (u.\nabla)u) + g\tau_s \approx u$ 

So: 
$$\nabla v = -\tau_s \nabla \{(u.\nabla)u\} = -\tau_s (S^2 - \Omega^2)$$

Where S = rate of strain,  $\Omega$  = vorticity.

Heavy particles are expelled from vortices.



### Preferential concentration : small Stokes numbers (2).

At small values of St =  $\tau_s/\tau_K$ :

$$v = u - \tau_s(\partial_t u + (u \cdot \nabla)u) + g\tau_s \approx u + O(St)$$

the particle and fluid velocities are close to one another.

Preferential concentration can be understood by studying lagrangian trajectories (dx/dt = u), and by studying the density n, that follows :

$$\frac{d}{dt}n(x,t) = -(\nabla .v)n(x,t)$$

Balkovsky et al, 2001, Falkovich et al., 2002,2004.

### Preferential concentration : Stokes numbers ~ 1 (1)

At larger St, possibility of sling effect (Falkovich et al, 2002).

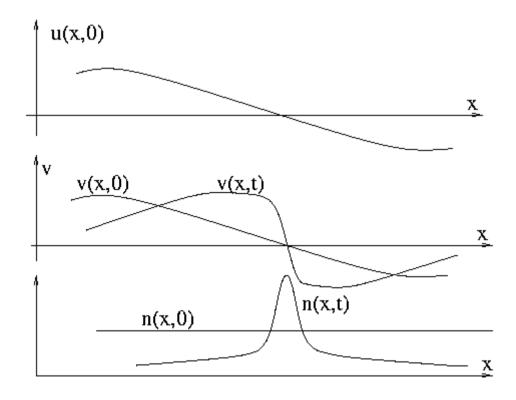
Consider again the equation for the particle velocities, v, and differentiate w.r.t. x  $(s_{ij} = \partial_i u_j; \sigma_{ij} = \partial_i v_j)$ 

$$\frac{d\sigma}{dt} + \sigma^2 = \frac{(s - \sigma)}{\tau_s}$$

**Burgers** type equation !

### Preferential concentration : Stokes numbers ~1 (2)

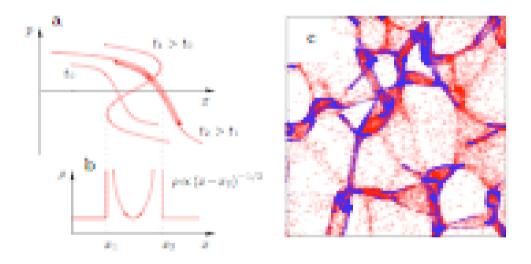
*Burgers-like* behavior : in 1-d, when  $\sigma_{ij}$  becomes too small ( $\sigma_{ij} < -1/\tau_s$ ), the gradient blows-up, along with the density n :  $\sigma_{ij} \sim (t_0-t)^{-1} \sim n$ .



Falkovich et al., 2002.

### Preferential concentration : Stokes number ~ 1 (3)

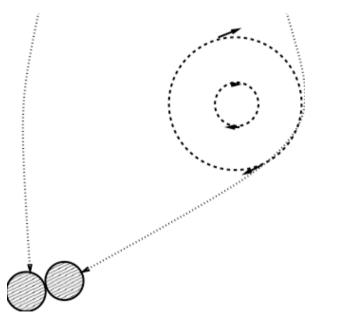
Geometrical point of view : appearance of caustics for the distribution of n.



Wilkinson and Mehlig, 2005

### Preferential concentration : Stokes number ~ 1 (4)

The divergence of  $\sigma$  at (x,t) indicates that particles originating from different regions of space run into each other at (x,t).



**Questions** : frequency of these blow up events ? Contribution to the collision rate ??

### Preferential concentration : large Stokes numbers (5)

Question : what happens after a blow-up ?

The particle velocity derivative tensor is naturally regularized after the explosion.

From a mathematical point of view :

So:  

$$\frac{d\sigma}{dt} + \sigma^{2} = 0 \Leftrightarrow \frac{d}{dt}(\frac{1}{\sigma}) = +1$$

$$(\frac{1}{\sigma}) = (t - t_{0}) \Rightarrow \sigma \approx \frac{1}{(t - t_{0})}$$

Effectively, when  $\sigma$  becomes too large, the sign of  $\sigma$  flips !

nb : the density increases temporarily during the blow-up event, as it should.

### Summary

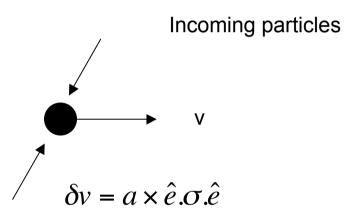
Two main physical effects :

- Particles do not exactly follow the flow, and their effective velocity is *compressible*. The effect exists for all Stokes numbers.

- A 'sling effect', due to the fact that particles originating from very different regions occasionally run into each other. The effect is important only when the Stokes number is high enough.

### Collision rates (1)

Regular contribution :



Flux of incoming particles on one given particle :

$$K_{reg} = \int_{\hat{e}.\sigma.\hat{e}<0} n \times a^2 \times a \times (\hat{e}.\sigma.\hat{e}) d\Omega \ (\propto a^3)$$

### Collision rates (2)

Regular contribution :

Estimate the collision rate in the case of an homogeneous, isotropic turbulent flow.

Number of collision per particle of size a per unit time at small St (Saffman and Turner) :

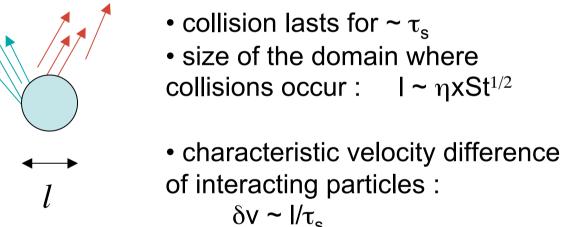
$$N_{ST} = n \times (2a)^3 \times (8\pi\varepsilon/15\nu)^{1/2}$$

**Empirical observation** : the Saffman-Turner formula seriously understimates the collision rates. This is a manifestation both of the nonhomgeneous distribution of particles, and of the 'sling effect'.

### Collision rates (3)

Sling contribution (phenomenological estimate; for St ~ 1) :

During the blow-up of  $\sigma$ , the gradient s > 1/ $\tau_s$ , in a region of size: I ~  $(v \times \tau_s)^{1/2} \sim \eta \times St^{1/2}$ 



Estimate of the number of collisions during the sling event :

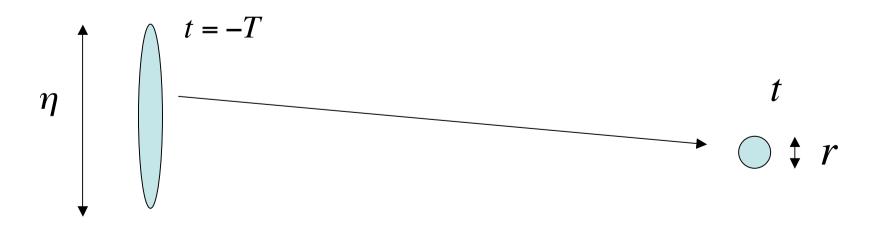
$$N_{sling} \approx 4\pi a^3 n(\tau)(l/a) \approx 4\pi a^2 \times l \times n(\tau) \ (\propto a^2)$$

### Estimation of the concentration of particles at a scale r (1)

**Objective** : estimate the coarse-grained distribution of the density at a scale r (r <  $\eta$ ),  $\langle n^2 \rangle$ 

The general idea : as the fluid evolves, small scales are generated.

To estimate  $\langle n^2 \rangle_r$ , consider a parcel of fluid with a characteristic size r. This parcel of fluid comes from a parcel at an earlier time (-T) which was at scale  $\eta$ .



### Estimation of the concentration of particles at a scale r (2)

Method (Falkovich et al, 2002, 2004).

- Determine the particle trajectory that arrives at point r, at time t.
- Keep track of the deformation of volume induced by the fluid element. To this end, compute the tensor W, such that W(t)  $\delta I(0) = \delta I(t)$ :

$$\frac{dW}{dt} = (\sigma.W + W.\sigma^T)$$

• Find the time -T, such that W(-T) =  $\eta$  Id

and that the smallest eigenvalue of W(0) = r.

• The contribution to the coarse grained density at scale r is :

$$n = n_0 \exp(\int_{-T}^{0} \exp(-tr(\sigma(t'))dt'))$$

Statistical weight of each trajectory ~ 1/n

#### Numerical methods (1)

• Solve the Navier-Stokes equations in the simplest possible geometry (cube with periodic boundary conditions), using standard pseudo-spectral methods => generate the velocity field u(x,t)

• In the flow, follow the motion of inertial particles :

$$\frac{dv}{dt} = \frac{(u-v)}{\tau_s} + g$$

along with the equation of evolution for  $\sigma = dv/dx$  :

$$\frac{d\sigma}{dt} + \sigma^2 = \frac{(s - \sigma)}{\tau_s}$$

-In addition, keep track of the deformation matrix W, induced by  $\sigma$ :

$$\frac{dW^{-1}}{dt} = -(W^{-1}.\sigma + \sigma^T.W^{-1})$$

### Numerical methods (2)

• Keep track of the density n of particles :

$$n(x,t) = n_0 \exp\left(-\int_0^t tr(\sigma(t'))dt')\right)$$

• When  $|W^{-1}(t)|$  exceeds  $\eta/r$ , record n, compute the moments and the contributions to the collision terms.

Technically, work in the range of Reynolds numbers (fully resolved flows) :

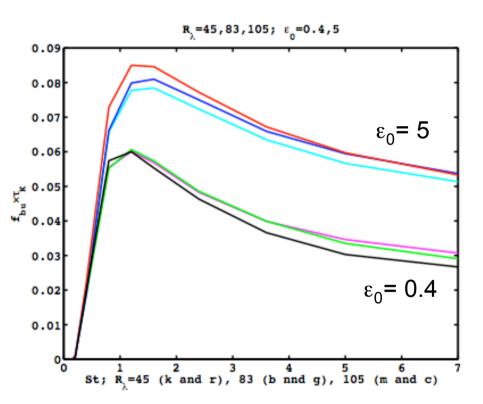
$$21 < R_{\lambda} < 130$$

### Numerical results

### Blow-up frequency (1)

Observations :

- At very small Stokes numbers, the blow-up frequency is  $\sim 0$ .
- The probability of blow-up increases up to a maximum value of St ~ 1, then decreases again.
- The blow-up frequency is weaker when gravity is stronger.

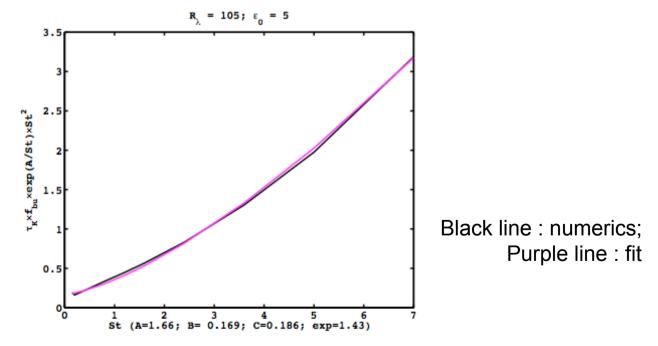


### Blow-up frequency (2)

Fit of the blow up frequency :

$$f_{bu} = \exp(-A/St) \times St^{-2} \times (B + CSt^{n})$$

n.b. : the exp(-A/St) -dependence can be fully justified in 1d; see Derevyanko et al., 2006; see also Wilkinson et al, 2006.



### Blow-up frequency (3)

• The value of A decreases slightly with  $R_{\lambda}$ 

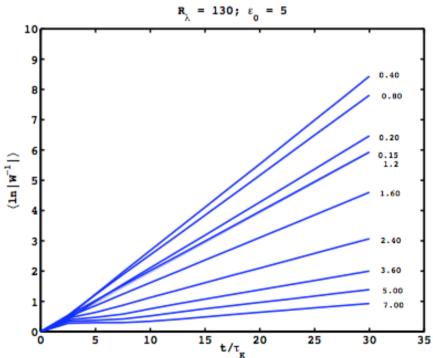
 $(A(R_{\lambda}=45) = 2.1; A(R_{\lambda}=83) = 1.85 \text{ and } A(R_{\lambda}=105)=1.70).$ 

• Increasing  $\varepsilon_0$  above 5 (decreasing gravity) does not change anything;  $\varepsilon_0$ =5 corresponds effectively to the very low gravity case.

• The main difference between low gravity ( $\epsilon_0$ =5) and higher gravity ( $\epsilon_0$ =0.4) is mostly in the coefficient C.

### Rate of compression along trajectories (1)

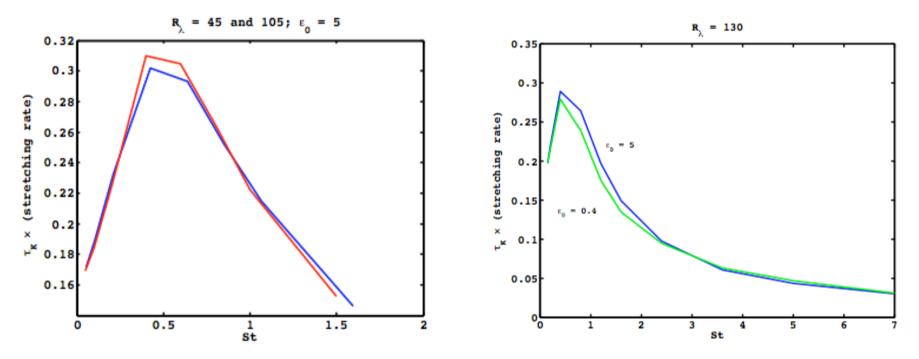
The rate at which a parcel of particles gets compressed plays a crucial role in this work.



W<sup>-1</sup> grows exponentially in time => exponential contraction along trajectories.

### Rate of compression along trajectories (2)

The rate of growth has a nonmonotonic dependence as a function of the Stokes number.

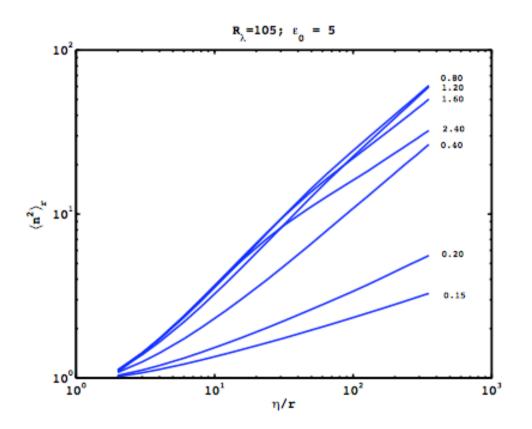


Remarks : for St = 0, the compression rate ~  $0.166/\tau_{K}$ . limited dependence as a function Reynolds and of gravity.

### Spatial dependence of $\langle n^2 \rangle_r$ (1)

Approximate power-law dependence of  $\langle n^2 \rangle_r$ :

 $< n^2 >_r \sim r^{\alpha}$ 



### Spatial dependence of $\langle n^2 \rangle_r$ (2)

(approximate) power law dependence of  $\langle n^2 \rangle_r$  as a function of r : plot  $\alpha$  = dln<n<sup>2</sup>><sub>r</sub>/dlnr.  $R_1 = 105; \epsilon_0 = 5$ 0.9 0.8 .20 0.7 0.80 0.6 1.60 0.40 ರ 0.5 2.40 0.4 0.20 0.3

0.2

0.1

0 10<sup>0</sup>

Plausible power law at low Stokes; more complicated behavior at higher Stokes numbers.

10<sup>1</sup>

0.15

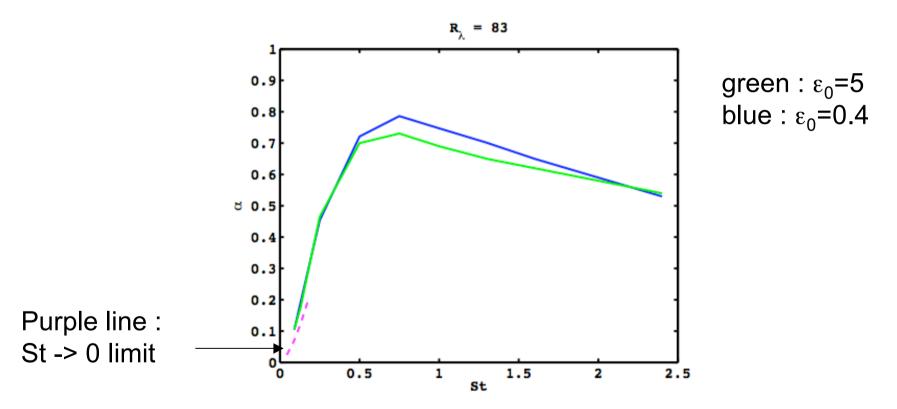
 $\eta/r$ 

10<sup>2</sup>

10<sup>3</sup>

### Spatial dependence of $<n^2>_r$ (3)

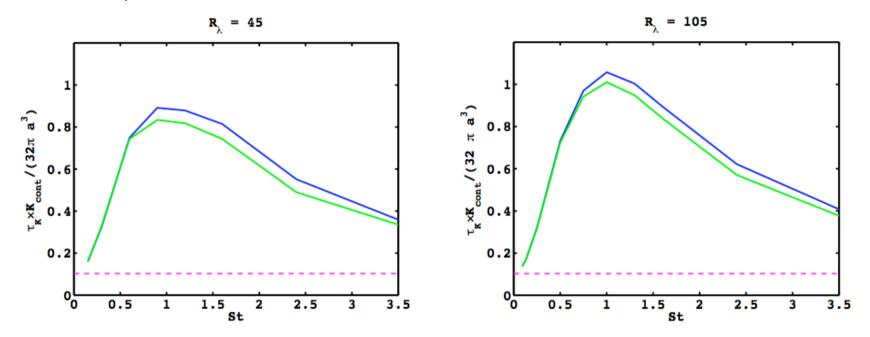
Compare with the zero Stokes limit (Falkovich and Pumir, 2004).



The 'St -> 0' limit slightly underestimates the exponents.

### Collision rate (1)

Continuous part of the collision rate.



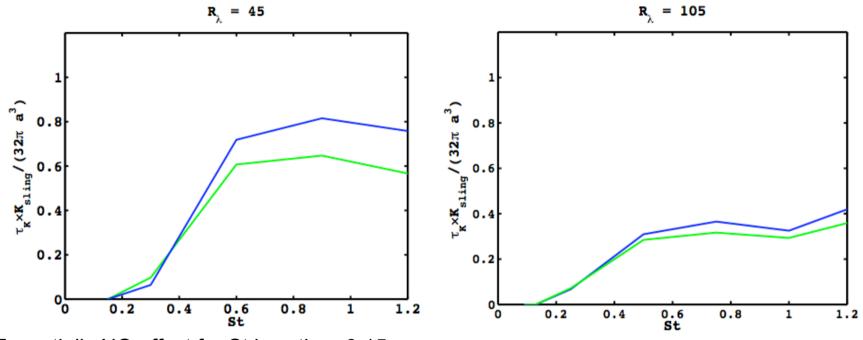
Enhancement of the collision rate with respect to the Saffman-Turner formula (purple line).

The collision rate has a maximum for  $St \sim 1$ .

Slight growth of the effect when  $R_{\lambda}$  increases.

### Collision rate (2)

Sling contribution to the collision rate.



Essentially NO effect for St less than 0.15 or so.

The effect Is maximum for  $St \sim 1$ .

Dependence as a function of the Reynolds number ??

### Collision rate (3)

Comparison with direct numerical simulations (Franklin et al, 2005).

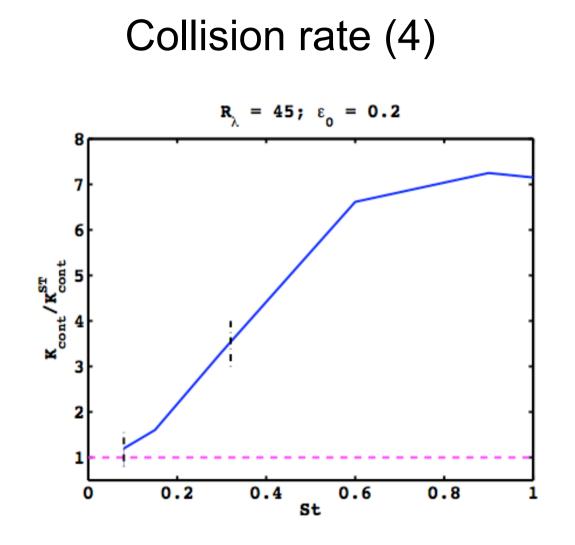
- Numerical work at lowish Reynolds numbers ( $R_{\lambda} \sim 50$ ); where collision rates in a monodisperse solution of bubbles of size a = 10µm and 20µm at low density are computed.
  - => Compare the results of the 'lagrangian approach' of the full DNS/kinetic results.

Collision rate ( $R_{\lambda}$ =48; a = 10µm; St = 0.08) : 1.0 x 10<sup>-6</sup> cm<sup>3</sup>/s

 $0.9 \times 10^{-6} \text{ cm}^{3}/\text{s}$  (+ 0 sling term)

Collision rate ( $R_{\lambda}$ =48; a = 20µm; St = 0.32) : 5.9 x 10<sup>-5</sup> cm<sup>3</sup>/s

2.2 x 10<sup>-5</sup> cm<sup>3</sup>/s (+ ~1cm<sup>3</sup>/s sling contribution)



The enhancement wrt. the Saffman-Turner formula becomes more siginificant as the Stokes number increase.

### Conclusion

• The problem of advection of inertial particles by a turbulent flows offers a number of interesting challenges, ranging from fundamental questions to very practical (meteorological applications, among others).

• Much can be learned by stydying particle trajectories (lagrangian approach).

• Two different physical regimes : St << 1 and St ~ 1, the latter being characterized by the spontaneous formation of **caustics**, which are responsible for '**sling** events'.

• Lagrangian methods can be used to estimate rather reliably the collision rates of particles.

• Intriguing questions remain.

### Acknowledgement

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