

Particle Collisions in Turbulent Flows

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Laboratoire de Physique

13 December 2013





Vorhersagediagramm der Station Münster/Westfalen

Vorhersagediagramm für die Station Münster/Westfalen vom 18.11.2013 15:00 Uhr (alle Zeiten in MEZ) (c) Meteodata

Temperatur

12-Stunden-Maximum

12-Stunden-Minimum

in °C

Windböen

Windgeschwindigkeit

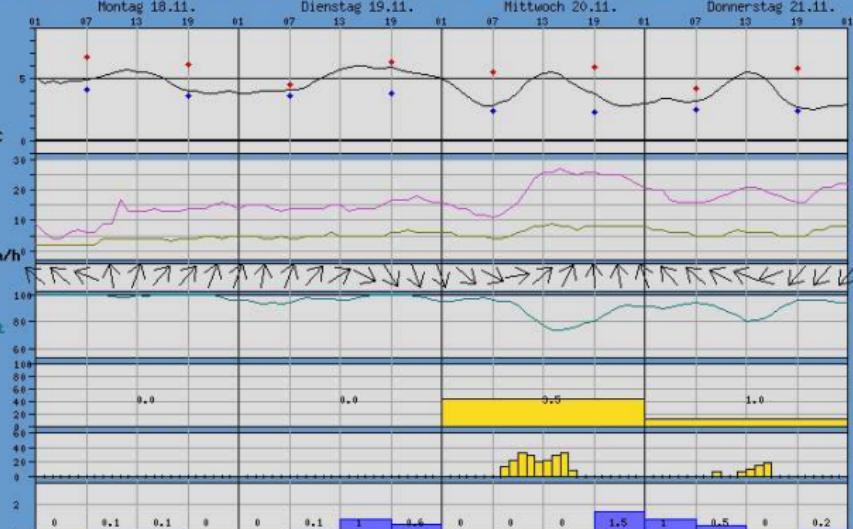
in km/h

Windrichtung

rel. Luftfeuchtigkeit

Sonnenscheindauer
am Tage
(% und Stunden)Sonnenscheindauer
stündlich (Minuten)

Niederschlag 6h (mm)



wetterstationen.meteomedia.de

www.meteomedia.de - www.unwetterzentrale.de - www.meteomedia.ch - www.meteocentrale.ch -

www.meteo-info.be - www.vejrcentral.dk - www.vigilance-meteo.fr - www.meteo-allerta.it -

Vorhersagediagramm der Station Münster/Westfalen

Vorhersagediagramm für die Station Münster/Westfalen von 18.11.2013 15:00 Uhr (alle Zeiten in MEZ) (c) Meteodata

Deutschland

Baden-Württemberg

Bayern

Brandenburg/Berlin

Hessen

Mecklenburg-Vorpommern

Niedersachsen/Bremen

Nordrhein-Westfalen

Rheinland-Pfalz/Saarland

Sachsen

Sachsen-Anhalt

Schleswig-Holstein/Hamburg

Thüringen

Schweiz

Österreich

Liechtenstein

Belgien

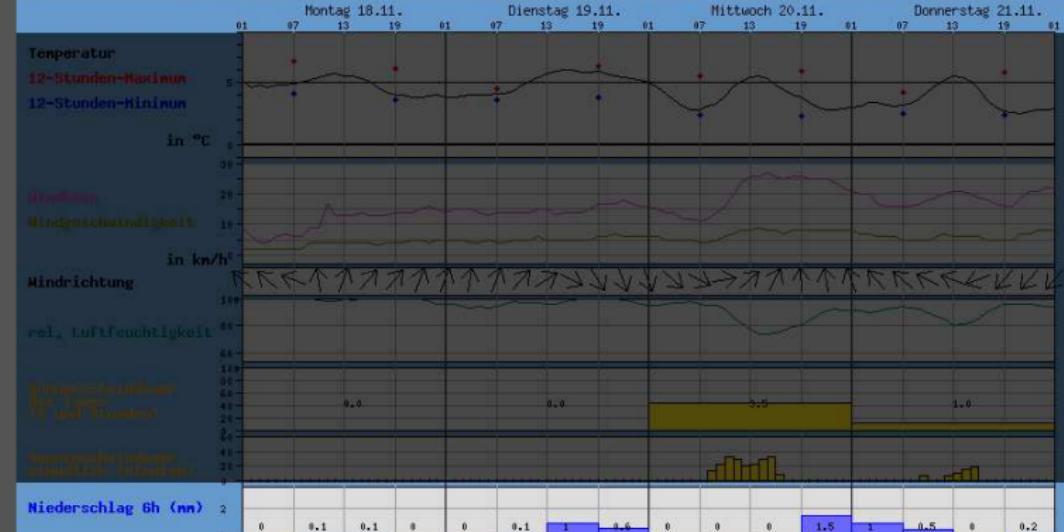
Dänemark

Frankreich

Irland

Italien

Luxemburg



wetterstationen.meteodata.de

www.meteodata.de - www.unwetterzentrale.de - www.meteodata.ch - www.meteocentrale.ch -

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Lyon(69000) Actualisé à 16h00 Ajouter à mes lieux favoris

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	Soirée	Nuit
1°C 9°C UV 1	4°C 7°C UV 1	3°C 5°C UV 1
Vent ↘ 5 km/h Rafales -	Vent ↗ 20 km/h Rafales -	Vent ↗ 15 km/h Rafales -
Détails	Détails	Détails
6°C (Ressentie 5°C)	4°C (Ressentie 2°C)	
Vent 5 km/h Rafales -	Vent 10 km/h Rafales -	

+ Va-t-il pleuvoir dans l'heure ?

Nouveau ! le bulletin vidéo

Vigilance Météo Phénomènes dangereux Consultez la carte Vigilance "crues" Bison folié

Attestation de foudroiement L'expertise au service des clients Particuliers Professionnels

Présenté par nos prévisionnistes Lancer la vidéo

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Le dossier

Tout savoir sur les pluies intenses Consulter

Suivi hydrologique

Fortes pluies dans le Languedoc-Roussillon

Mardi 3 décembre : Journée scientifique sur la perception du changement climatique

Nouveaux records pour les concentrations de gaz à effet de serre en 2012

Typhon Haiyan aux Philippines le 8 novembre 2013

Bilan climatique de janvier à octobre 2013 en France métropolitaine

Particle Collisions in Turbulent Flows



Outline



Introduction



Prevalence of sling/caustics/RUM effect

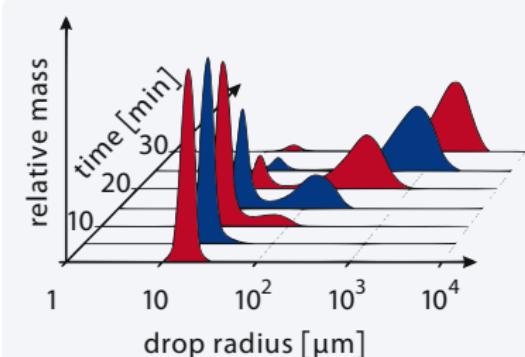


Multiple collisions



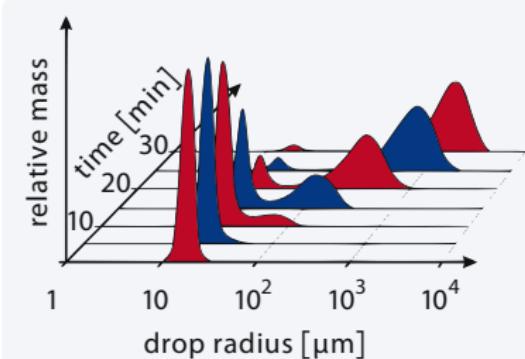
KS vs. DNS

Rain formation and the droplet size distribution



$$\frac{\partial f(\textcolor{red}{a})}{\partial t} = \text{nucleation/condensation} + \text{collision/coalescence}$$

Rain formation and the droplet size distribution

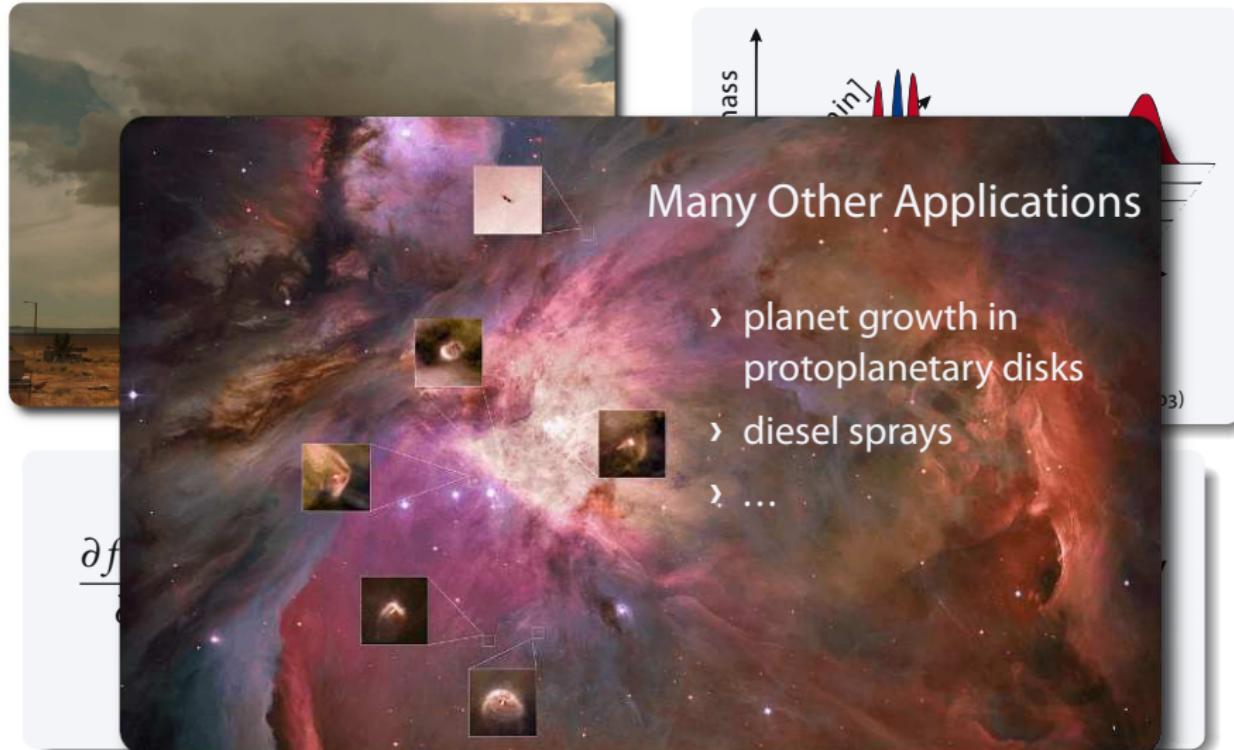


Lamb *Meteorol. Monogr.* (2001); Shaw *ARFM* (2003)

$$\frac{\partial f(a)}{\partial t} = \text{nucleation/condensation} + \frac{1}{2} \int_0^a \frac{a^2}{a''^2} \Gamma(a'', a') f(a'') f(a') da' - \int_0^\infty \Gamma(a, a') f(a) f(a') da'$$

$$a''^3 = a^3 - a'^3$$

Rain formation and the droplet size distribution

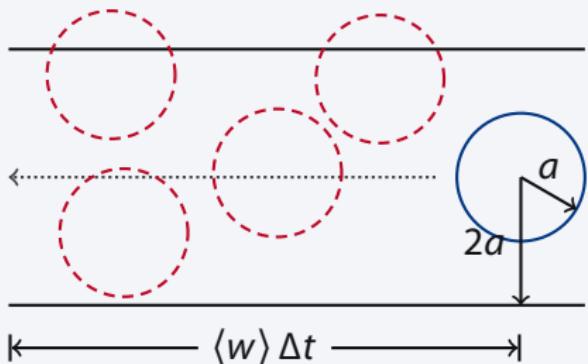


$$\frac{\partial f}{\partial a}$$

$$a''^3 = a^3 - a'^3$$

Introductory example: Kinetic theory

Collision cylinder



- › simplification:
only one particle size
- › collision rate for one particle

$$\mathcal{R}_c = n \pi (2a)^2 \langle w \rangle$$

- › overall collision rate

$$\mathcal{N}_c = \frac{1}{2} n^2 \underbrace{\pi (2a)^2 \langle w \rangle}_{\Gamma_{kin}(a)}$$

Collision kernel

$$\Gamma_{kin}(a) = \pi (2a)^2 \langle w \rangle$$

(Inertial) Particle collisions in Turbulent Flows

- › finite density $\rho_p > \rho_f$
- › finite size $0 < a \ll \eta$
- › equations of motion:

$$\frac{d\mathbf{X}}{dt} = \mathbf{V}, \quad \frac{d\mathbf{V}}{dt} = \frac{\mathbf{u}(\mathbf{X}, t) - \mathbf{V}}{\tau_p} + \mathbf{G}$$

Maxey & Riley *Phys. Fluids* (1983)
Gatignol *J. méc. théor. appl.* (1983)

- › dimensionless quantity:
Stokes number

$$St = \frac{\tau_p}{\tau_K} = \frac{2}{9} \frac{\rho_p}{\rho_f} \frac{a^2}{\eta^2}$$

DNS

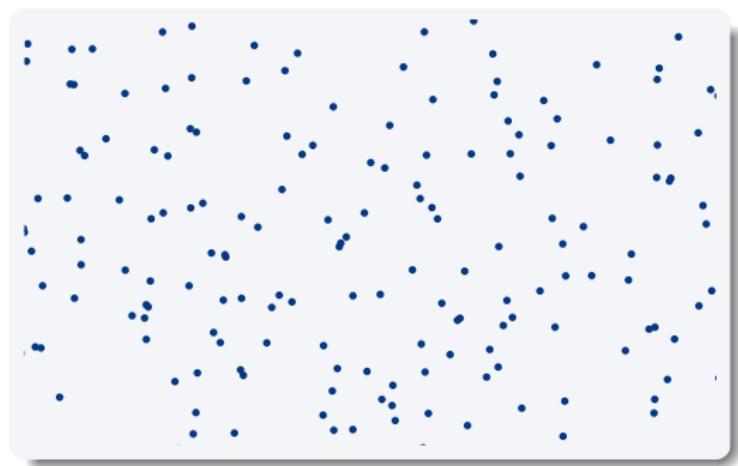
- › Navier–Stokes equations
- › periodic box
- › 384^3 grid points
- › $Re_\lambda = 130$

Kinematic Simulations

- › synthetic turbulence
- › efficient

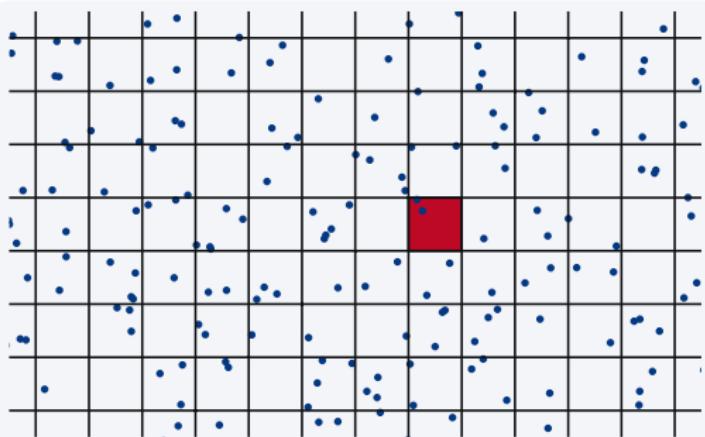
Fung et al. *JFM* (1992)

Determining the collision rate



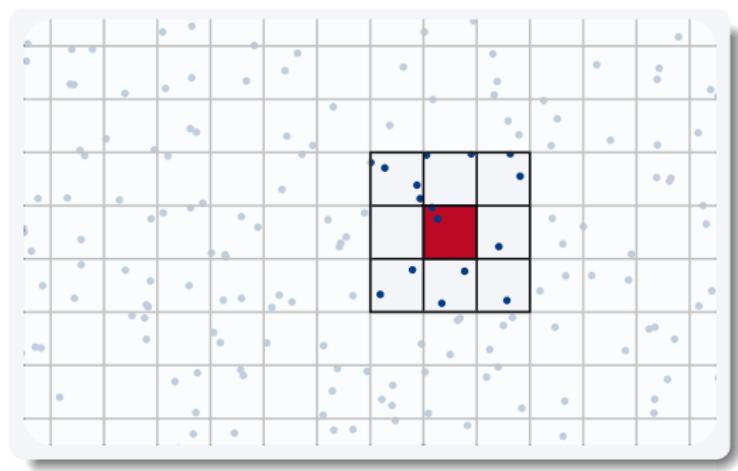
› part of simulation box
with particles

Determining the collision rate



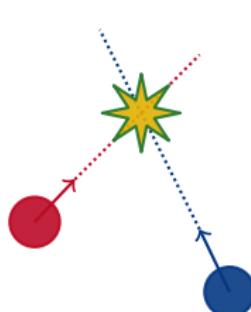
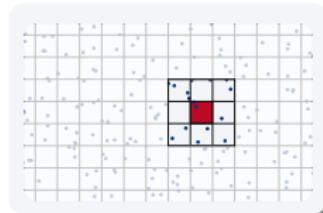
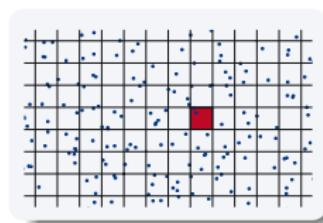
- › part of simulation box with particles
- › divide into segments
- › know which particles in which cell

Determining the collision rate

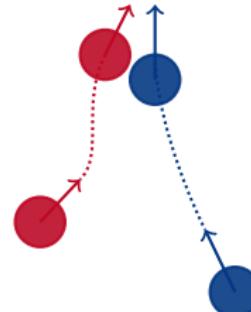


- › part of simulation box with particles
- › divide into segments
- › know which particles in which cell
- › consider only surrounding cells

Determining the collision rate



extrapolation is **inexact**



rather use **interpolation**

Collision kernel

$$\frac{N_c(T)}{TV_{\text{sys}}} = \mathcal{N}_c = \frac{1}{2} n^2 \Gamma(a)$$



Prevalence of the sling/caustics/RUM effect

Saffman & Turner JFM (1956)

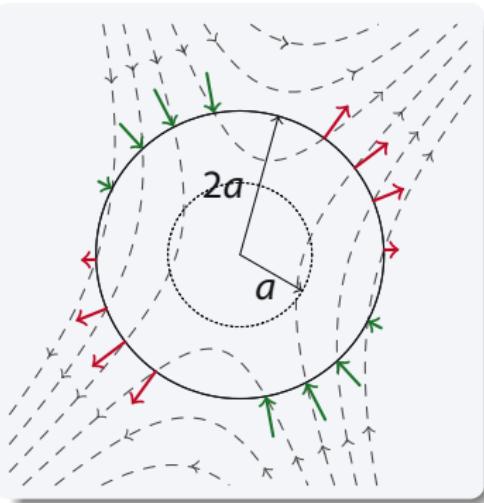
- St → 0: particles follow flow

$$\mathcal{R}_c = n \int -w_r(2a, \Omega) \Theta[-w_r(2a, \Omega)] d\Omega$$

- average to obtain total collision rate

$$\mathcal{N}_c = \frac{1}{2} n^2 \int \frac{1}{2} \langle |w_r(2a)| \rangle d\Omega$$

- approximate $\langle |w_x(2a)| \rangle = 2a \langle |\partial u_x / \partial x| \rangle$
- assume Gaussian statistics with
 $\langle (\partial u_x / \partial x)^2 \rangle = \varepsilon / 15\nu$



$$\Gamma_{ST} = \left(\frac{8\pi}{15} \right)^{1/2} \frac{(2a)^3}{\tau_K}$$

Collision kernel(s)

St → 0

Saffman & Turner *JFM* (1956)

$$\Gamma_{ST} = \left(\frac{8\pi}{15} \right)^{1/2} \frac{(2a)^3}{\tau_K}$$

St → ∞

Abrahamson *Chem. Eng. Sci.* (1975)

$\Gamma_A = \Gamma_{kin}$ with $V_{rms} = (\eta/\tau_K)f(\text{St}, \text{Re}_\lambda)$

$$\Gamma_A = 4\sqrt{\pi}(2a)^2 \frac{\eta}{\tau_K} f(\text{St}, \text{Re}_\lambda)$$

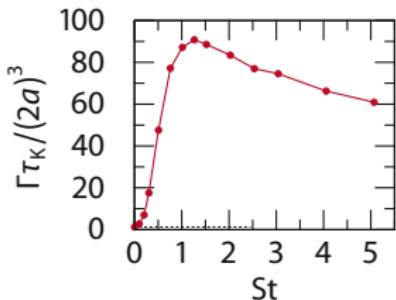
Collision kernel(s)

St → 0

Saffman & Turner *JFM* (1956)

$$\Gamma_{ST} = \left(\frac{8\pi}{15} \right)^{1/2} \frac{(2a)^3}{\tau_K}$$

Preferential
concentration ?



Sling/caustics/RUM
effect ?

St → ∞

Abrahamson *Chem. Eng. Sci.* (1975)

$$\Gamma_A = \Gamma_{kin} \text{ with } V_{rms} = (\eta/\tau_K)f(St, Re_\lambda)$$

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Preferential concentration

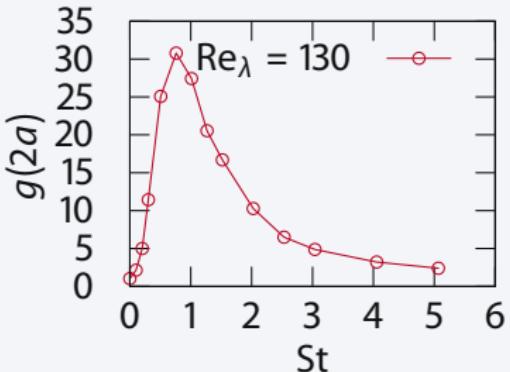
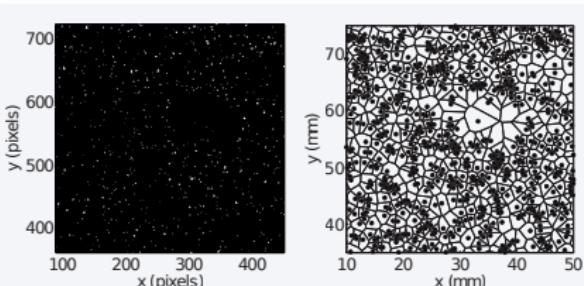
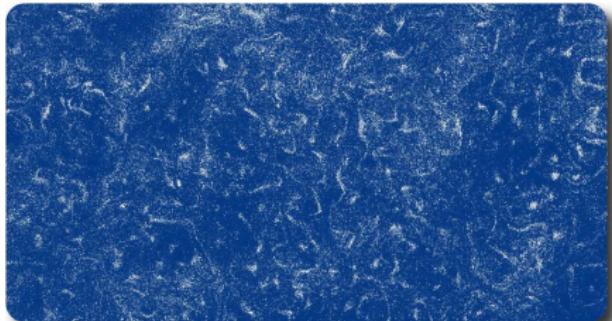
- mathematically exact

$$\Gamma_{SC} = 2\pi(2a)^2 g(2a) \langle |w_r| \rangle$$

- radial distribution function $g(r)$

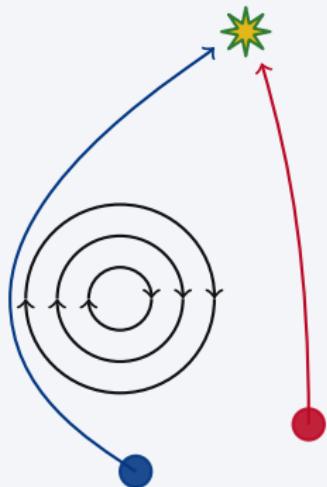
$$g(r) \sim (r/\eta)^{(\mathcal{D}_2 - 3)}, \quad r/\eta \ll 1$$

Sundaram & Collins *JFM* (1997)



Sling/caustics/RUM effect

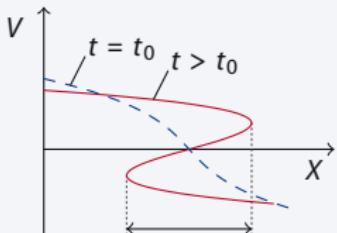
Sling



- particles **slung** by vortices

Falkovich et al. *Nature* (2002)

Caustics



- faster particles "overtake" slower ones
- points in phase space multi-valued

Wilkinson, Mehlig, & Bezuglyy *PRL* (2006)

RUM

Random
Un correlated
Motion

- two contributions to motion of inertial particles
 - smooth spatially correlated movement
 - random uncorrelated movement

Simonin et al. *Phys. Fluids* (2006)
Reeks et al. *Proc. FEDSM* (2006)

$$\Gamma = \underbrace{\Gamma_{ST} g(2a)}_{\sim a^3} + \underbrace{\Gamma_A h_S(\text{St}, \text{Re}_\lambda)}_{\sim a^D} - \underbrace{a^2}_{\sim a^2}$$

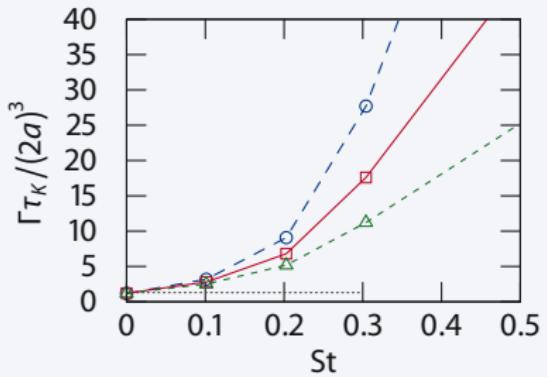
$$St = \frac{2}{9} \frac{\rho_p}{\rho_f} \frac{a^2}{\eta^2}$$

- | | | | |
|-----------|------------------------|---------------|----------------------|
| Δ | $\rho_p/\rho_f = 250$ | \Rightarrow | $a = 2a_0$ |
| \square | $\rho_p/\rho_f = 1000$ | \Rightarrow | $a = a_0$ |
| \circ | $\rho_p/\rho_f = 4000$ | \Rightarrow | $a = \frac{1}{2}a_0$ |

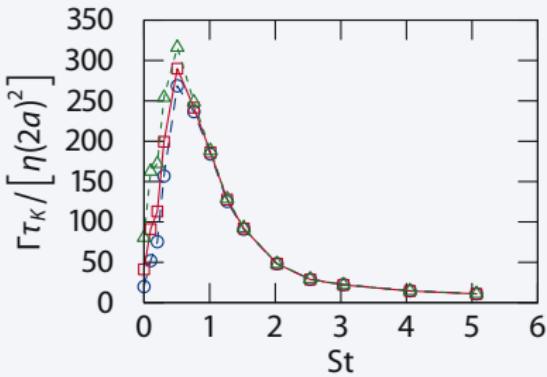
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- Δ $\rho_p/\rho_f = 250$ \Rightarrow $a = 2a_0$
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- \circ $\rho_p/\rho_f = 4000$ \Rightarrow $a = \frac{1}{2}a_0$

Saffman & Turner



Sling/caustics/RUM



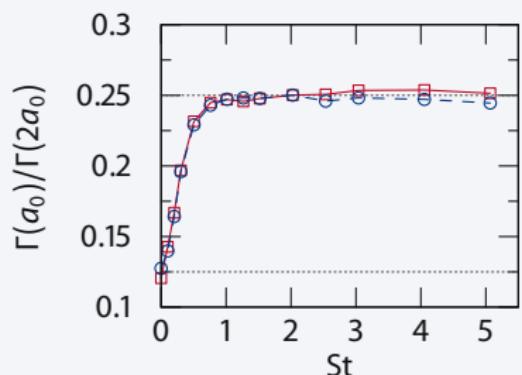
Voßkuhle et al. arXiv: 1307.6853 [physics.flu-dyn]

$$\Gamma = \underbrace{\Gamma_{ST}}_{\sim a^3} g(2a) + \underbrace{\Gamma_A h_s}_{\sim a^{D_2-3}} (\text{St}, \text{Re}_\lambda)$$

› Expected values for
 $\Gamma(a_0)/\Gamma(2a_0) = \Gamma(a_0/2)/\Gamma(a_0)$

$$\sim a^2 \quad \Rightarrow \quad \Gamma(a_0)/\Gamma(2a_0) = \frac{1}{4}$$

$$\sim a^3 \quad \Rightarrow \quad \Gamma(a_0)/\Gamma(2a_0) = \frac{1}{8}$$



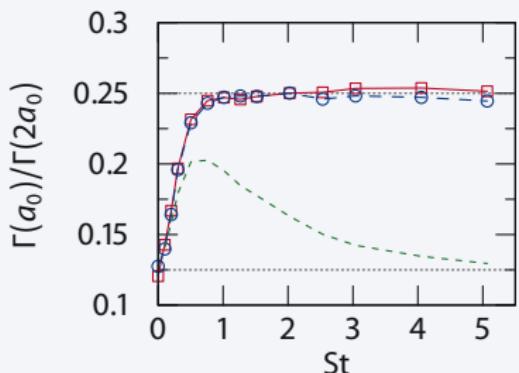
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$$\sim a^3 \Rightarrow \Gamma(a_0)/\Gamma(2a_0) = \frac{1}{8}$$

$$\sim a^3 a^{\mathcal{D}_2-3} \Rightarrow \Gamma(a_0)/\Gamma(2a_0) = \left(\frac{1}{2}\right)^{\mathcal{D}_2}$$



Collision velocities

- › Cumulative PDF of relative velocity

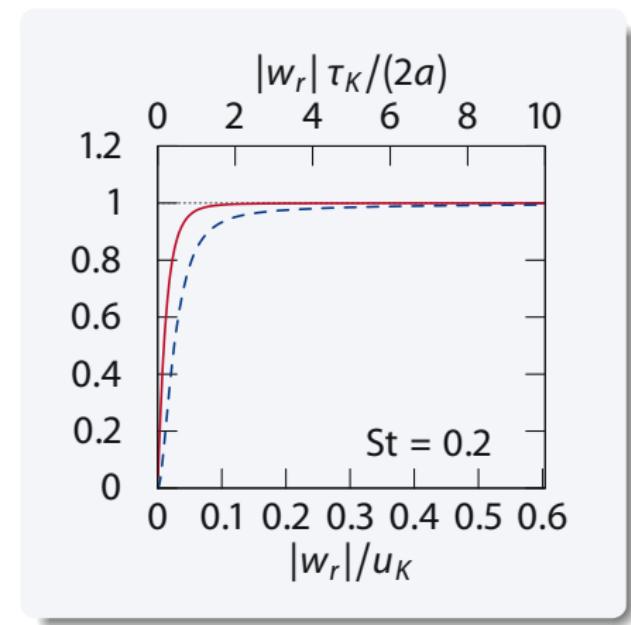
$$F(|w_r|) = \int_0^{|w_r|} p(|w_r|) dw_r$$

"How many particle pairs have relative velocities smaller than $|w_r|$?"

- › Cumulative distribution of the flux

$$\varphi(|w_r|) = \int_0^{|w_r|} \frac{|w_r|}{\langle |w_r| \rangle} p(|w_r|) dw_r$$

"How many *colliding* particles have relative velocities smaller than $|w_r|$?"



Collision velocities

- › Cumulative PDF of relative velocity

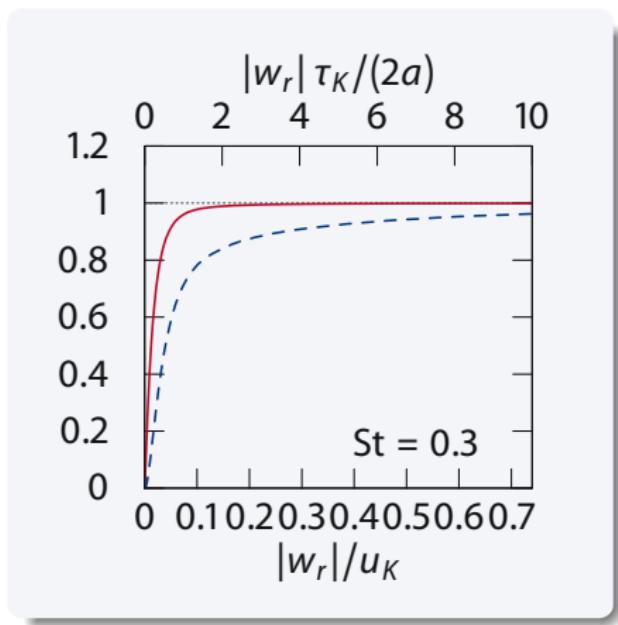
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Collision velocities

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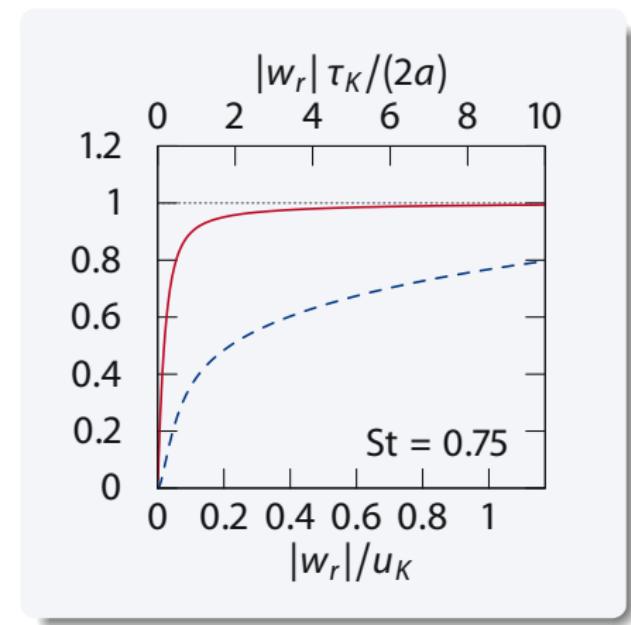
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Collision velocities

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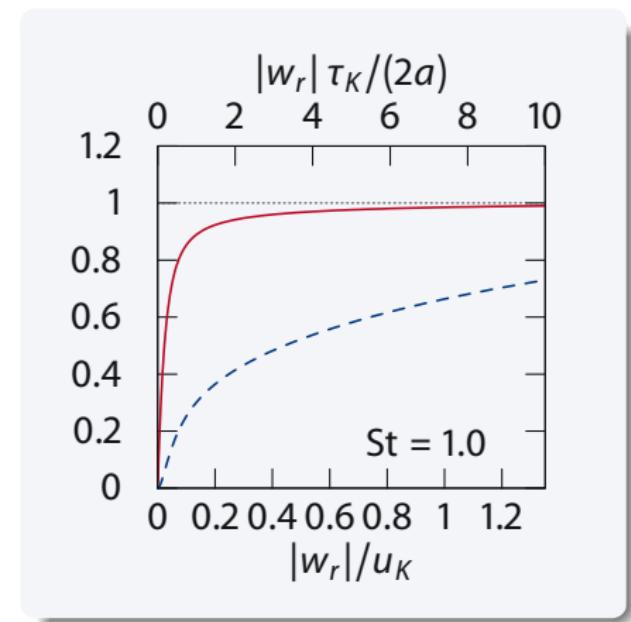
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Collision velocities

- Cumulative PDF of relative velocity

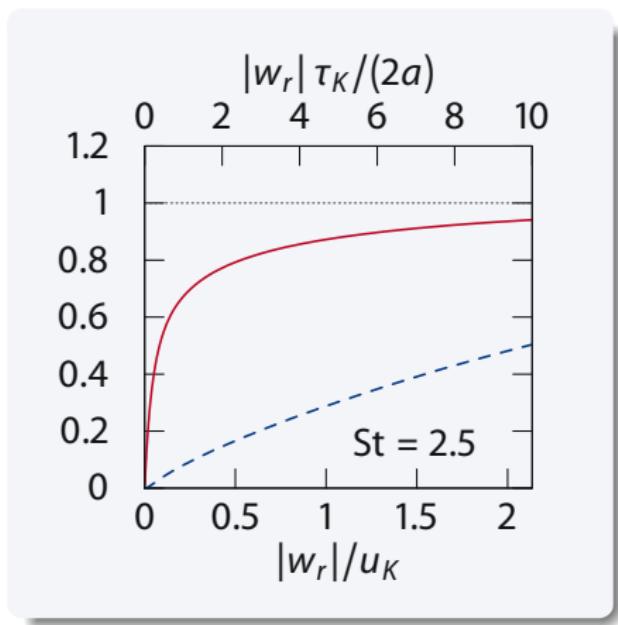
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Collision velocities

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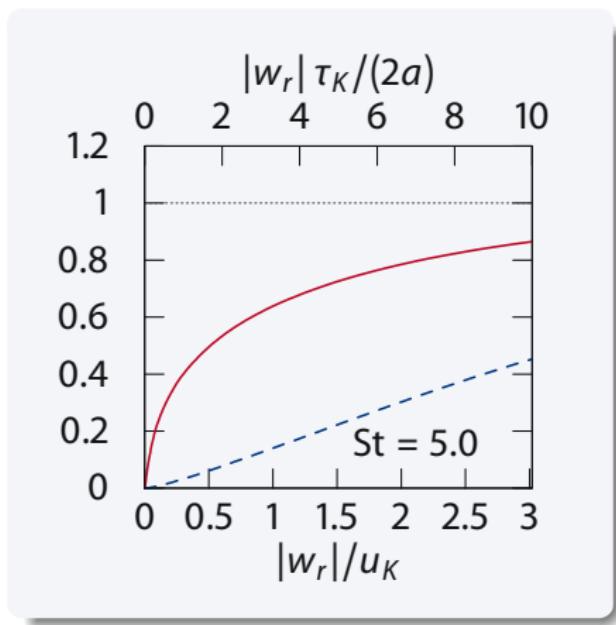
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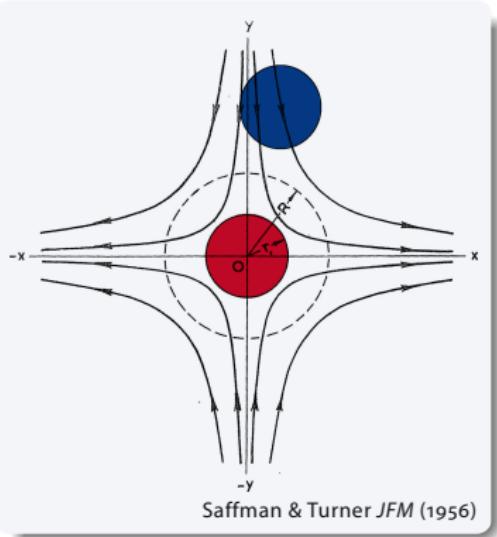
"How many *colliding* particles have relative velocities smaller than $|w_r|$?"





Multiple collisions

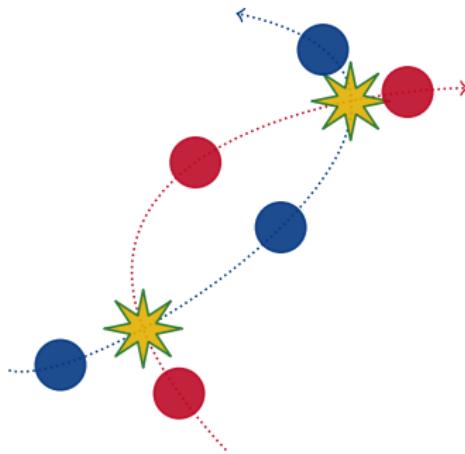
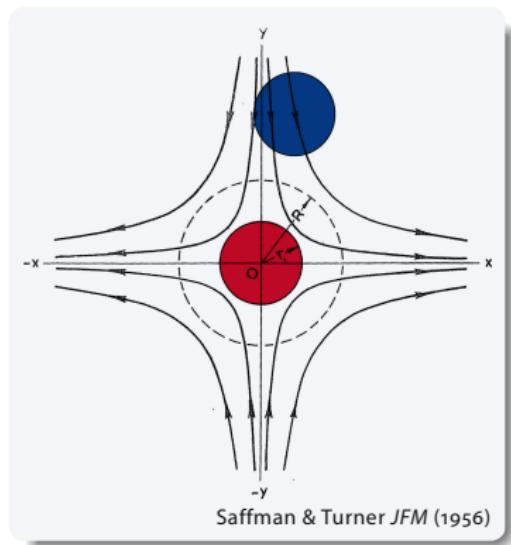
Ghost collisions and the Saffman–Turner theory



- › flow is locally hyperbolic
 - › flow is persistent
 - › fluid element can pass through collision sphere repeatedly
- ⇒ spurious “ghost” collisions

Brunk et al. *JFM* (1998)
Andersson et al. *EPL* (2007)
Gustavsson, Mehlig, & Wilkinson *NJP* (2008)

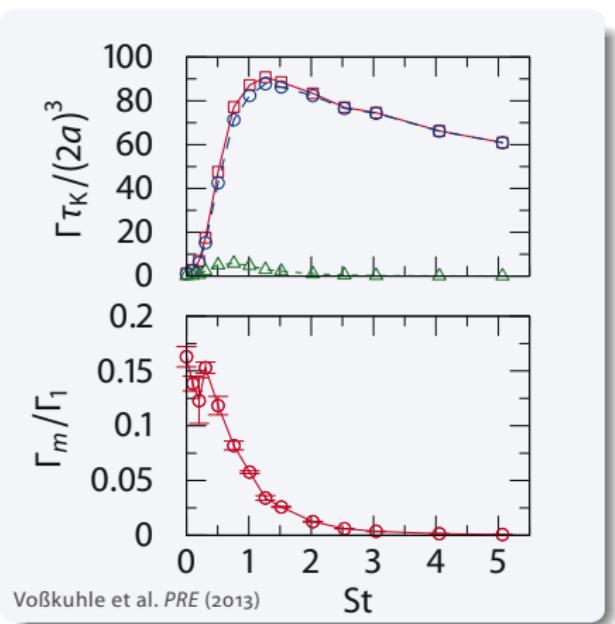
Ghost collisions and the Saffman–Turner theory



Particles kept in flow
may collide again

Brunk et al. *JFM* (1998)
Andersson et al. *EPL* (2007)
Gustavsson, Mehlig, & Wilkinson *NJP* (2008)

Overestimation by Ghost collisions



Γ_{GCA} : ghost collision approximation

Γ_1 : only first collisions

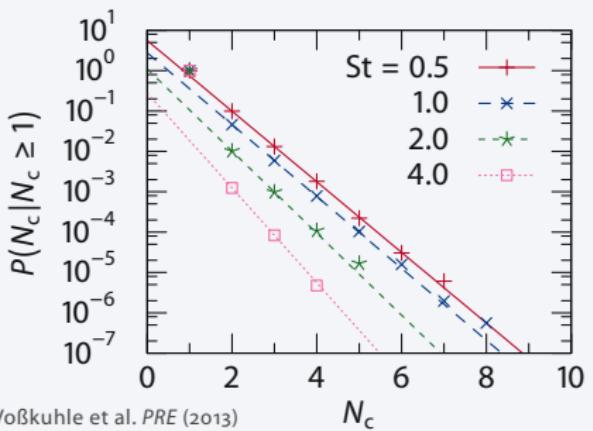
Γ_m : multiple collisions

$$\Gamma_{GCA} = \Gamma_1 + \Gamma_m$$

- › Ghost collisions overestimate collision kernel by up to 20 %
- › Relative estimation error falls with Stokes number

Consistent with previous results by Brunk et al. *JFM* (1998)
and Wang et al. *Phys. Fluids* (1998)

Statistics of multiple collisions



- Multiple collisions statistics follow

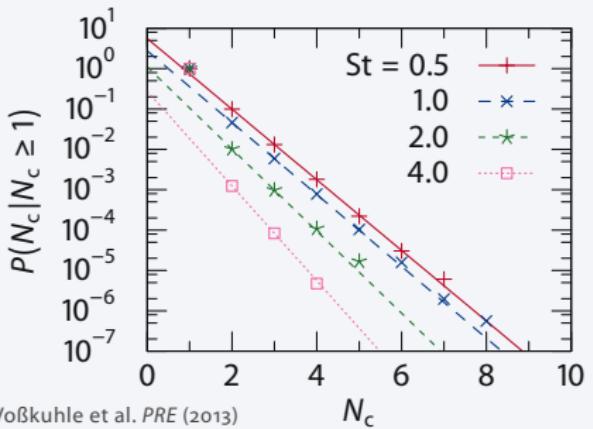
$$P(N_c | N_c \leq 1) = \beta(St) \alpha(St)^{N_c}$$

- Markovian interpretation: particle has $\alpha(St)$ probability to collide again

- Simple model

$$\Gamma_m = \Gamma_1 \sum_{N_c=2}^{\infty} \beta a^{N_c} = \Gamma_1 \frac{\beta a^2}{1-a}$$

Statistics of multiple collisions



Voßkuhle et al. PRE (2013)

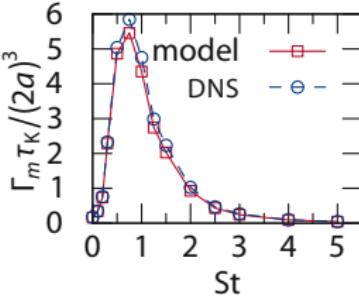
- Multiple collisions statistics follow

$$P(N_c | N_c \leq 1) = \beta(St)\alpha(St)^{N_c}$$

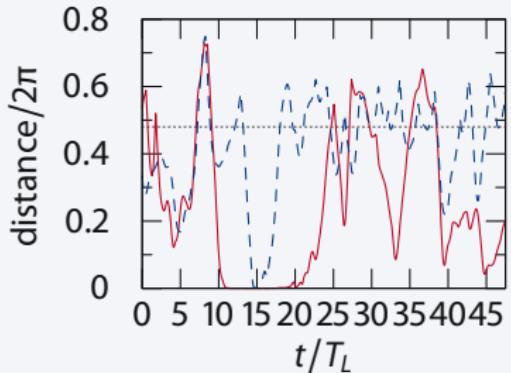
- Markovian interpretation: particle has **probability $\alpha(St)$** to **collide again**

- Simple model

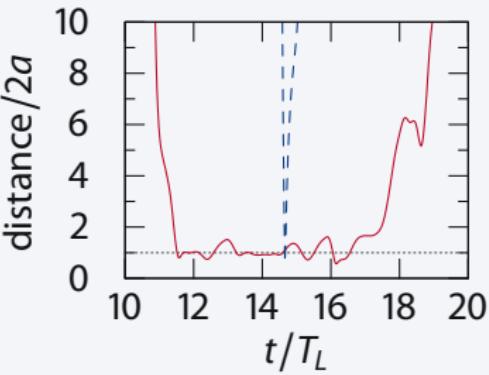
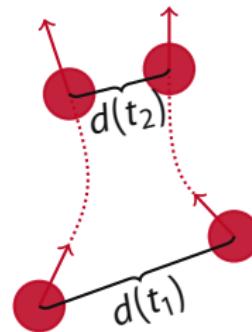
$$\Gamma_m = \Gamma_1 \sum_{N_c=2}^{\infty} \beta \alpha^{N_c} = \Gamma_1 \frac{\beta \alpha^2}{1 - \alpha}$$



Distance between trajectories

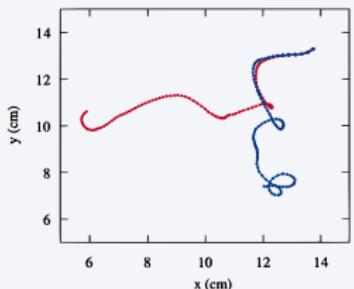


$St = 1.0$



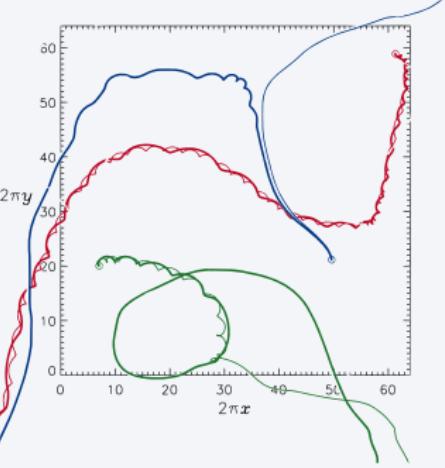
Pair separation

Jullien et al. *PRL* (1999)

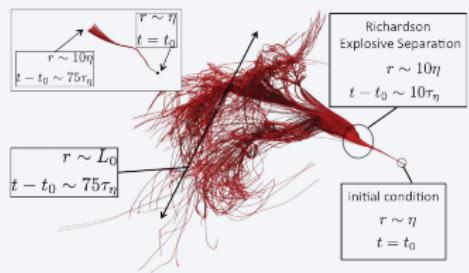


- › results for tracers
- › starting with similar initial conditions

Rast & Pinton *PRL* (2011)

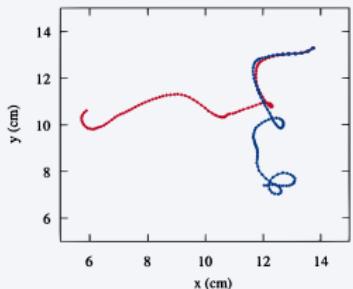


Scatamacchia et al. *PRL* (2012)



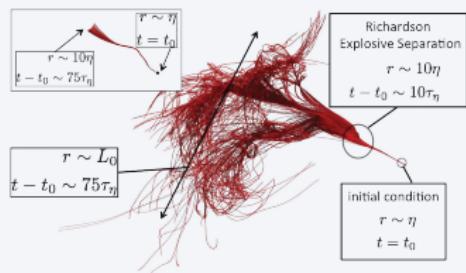
Pair separation

Jullien et al. *PRL* (1999)

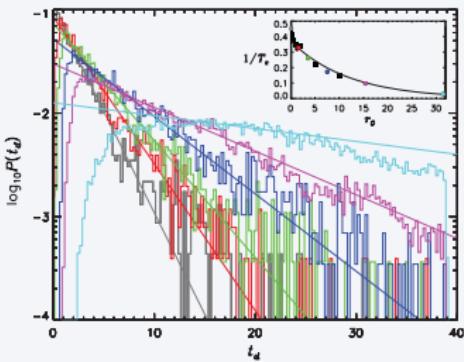


- › results for **tracers**
- › starting with similar initial conditions

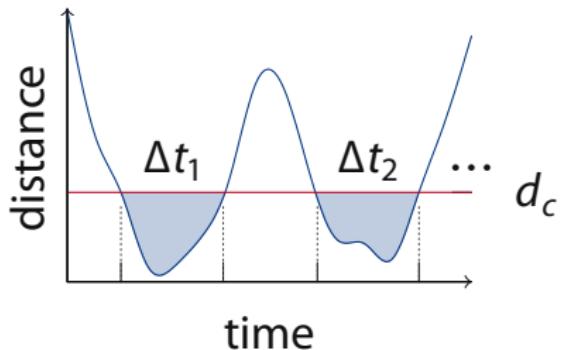
Scatamacchia et al. *PRL* (2012)



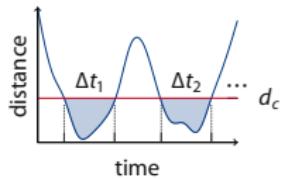
Rast & Pinton *PRL* (2011)



Contact time distribution

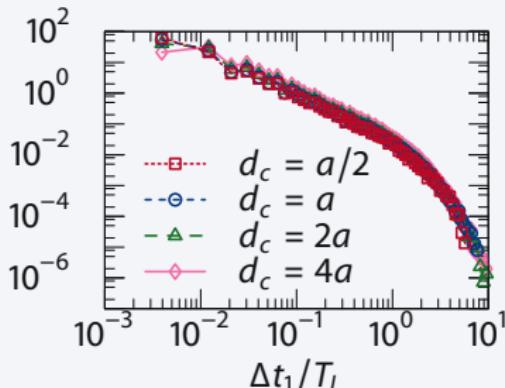
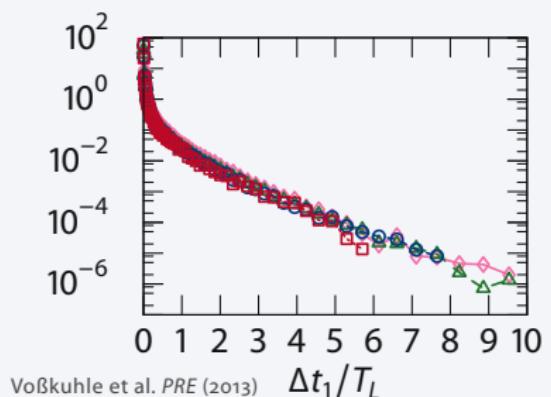


Contact time distribution

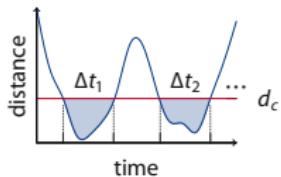


- › exponential tail for long time
- › power law for short time
- › independent of distance d_c

$P(\Delta t_1)$ for $St = 1.5$

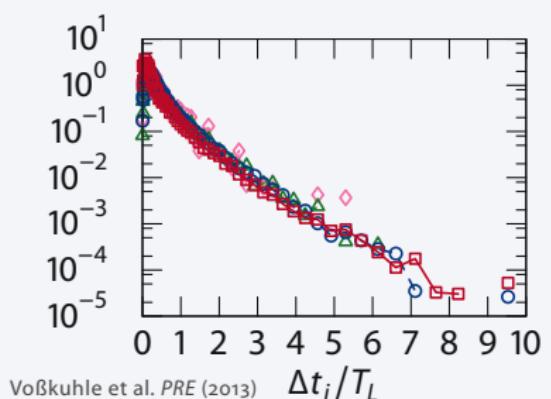


Contact time distribution

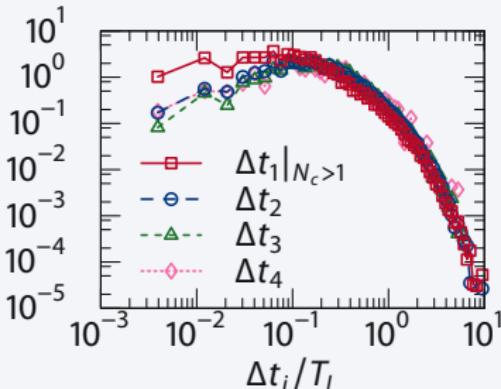


- › exponential tail persists
- › power law vanishes
- › independent of collision count

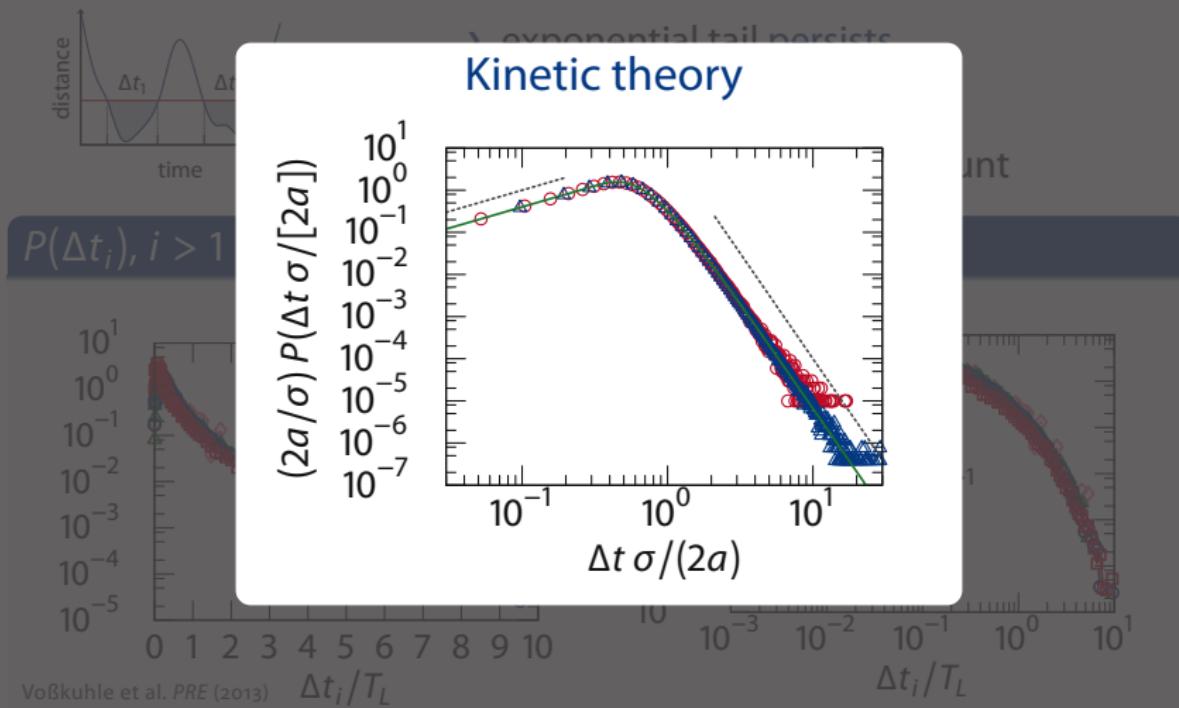
$P(\Delta t_i), i > 1$ for $St = 1.5$



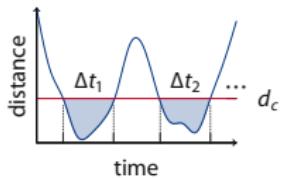
Voßkuhle et al. PRE (2013)



Contact time distribution

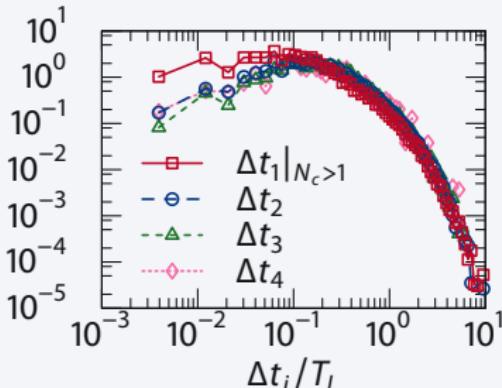
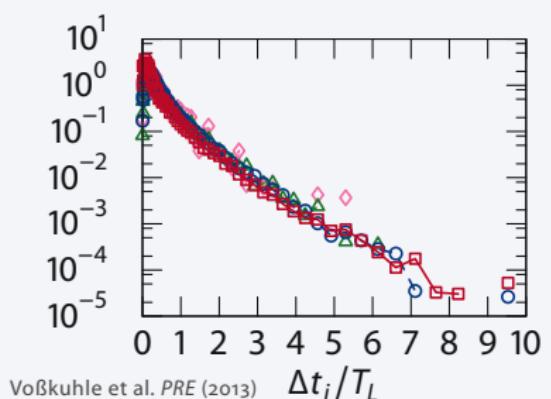


Contact time distribution



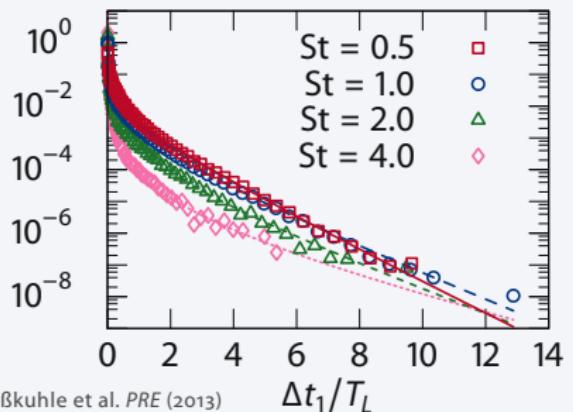
- › exponential tail **persists**
- › power law **vanishes**
- › independent of collision count

$P(\Delta t_i), i > 1$ for $St = 1.5$



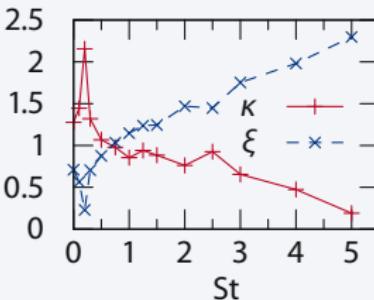
Contact time distribution

Different St



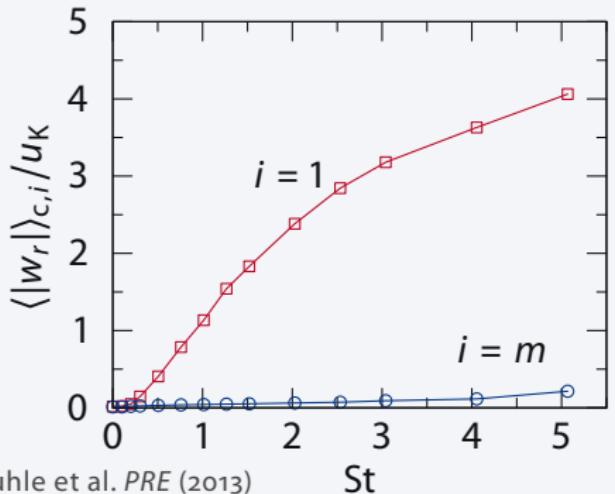
Voßkuhle et al. PRE (2013)

$$P(\Delta t_1) \sim e^{-\kappa \Delta t_1 / T_L} \frac{\Delta t_1}{T_L}^{-\xi}$$



Multiple collisions and sling/caustics/RUM effect

Collision velocities



Voßkuhle et al. PRE (2013)

- multiple collisions have **small** relative velocities
- multiple collisions stem from **continuous** collisions
- sling/caustics/RUM effect does **not** lead to multiple collisions



Kinematic Simulations vs. Direct Numerical Simulations

Kinematic Simulations

$$\mathbf{u}(\mathbf{x}, t) = \sum_{n=1}^{N_k} \mathbf{A}_n \cos(\mathbf{k}_n \cdot \mathbf{x} + \omega_n t) + \mathbf{B}_n \sin(\mathbf{k}_n \cdot \mathbf{x} + \omega_n t)$$

$$\mathbf{A}_n \cdot \mathbf{k}_n = \mathbf{B}_n \cdot \mathbf{k}_n = 0$$

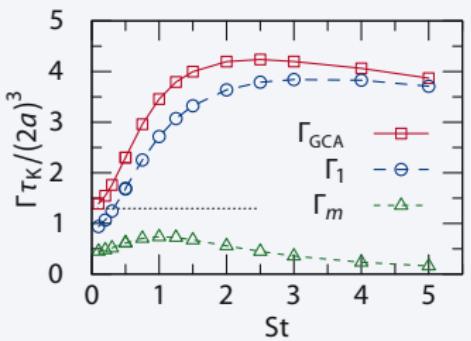
$$A_n^2 = B_n^2 = E(k_n) \Delta k_n$$

$$E(k_n) \sim k_n^{-5/3}$$

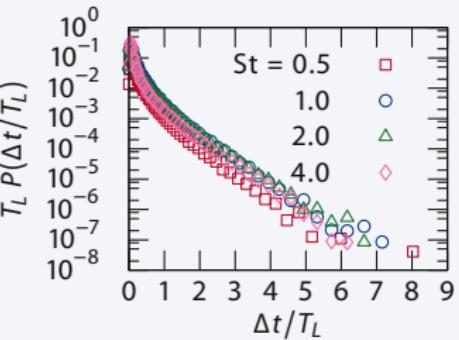
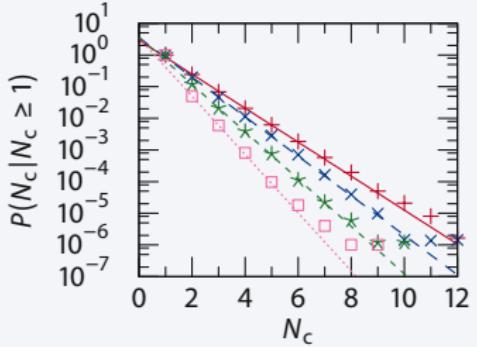
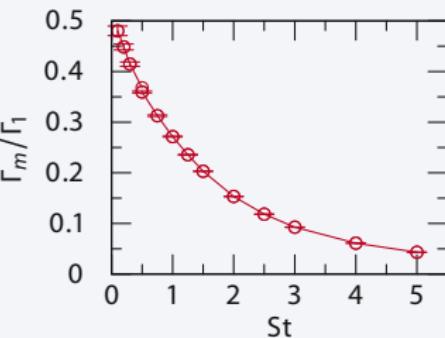
- › efficient
- › highly “turbulent” flows
- › widely used
- › “toy model”

Fung et al. *JFM* (1992)

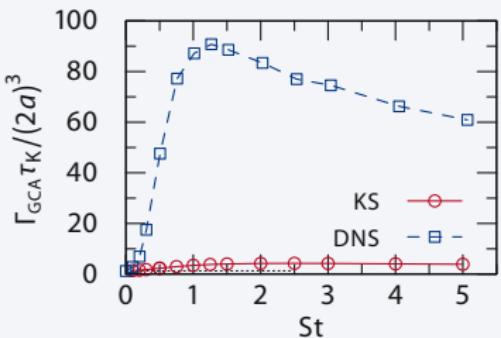
Qualitatively the same for KS...



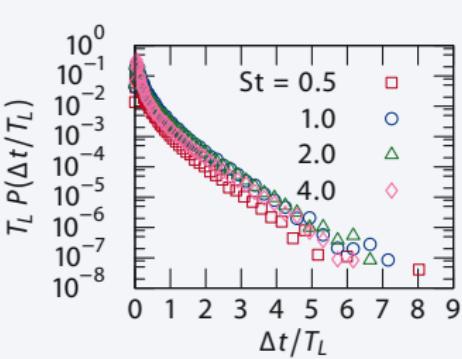
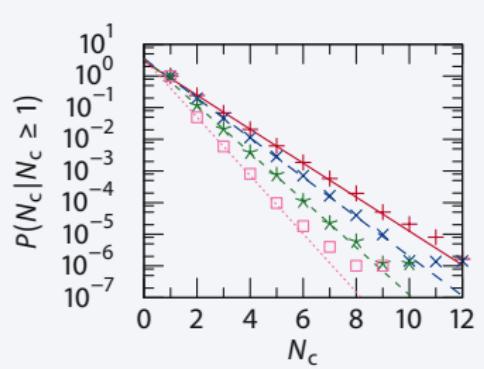
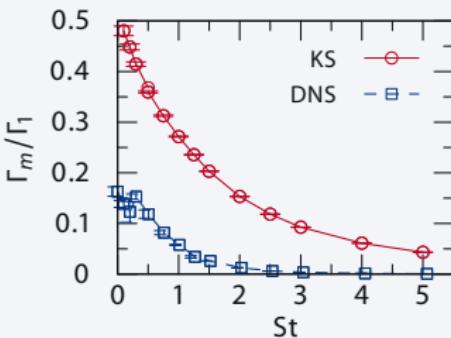
Voßkuhle et al. *J. Phys.: Conf. Ser.* (2011)

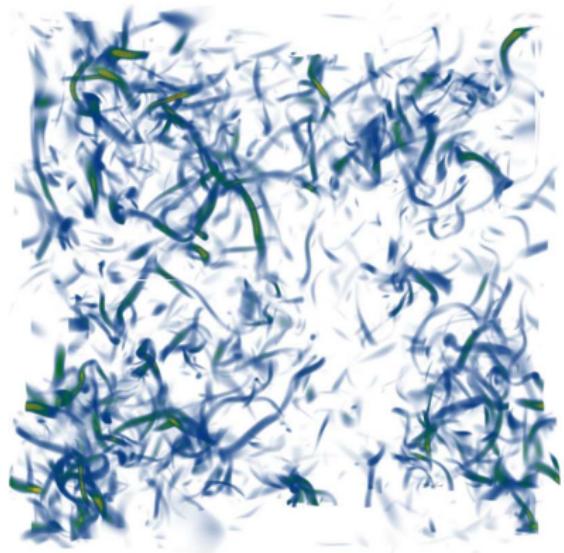


...but quantitatively very different from DNS



Voßkuhle et al. *J. Phys.: Conf. Ser.* (2011)



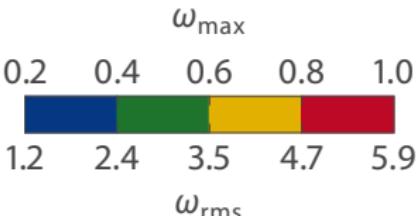
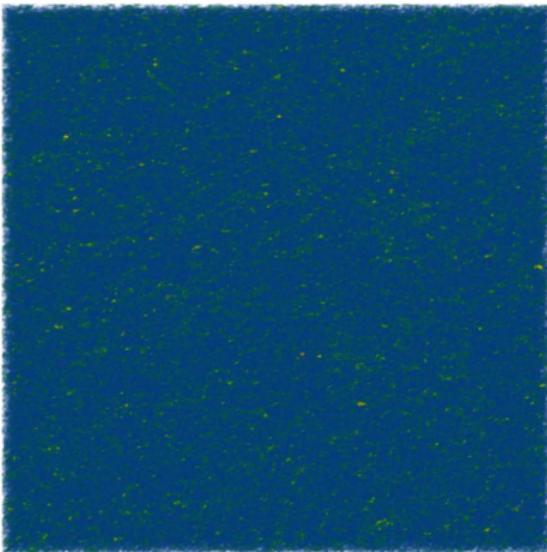
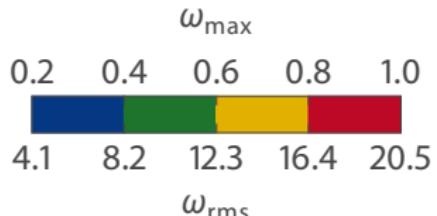
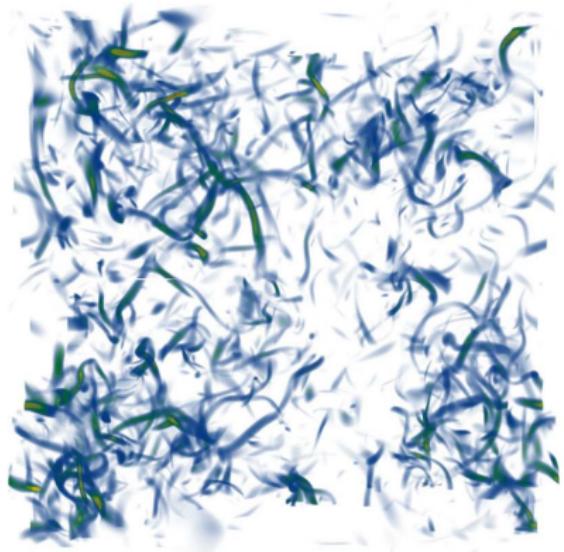
 ω_{\max}

0.2 0.4 0.6 0.8 1.0



4.1 8.2 12.3 16.4 20.5

 ω_{rms}





A. Pumir



E. Lévêque



J. Bec

M. Lance

B. Mehlig

M. Reeks

M. Wilkinson

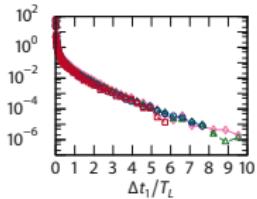
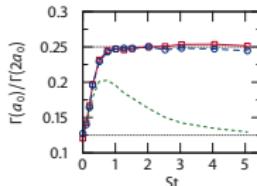
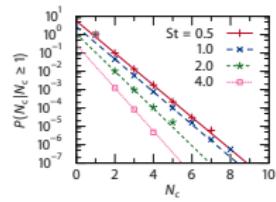
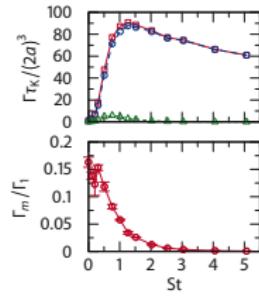
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Conclusions and perspectives

- › $St > 0$: Sling/caustics/RUM effect dominates collision rates in turbulent flows
- › inertial particles may stay close for long times



- » leads to multiple collisions
- » overestimation of the collision kernel

M Voßkuhle et al. (2013a). "Multiple collisions in turbulent flows." In: *Phys. Rev. E* 88, p. 063008

M Voßkuhle et al. (2013b). "Prevalence of the sling effect for enhancing collision rates in turbulent suspensions." In: *ArXiv e-prints* (July 2013). arXiv: 1307.6853 [physics.flu-dyn]

M Voßkuhle et al. (2011). "Estimating the Collision Rate of Inertial Particles in a Turbulent Flow: Limitations of the 'Ghost Collision' Approximation." In: *J. Phys.: Conf. Ser.* 318, p. 052024



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Voßkuhle M et al. (2013a). "Multiple collisions in turbulent flows." In: *Phys. Rev. E* 88, p. 063008.



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Kinematic Simulations

$$\mathbf{u}(\mathbf{x}, t) = \sum_{n=1}^{N_k} \mathbf{A}_n \cos(\mathbf{k}_n \cdot \mathbf{x} + \omega_n t) + \mathbf{B}_n \sin(\mathbf{k}_n \cdot \mathbf{x} + \omega_n t)$$

$$\mathbf{A}_n \cdot \mathbf{k}_n = \mathbf{B}_n \cdot \mathbf{k}_n = 0$$

$$A_n^2 = B_n^2 = E(k_n) \Delta k_n, \quad E(k_n) \sim k_n^{-5/3}$$

$$k_1 = \frac{2\pi}{L}, \quad k_{N_k} = \frac{2\pi}{\eta}, \quad k_n = k_1 \left(\frac{L}{\eta} \right)^{(n-1)/(N_k-1)}$$

$$\omega_n = \lambda \sqrt{k_n^3 E(k_n)}, \quad \lambda : \text{"persistence parameter"}$$

- › efficient
- › highly "turbulent" flows
- › widely used

Fung et al. *JFM* (1992)

› Go back...



Bibliothèque municipale de Lyon. *Photo: Vélo'Vs in snow.*



<http://www.flickr.com/photos/ansobol>, others from the corresponding websites. *Photos and logos on the acknowledgements page.*



Lukaschuk S. *Photo: Clustering particles.* Dept. Engineering, Univ. Hull.



<http://commons.wikimedia.org>. Some of the pictures are in the public domain and were taken from this website.



“Rain”, “Clover” designed by Pavel Nikandrov, “Computer”,
“Newspaper” designed by Yorlmar Campos, “Handshake” designed by Sam Garner,
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