

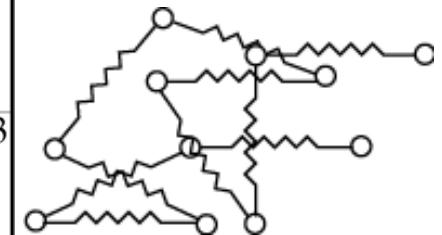
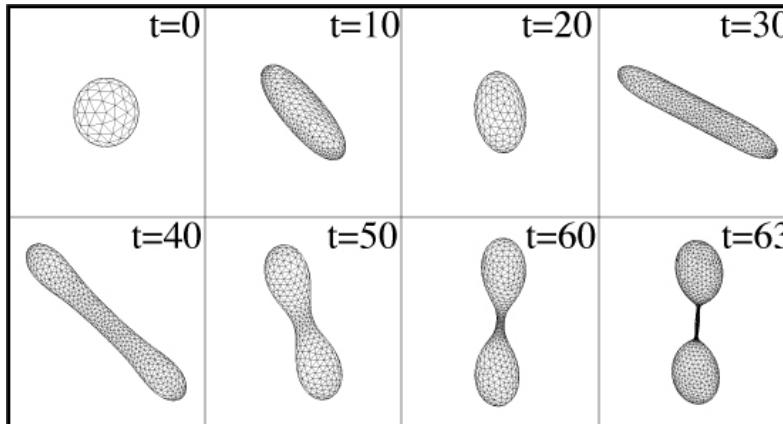
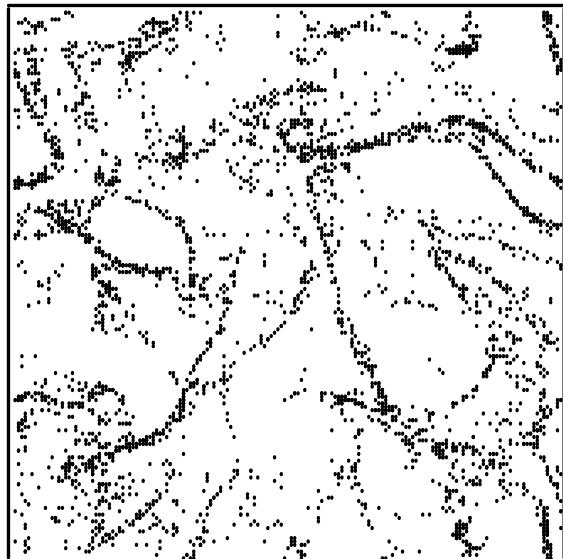
**APS Division of Fluid Dynamics Meeting  
East Rutherford, NJ  
November 23-25, 2003**

# **Using DNS to Understand Aerosol Dynamics**

Lance R. Collins  
Sibley School of Mechanical & Aerospace  
Engineering  
Cornell University



# Direct Numerical Simulations of Microstructures



## Aerosols

- Dispersion
- Turbulence modulation
- Coagulation

## Droplets\*

- Breakup
- Coalescence

\* M. Loewenberg  
J. Blawzdziewicz  
V. Cristini

## Polymer Molecules

- Orientation
- Stretch
- Drag Reduction

\* J. G. Brasseur

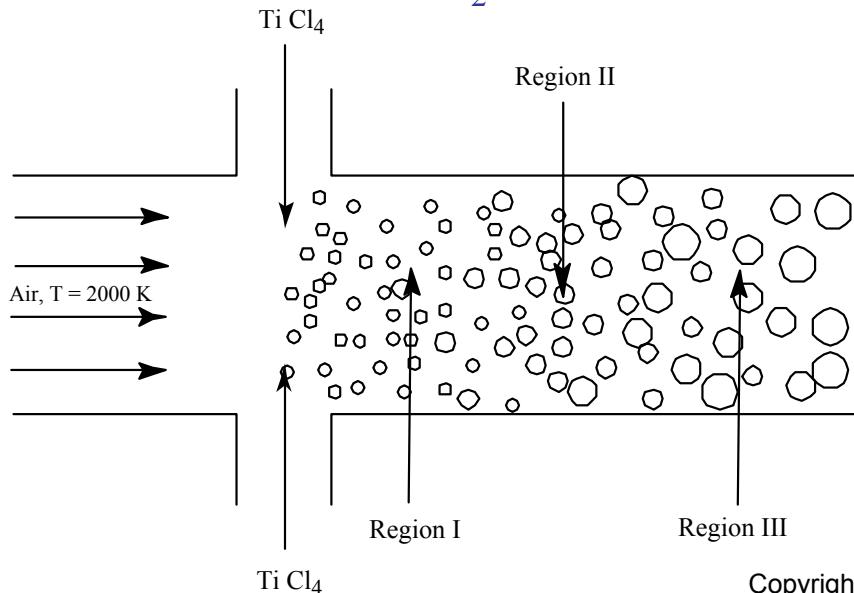
# Outline

- Background on aerosols
- Direct numerical simulations (DNS)
- Numerical Results
- Theory
- Experiments
- Summary

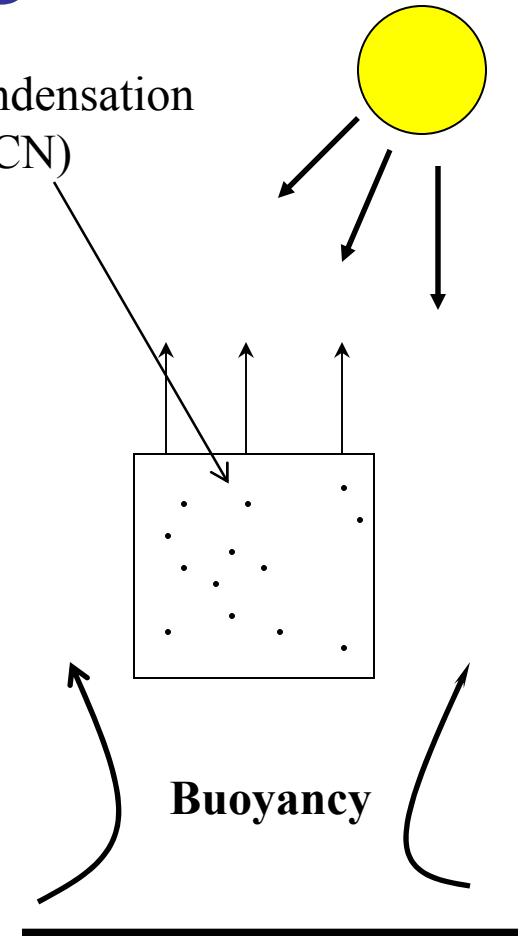
# Examples



## DuPont TiO<sub>2</sub> Process



Cloud Condensation  
Nuclei (CCN)



R. Shaw, ARFM 2003

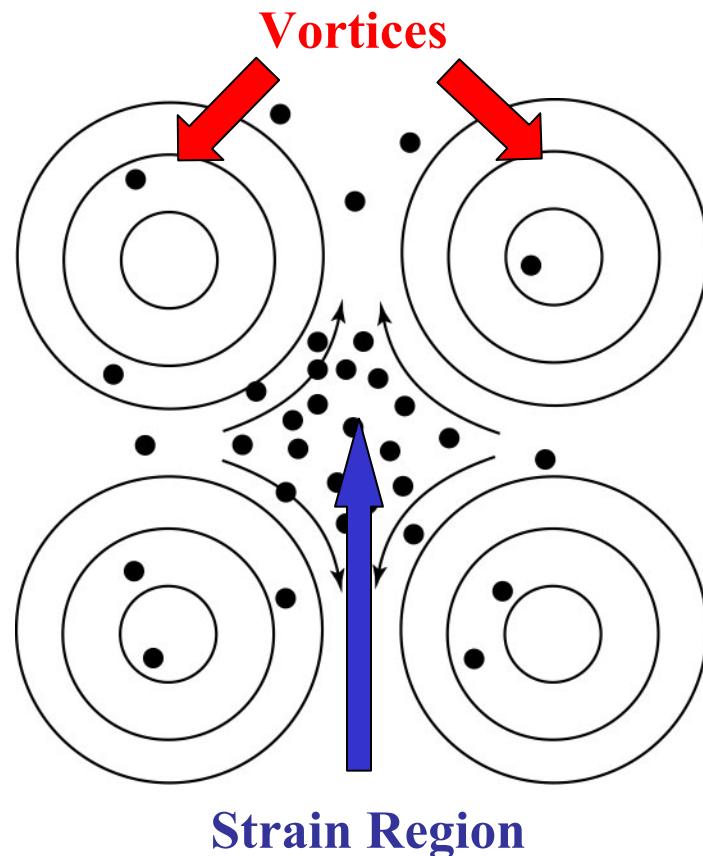
# Turbulent clustering

Aerosol particles in a turbulent flow field cluster outside of vortices due to a centrifugal effect, sometimes referred to as “preferential concentration.”

**Maxey (1987)**

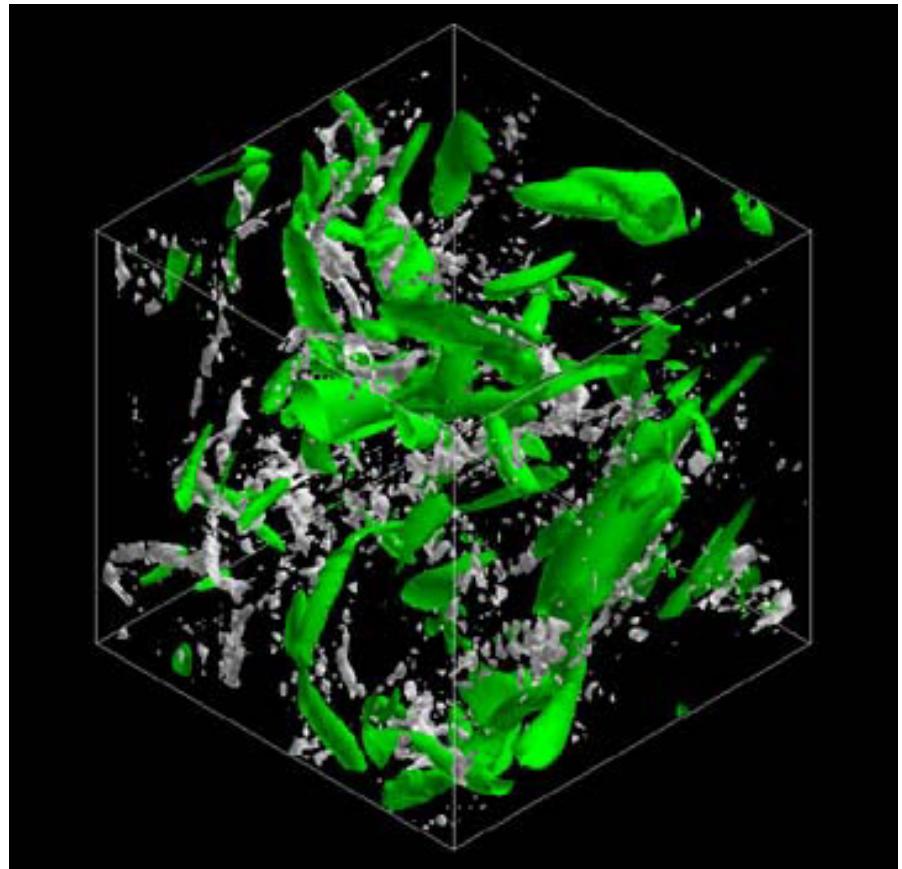
**Squires & Eaton (1991)**

**Wang & Maxey (1993)**



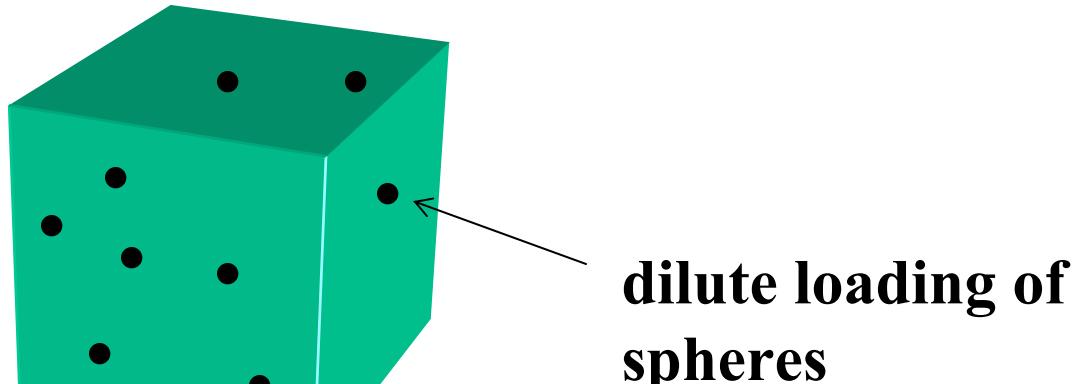
# Snapshot of particle clustering in DNS

Snapshot from a DNS ( $St=1$  and  $R_\lambda = 54$ ). The **green tubes** are vortex tubes where fluid circulates rapidly and the **white** shows where the particle concentration is greater than 10 times the mean.



How does this affect coalescence rates?

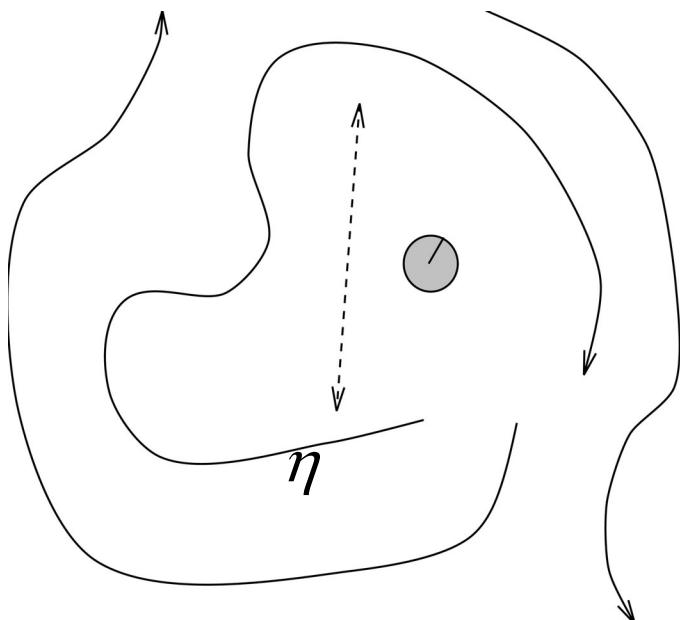
# Direct numerical simulation



$$\nabla \bullet \mathbf{u} = 0$$

$$\frac{\partial \mathbf{u}}{\partial t} + \mathbf{u} \bullet \nabla \mathbf{u} + \frac{\nabla p}{\rho} = \nu \nabla^2 \mathbf{u} + \mathbf{F}$$

# Particle update



$$\frac{d}{\eta} \ll 1$$

$$\frac{d\mathbf{x}_p^{(i)}}{dt} = \mathbf{v}_p^{(i)}$$

$$\frac{d\mathbf{v}_p^{(i)}}{dt} = \frac{\left[ \mathbf{u}(x_p^{(i)}, t) - \mathbf{v}_p^{(i)} \right]}{\tau_p^{(i)}} + \sum_{j \neq i} \mathbf{F}^{(ij)}$$

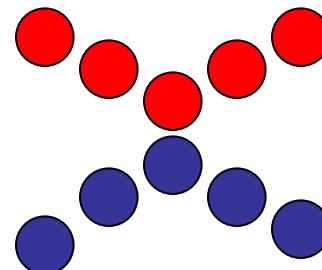
Stokes drag

collisions  
(neighborhood  
search)

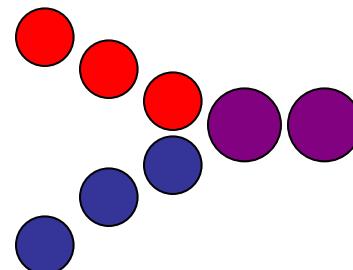
$$\tau_p^{(i)} = \frac{1}{18} \frac{\rho_p}{\rho} \left( \frac{d}{\eta} \right)^2$$

# Particle-particle interactions

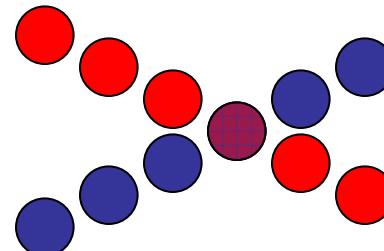
**Elastic Rebound:**



**Coalescence:**



**Interpenetration:**



# Parameters

## Flow:

$U'$  turbulence intensity  
 $\varepsilon$  dissipation rate  
 $\nu$  kinematic viscosity

## Particles:

$d$  diameter  
 $\rho_p$  density  
 $n$  loading

---

$$R_\lambda \equiv \sqrt{\frac{15}{\nu \varepsilon}} U'^2$$

$$St = \frac{\tau_p}{\tau_\eta} \quad \text{Stokes number}$$

$$\frac{d}{\eta} \quad \text{size parameter}$$

$$\Phi \quad \text{volumetric loading}$$

# Parameter Ranges

System	$R_\lambda$	$St$	$d/\eta$	$\Phi$
Clouds	$10^4$	$10^{-4} - 10^{-1}$	$10^{-2} - 10^{-3}$	$< 10^{-6}$
DNS	$50 - 160^*$	$10^{-2} - 1$	$10^{-2} - 10^{-1}$	$< 10^{-5}$
Exp't	$10^2 - 10^3$	$> 10^{-3}$	$10^{-2} - 10^{-1}$	$< 10^{-5}$

- We are not able to simulate atmospheric Reynolds numbers
- It's therefore critical that we understand the importance of this parameter (from experiments, theory, etc.)

\* High end DNS is  $4096^3$ , corresponding to  $R_\lambda \sim 1000$   
Gotoh & Fukayama (2001)

# Limiting theories for collision

**Saffman and Turner (1956)**  
**Zero Stokes number:**

$$N_c = \frac{1}{2} n^2 d^3 \left( \frac{8\pi}{15} \frac{\varepsilon}{\nu} \right)^{1/2}$$

Brunk, Koch & Lion (1998)  
Wang, Wexler and Zhou (1998)

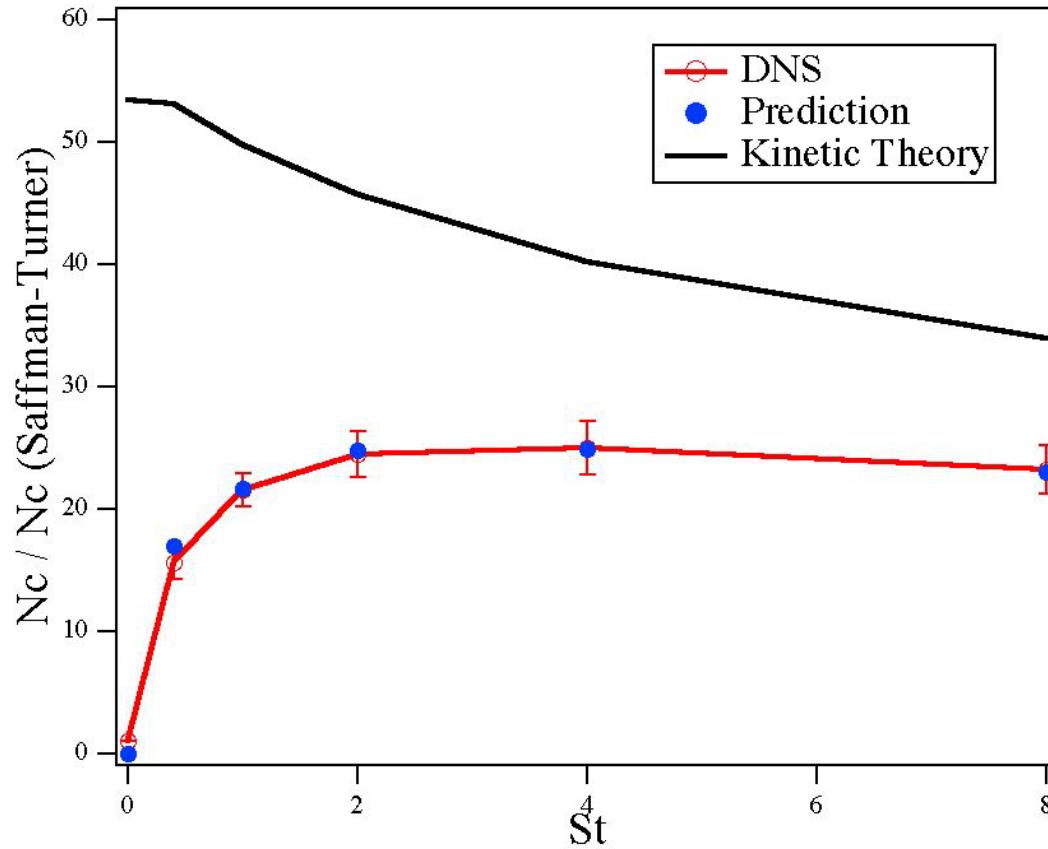
**Abrahamson (1975)**  
**Infinite Stokes number:**

$$N_c = \frac{1}{2} n^2 d^2 \left( \frac{16\pi \overline{v_p^2}}{3} \right)^{1/2}$$

$n$       number density  
 $\overline{v_p^2}$     particle kinetic energy

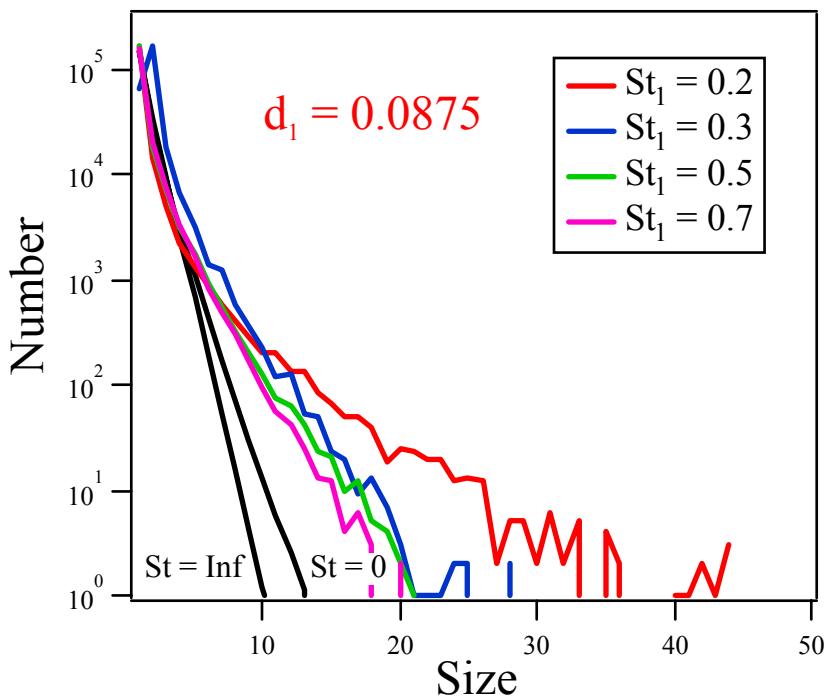
Reade & Collins (1998)

# Collision vs Stokes number

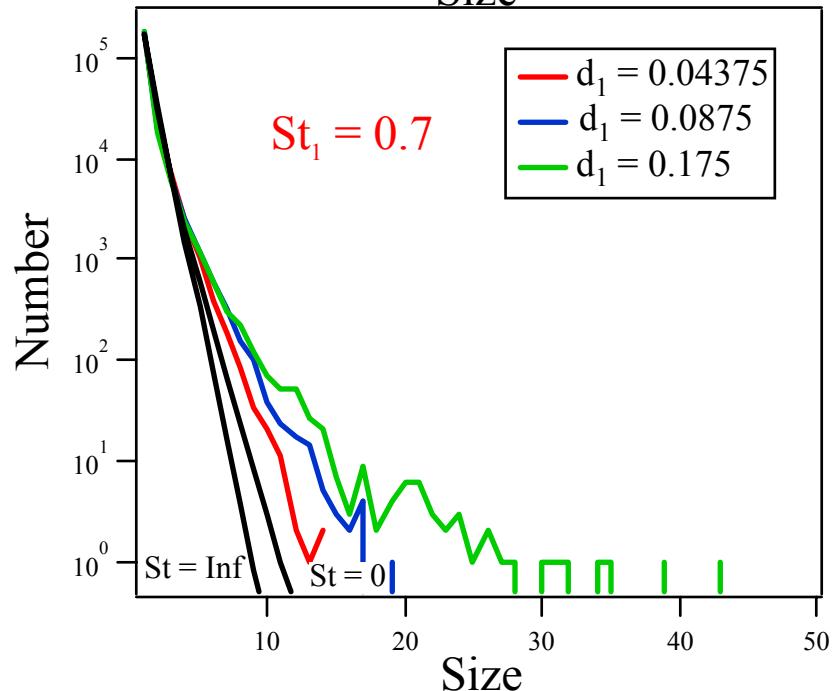
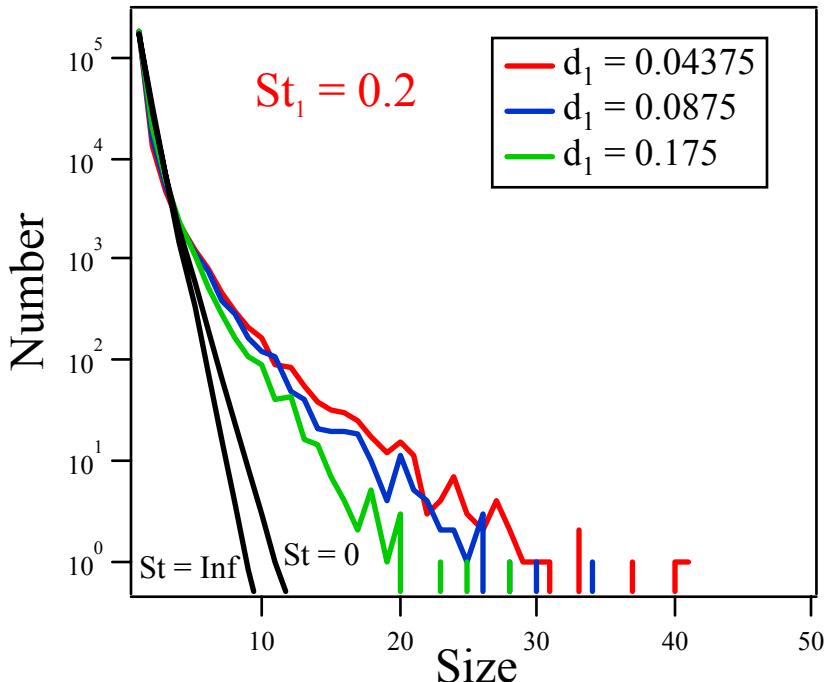


Sundaram & Collins (1997)

# Evolution of size distribution



Reade & Collins JFM (2000)



# General collision formula

$$N_c = \pi d_{ij}^2 n_i n_j g_{ij}(d_{ij}) \int_{-\infty}^0 (-w) P_{ij}(w | d_{ij}) dw$$

$$d_{ij} = (d_i + d_j)/2$$

$g_{ij}(r)$  = radial distribution function (RDF)

$w$  = relative velocity

$P(w | r)$  = PDF of relative velocity

**RDF corrects for preferential concentration  
(dominant effect at low Stokes numbers)**

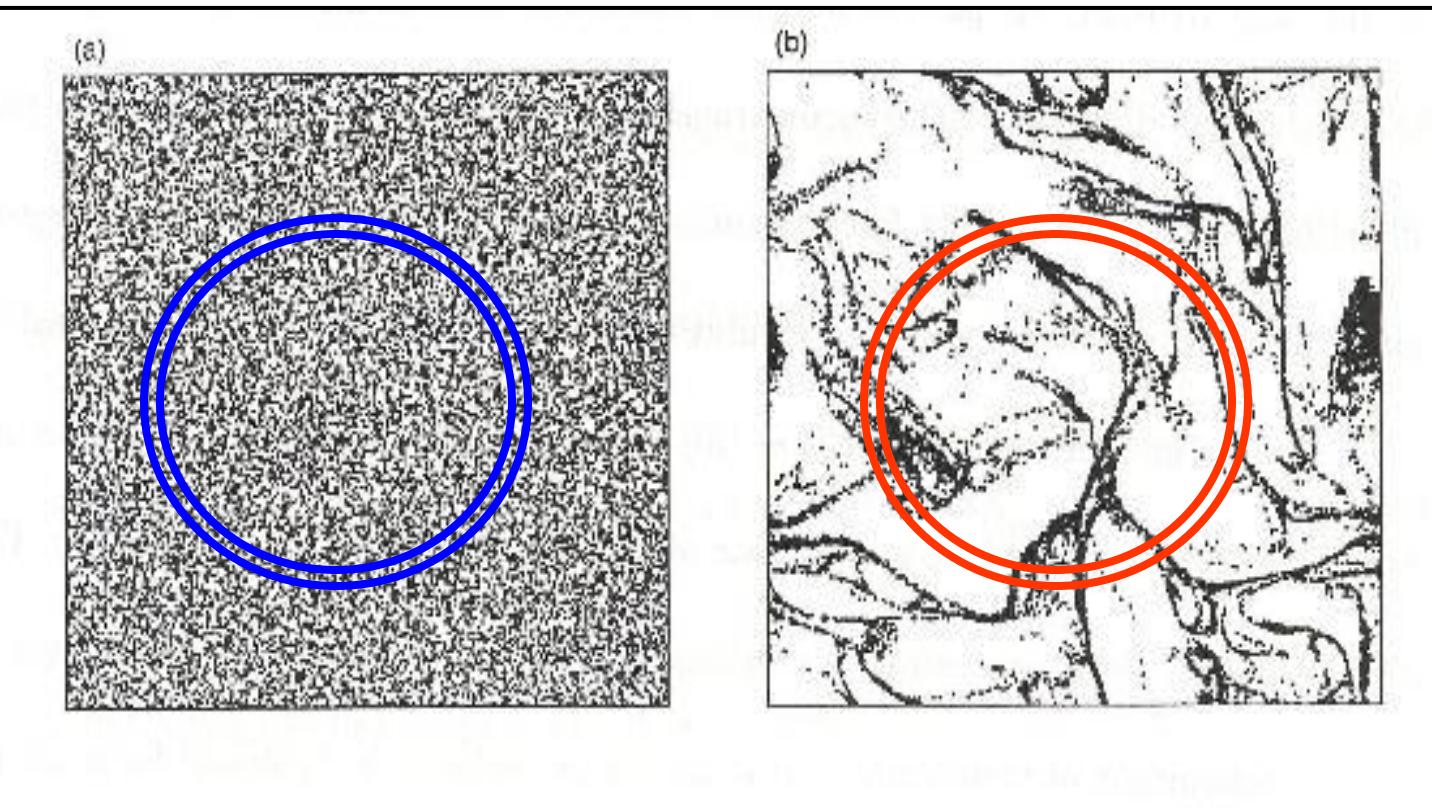
Sundaram & Collins (1997)

Wang, Wexler and Zhou (1998)

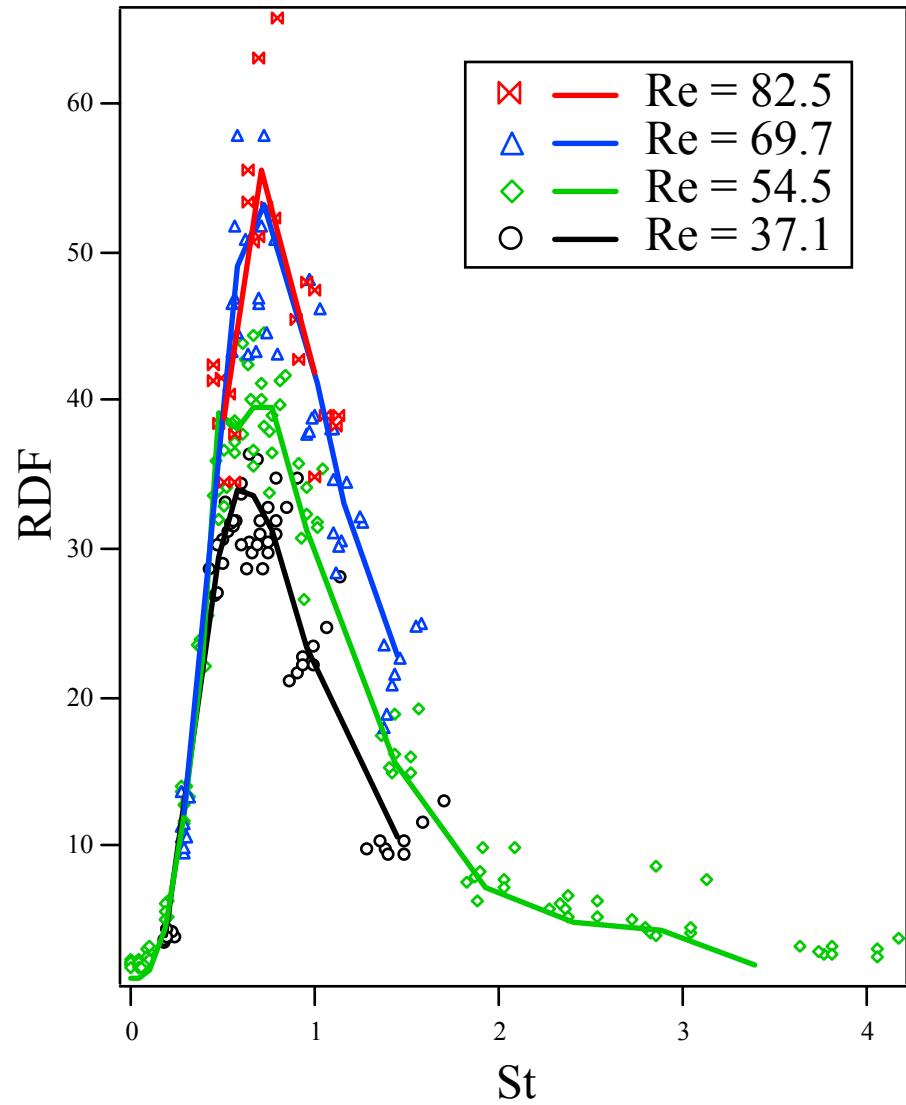
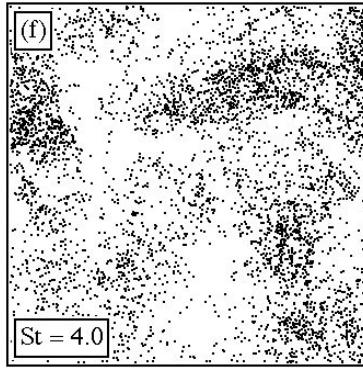
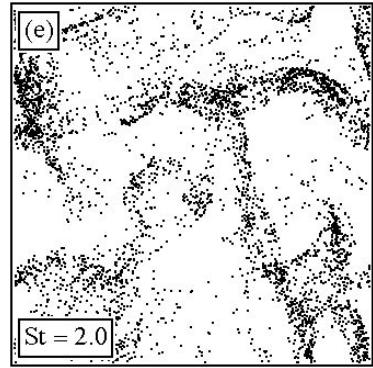
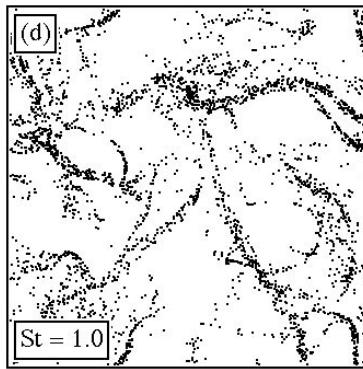
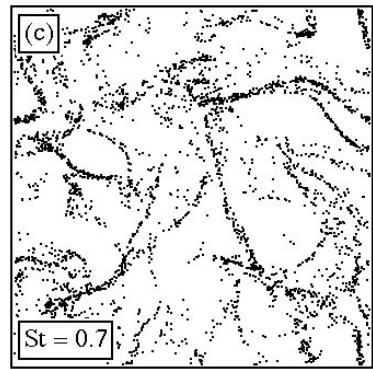
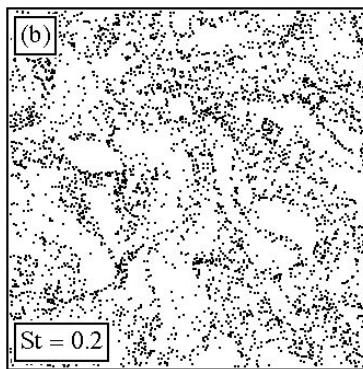
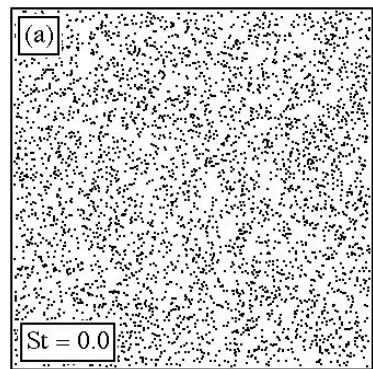
**RDF**  $g(r) \equiv \frac{\# \text{ pairs}}{\text{expected } \# \text{ pairs}}$

## Parametric Dependence

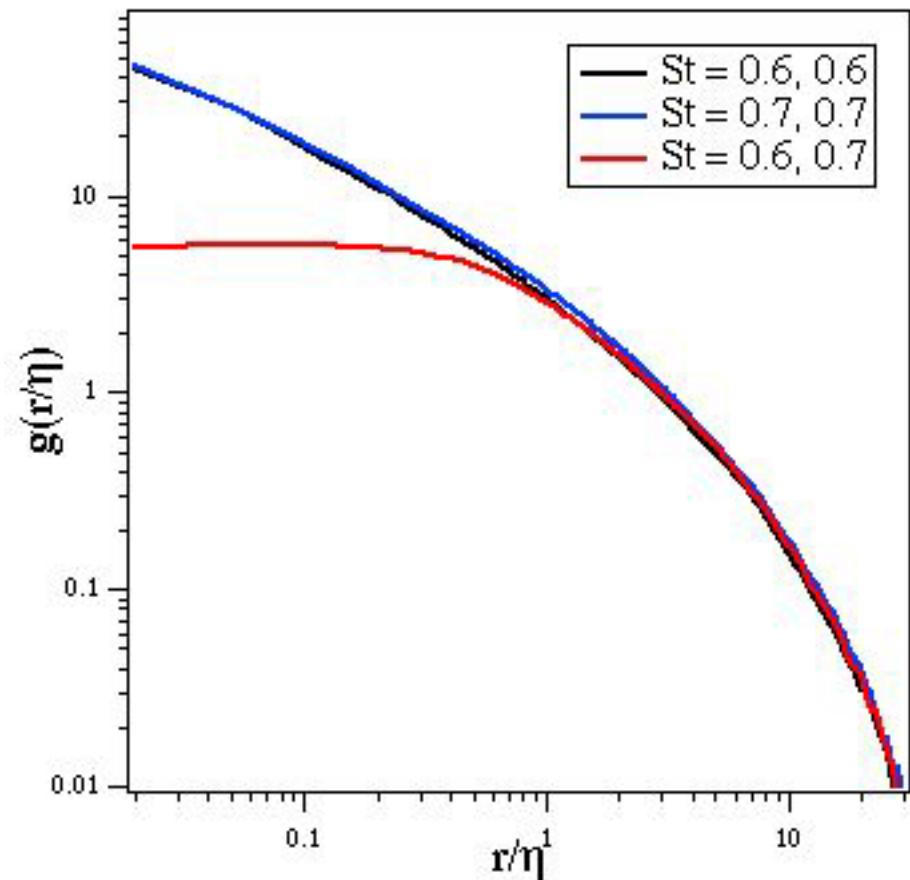
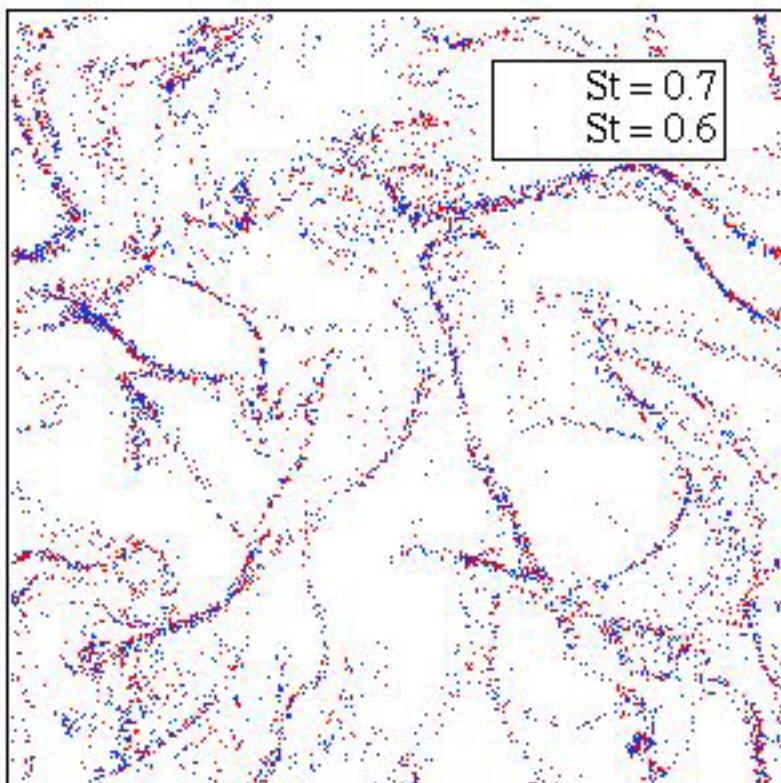
- volume fraction
- Stokes number
- size parameter
- Reynolds number



# Stokes number dependence

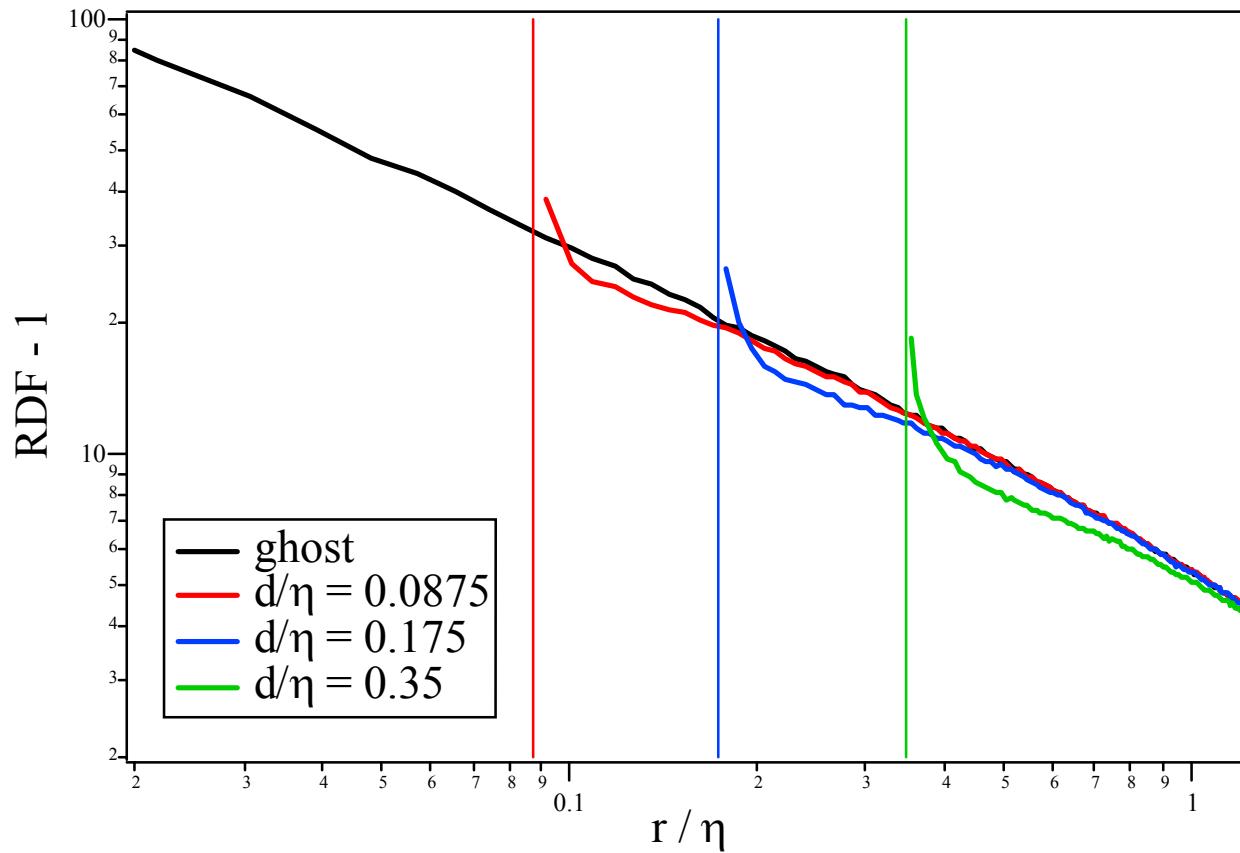


# Bi-disperse St dependence

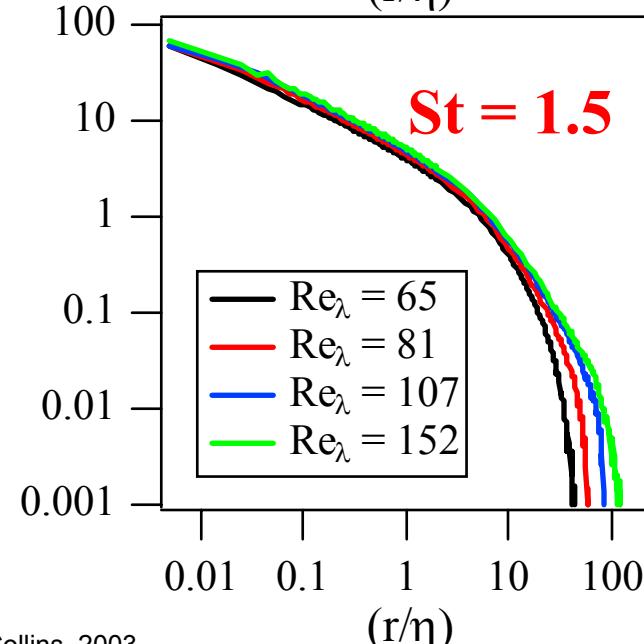
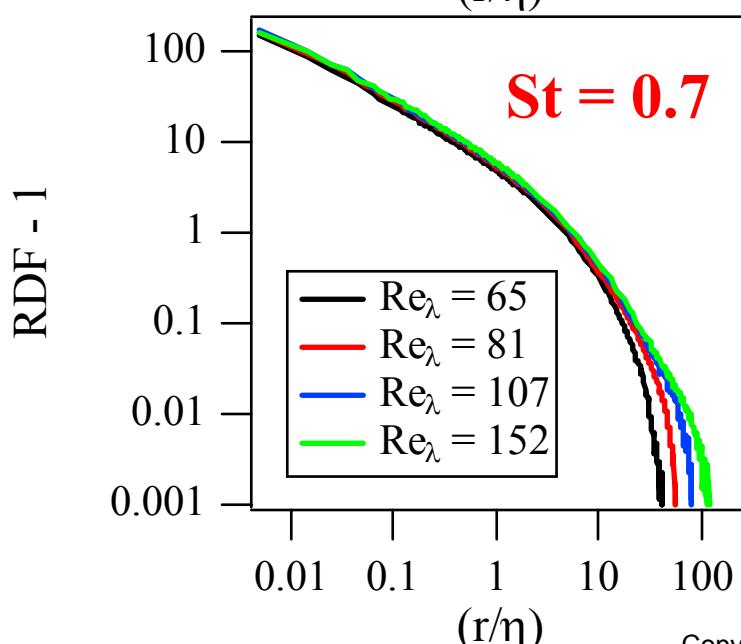
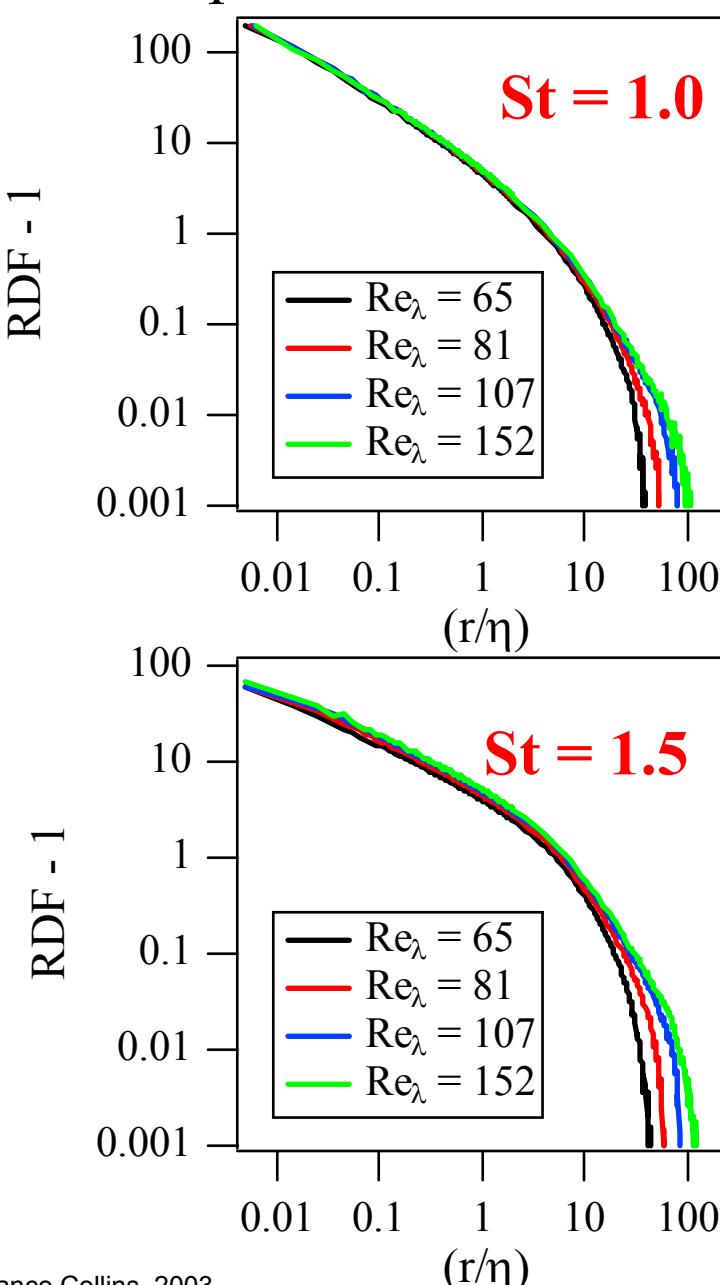
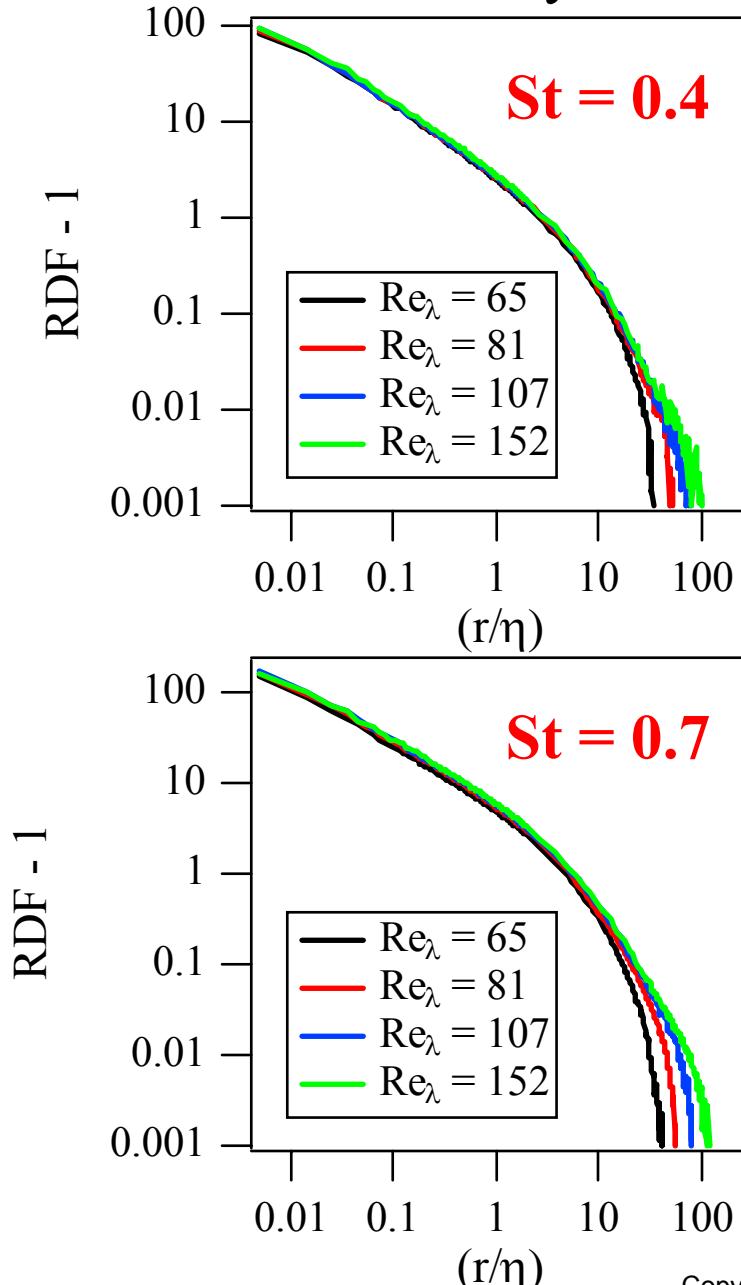


**Suppression of off-diagonal collisions broadens the distribution**

# Size parameter

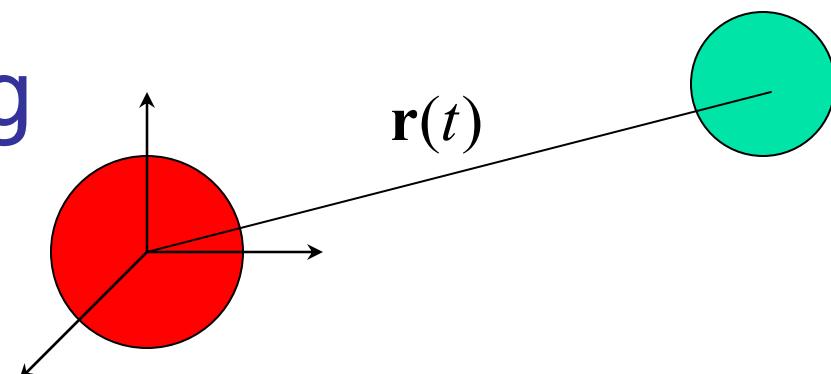


# Reynolds Number Dependence

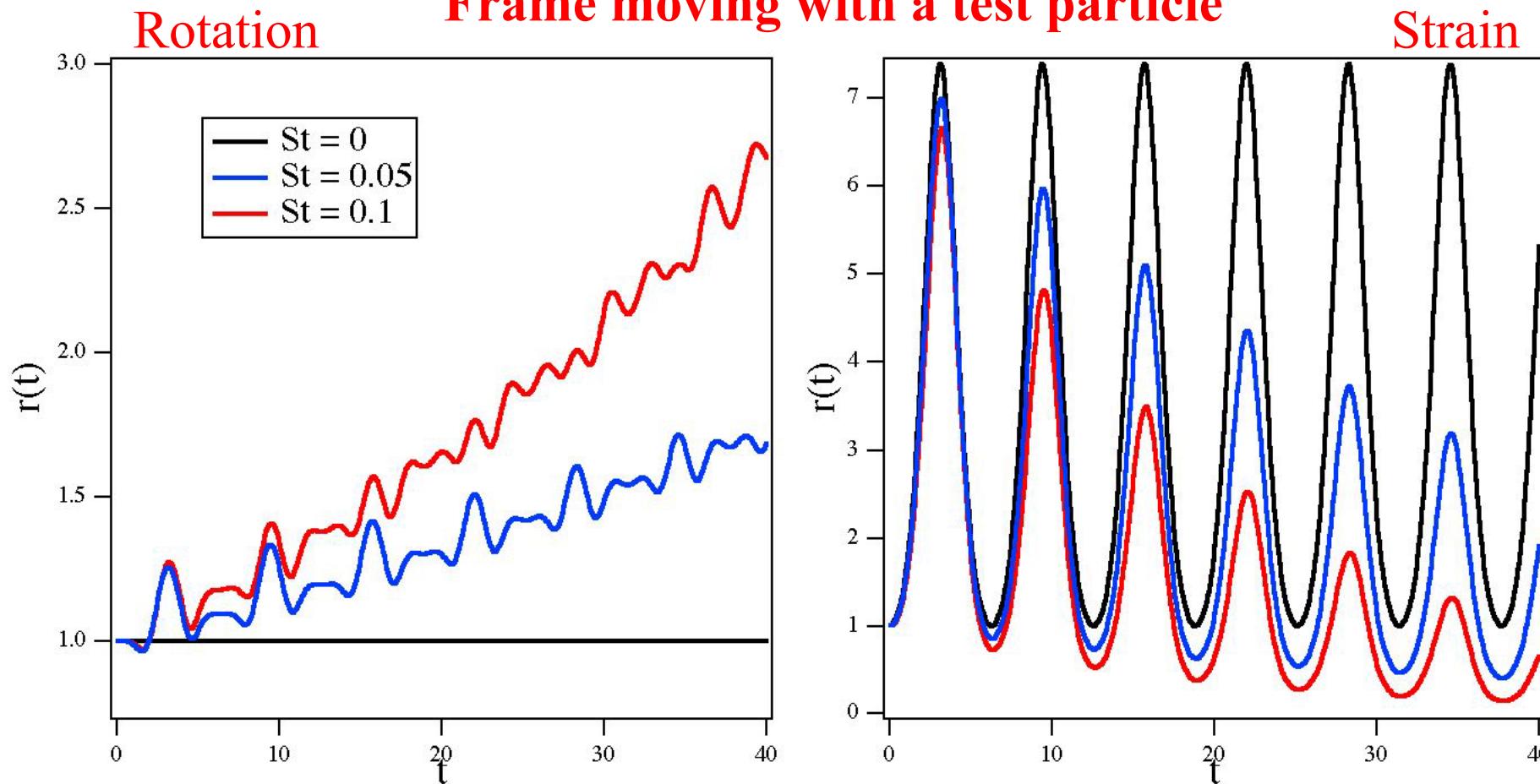


# Physics of clustering

Maxey (1987)



Frame moving with a test particle



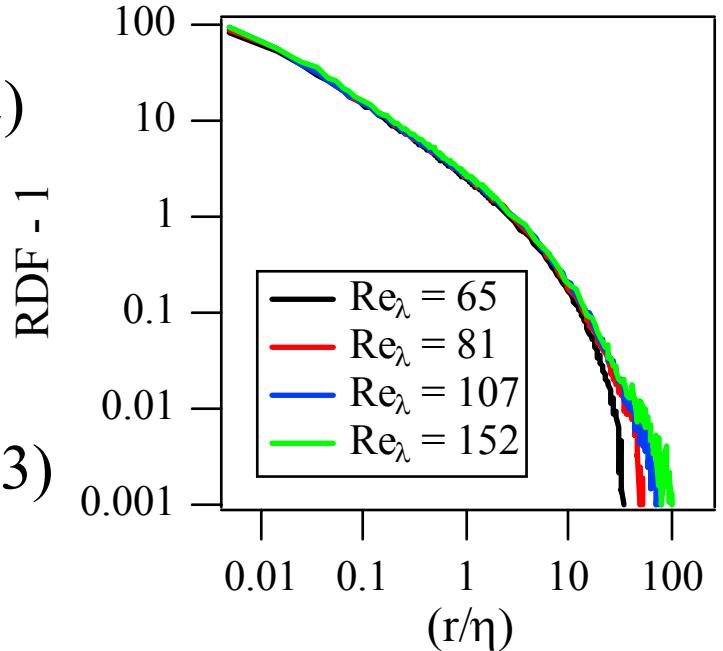
# Recent Theoretical Developments

- Wang, Wexler & Zhou (2000)  
relative velocity  
clustering effect
- Falkovich, Fouxon and Stepanov (2002)  
clustering effect in clouds
- Zaichik & Alipchenkov (2003)  
relative velocity  
clustering
- Chun, Koch, Ahluwalia & Collins (2003)  
clustering ( $St \ll 1$ )

$$g\left(\frac{r}{\eta}\right) = c_0 \left(\frac{\eta}{r}\right)^{c_1}$$

$$c_0 (R_\lambda, St, \Phi)$$

$$c_1 (R_\lambda, St, \Phi)$$



# Chun et al. (2003) St<<1

$$\frac{\partial g}{\partial t} = -\frac{1}{r^2} \frac{\partial (r^2 A r g)}{\partial r} + \frac{1}{r^2} \frac{\partial}{\partial r} \left[ r^2 B r^2 \frac{\partial g}{\partial r} \right]$$

nonlocal diffusion

$$A = \frac{St}{3 \tau_\eta} \left( \langle S^2 \rangle_p - \langle R^2 \rangle_p \right)$$

$$\frac{\Delta \langle S^2 \rangle_p}{St} = \left[ \frac{\sigma_\varepsilon^2}{\varepsilon^2} T_{\varepsilon\varepsilon} - \frac{\rho_{\varepsilon\xi} \sigma_\varepsilon \sigma_\xi}{\varepsilon^2} T_{\varepsilon\xi} \right] , \quad \frac{\Delta \langle R^2 \rangle_p}{St} = \left[ \frac{\rho_{\varepsilon\xi} \sigma_\varepsilon \sigma_\xi}{\varepsilon^2} T_{\xi\varepsilon} - \frac{\sigma_\xi^2}{\varepsilon^2} T_{\xi\xi} \right]$$

## Steady State

$$g(r) = c_0 \left( \frac{\eta}{r} \right)^{c_1}$$

$$c_1 = A / B = 6.6 St^2$$

$$c_1 = 3.6 St \left( \langle S^2 \rangle_p - \langle R^2 \rangle_p \right)$$

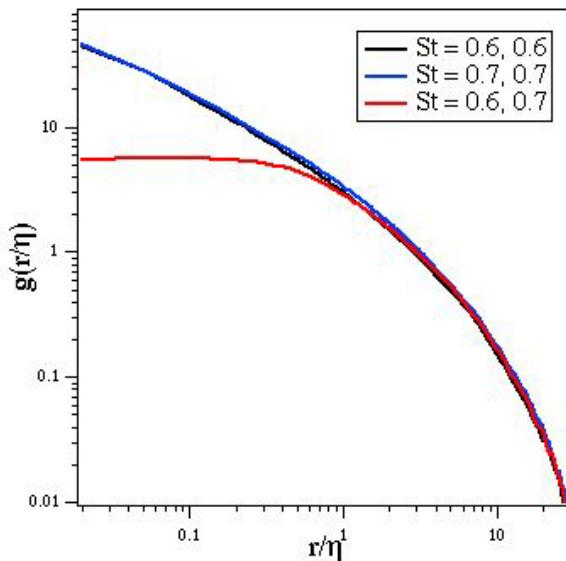
St	DNS	Stoch	Theory
0.05	0.016	0.016	0.017
0.1	0.08	0.07	0.06
0.15	0.15	0.14	0.14
0.2	0.19	0.18	0.17

# Chun et al. (2003) Bidisperse

- Fluid accelerations give rise to relative diffusion

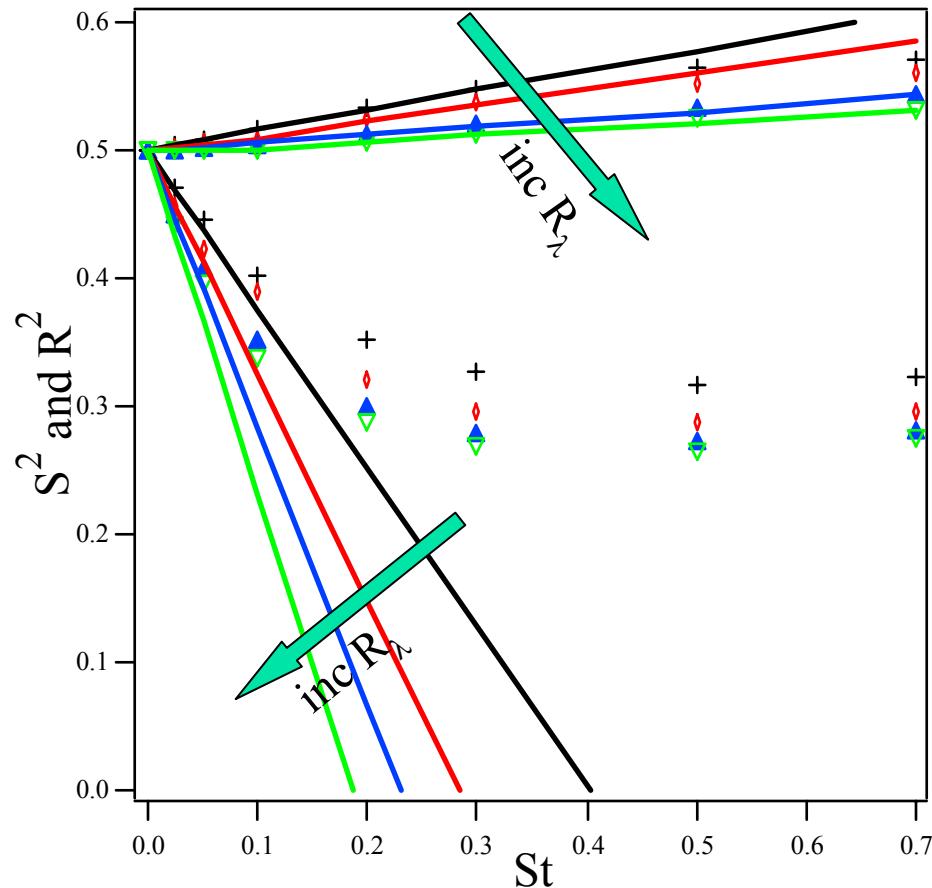
$$g_{AB}(r) = c_0 \left[ \frac{\eta^2}{r^2 + r_c^2} \right]^{c_1/2}$$

$$r_c = B' |St_A - St_B| \eta$$



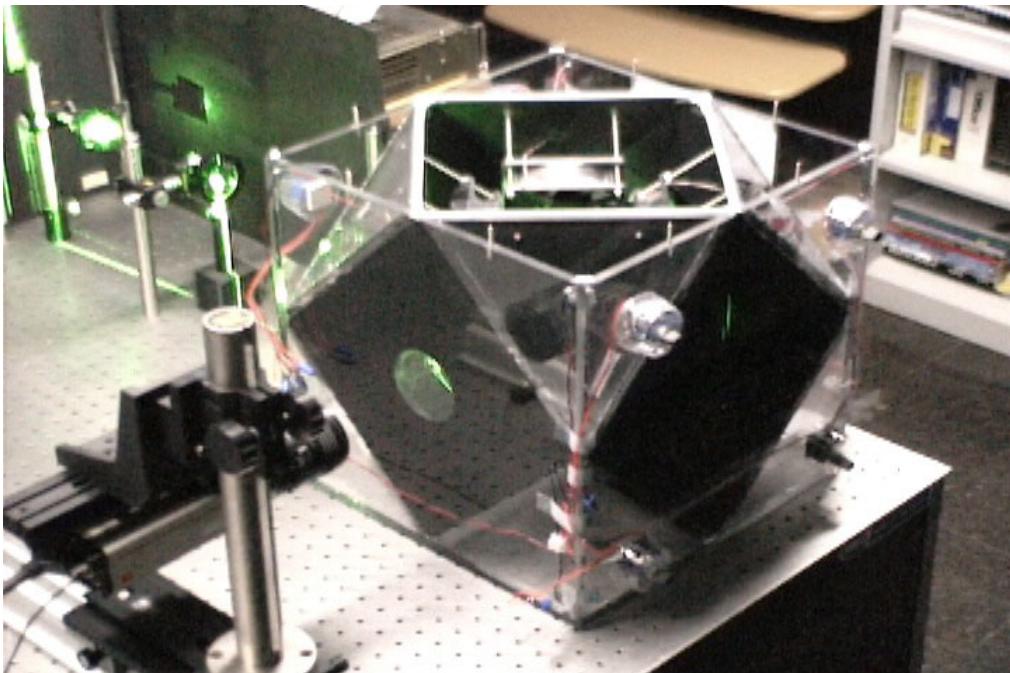
# Reynolds Number Dependence

$$c_1 = 3.6 \text{ } St \left( \langle S^2 \rangle_p - \langle R^2 \rangle_p \right)$$

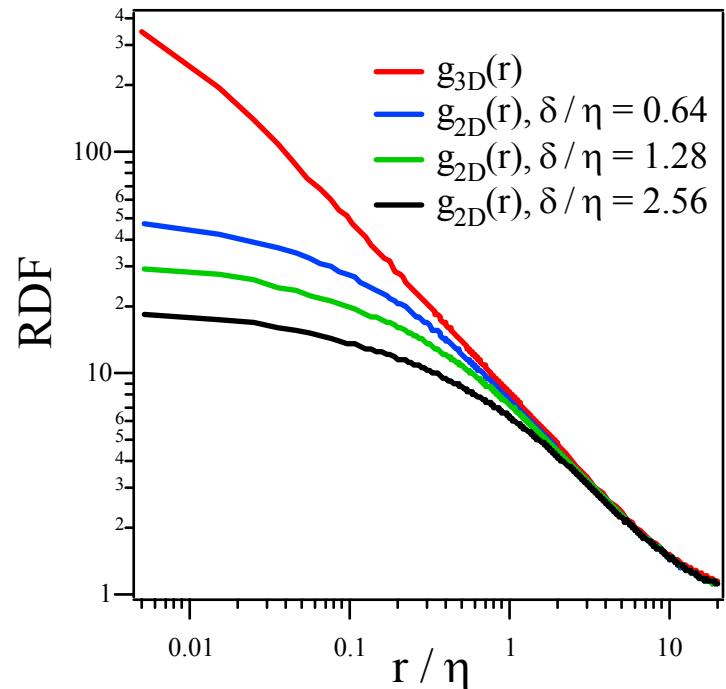


# Experimental 3D Particle Imaging

Professor Hui Meng



Why 3D?

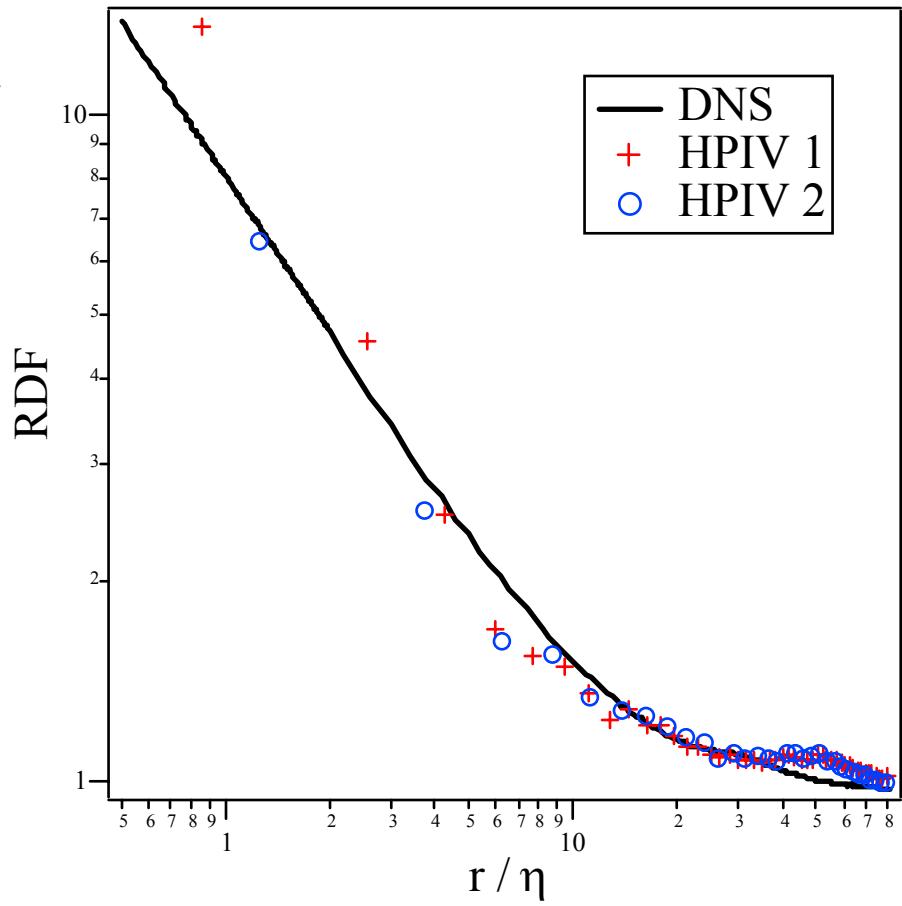
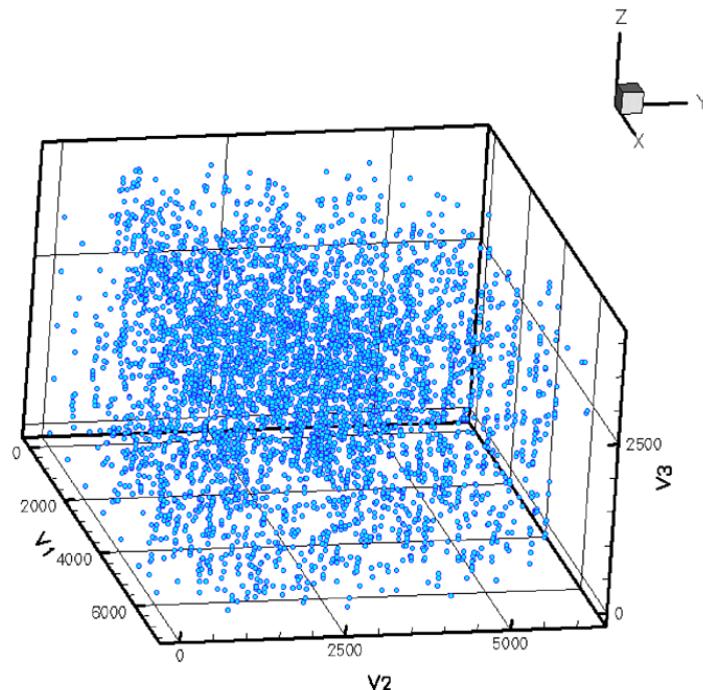


- Cover a Broader Range of  $R_\lambda$
- Validate DNS and Theory



Holtzer & Collins (2002)

# Preliminary Results



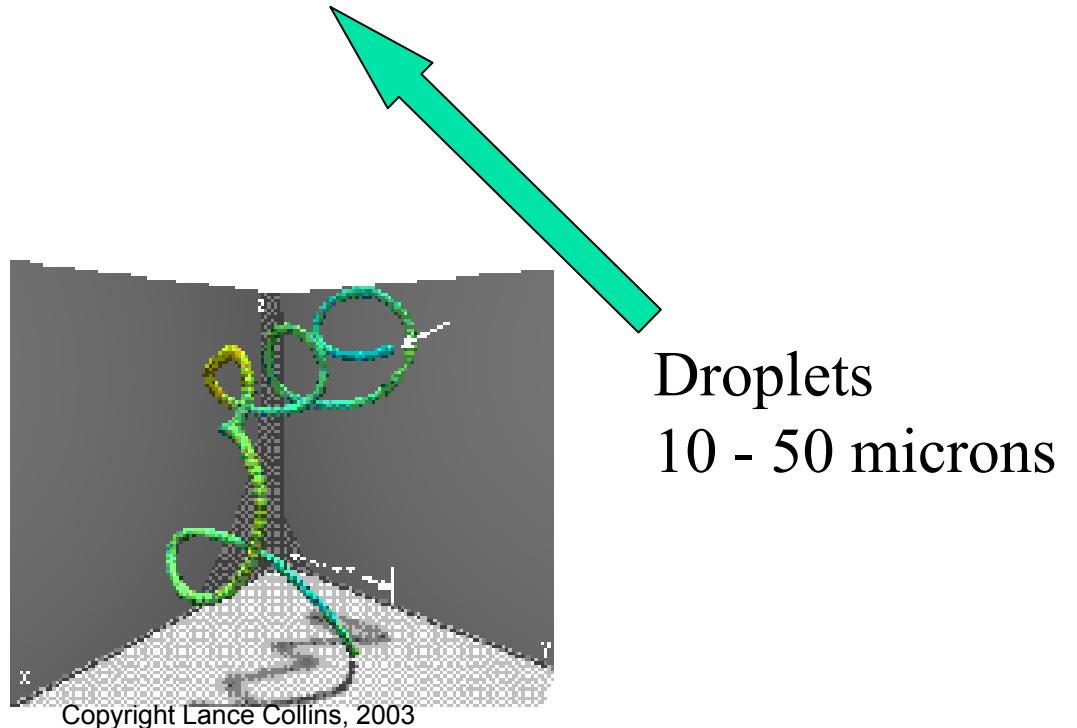
# Particle Tracking

Eberhard Bodenschatz and Zellman Warhaft

## Wind Tunnel (active grid)

QuickTime™ and a YUV420 codec decompressor are needed to see this picture.

- Track droplets
  - Multiple (4) cameras
  - High speed (above 50,000 fps)
  - Integral time and length scales
- Measure accelerations
  - Compare with DNS
  - Test theoretical predictions



# Summary

- **Particle clustering in turbulent flows**
  - Increases collision frequency 1-2 orders of magnitude
  - Strongly favors like collisions; broadens particle size distribution
- **Theoretical predictions for RDF**
  - Stokes number dependence
  - Size parameter
  - Reynolds number dependence remains in dispute (key for cloud physics)
- **Experiments**
  - Validate DNS and theory
  - Increase the range of Reynolds numbers
- **Enabling Technologies**
  - 3D imaging essential
  - Holographic imaging (RDF at an instant)
  - High-Speed Stereoscopic Tracking (Lagrangian statistics)

DNS has continuously guided theoretical and experimental work

# Acknowledgments

## Colleagues

- Prof. Hui Meng (SUNY-Buffalo)
- Prof. Don Koch (Cornell)
- Prof. E. Bodenschatz
- Prof. Z. Warhaft
- Prof. R. Shaw (Mich. Tech)
- Prof. M. Loewenberg (Yale)

## Grad Students and Postdoc

- S. Sundaram (CFD Research)
- W. Reade (Kimberly Clark)
- A. Keswani (Goldman Sachs)
- A. Ahluwalia (Epic Sys.)
- S. Rani

## Undergraduate Students

- Carolyn Nestleroth
- Melissa Feeney
- Anthony Fick

NAG3-2470



CTS-9417527  
PHY-0216406

# Future Work

- High-resolution DNS (JC.001)
  - Effect of shear flow
  - Hydrodynamic interactions
- Extend theory to coalescing system
- Experimental measurements
  - HPIV at an instant
  - Lagrangian statistics

