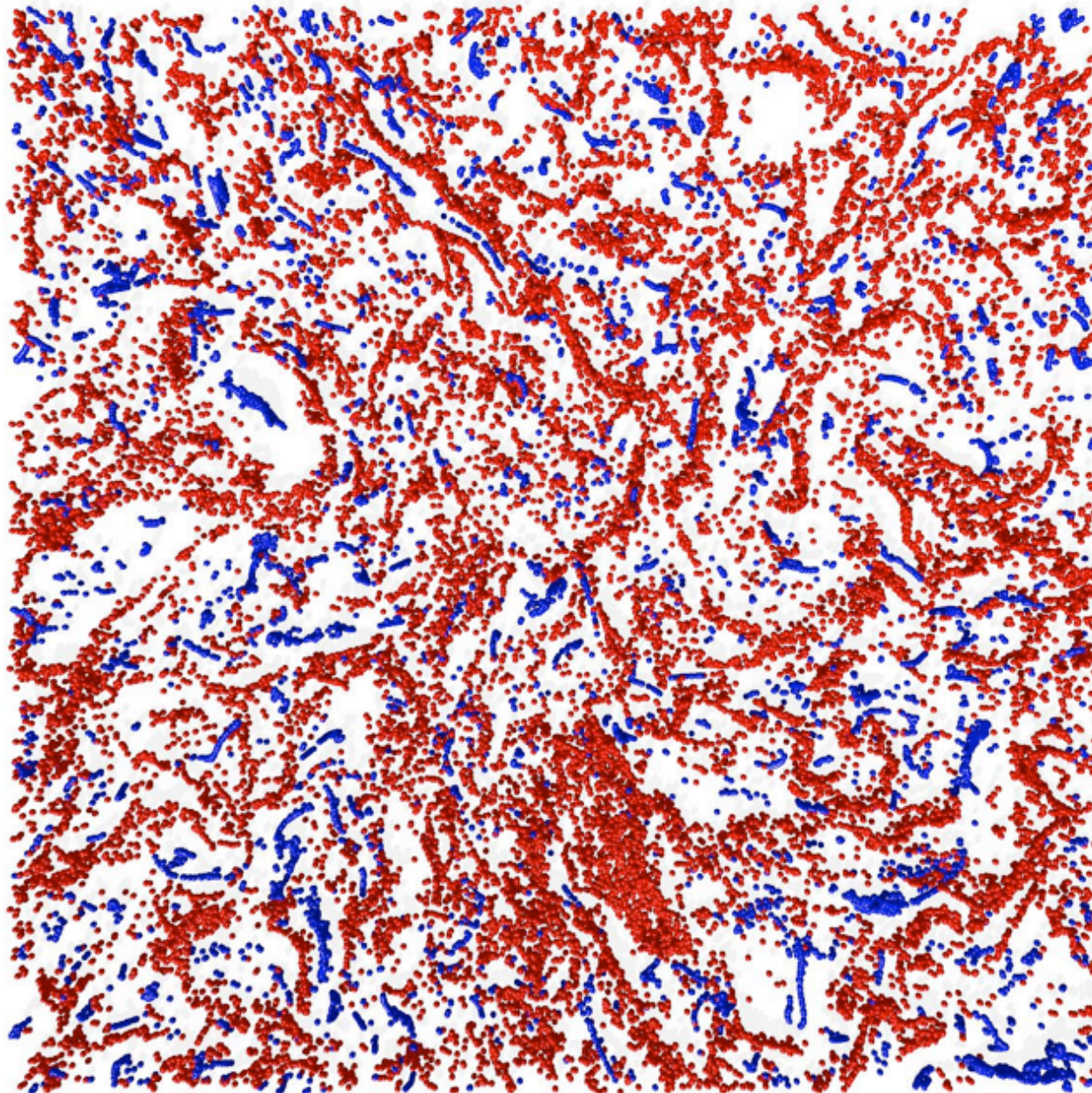


# Concentration and segregation of particles and bubbles by turbulence : a numerical investigation



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# Phenomenology of particles in turbulence

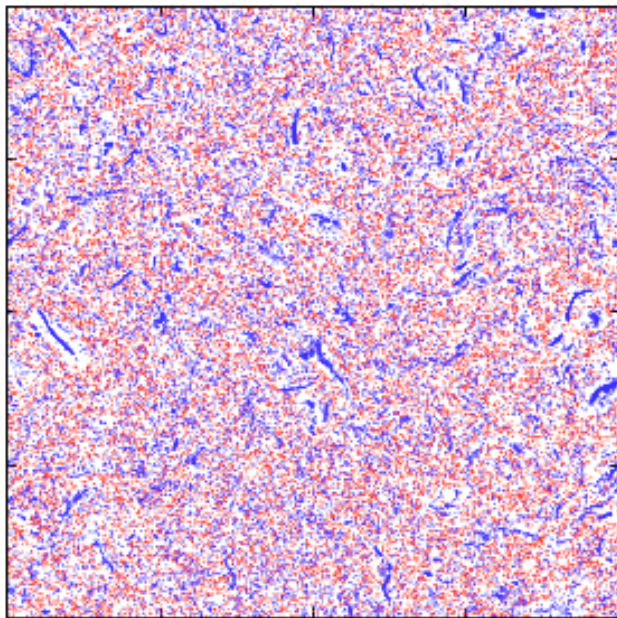
## 1) Ejection/injection of heavy/light particles from/in vortices

**preferential concentrations** Maxey (1987), Squires & Eaton (1991), Fessler Eaton (1994)

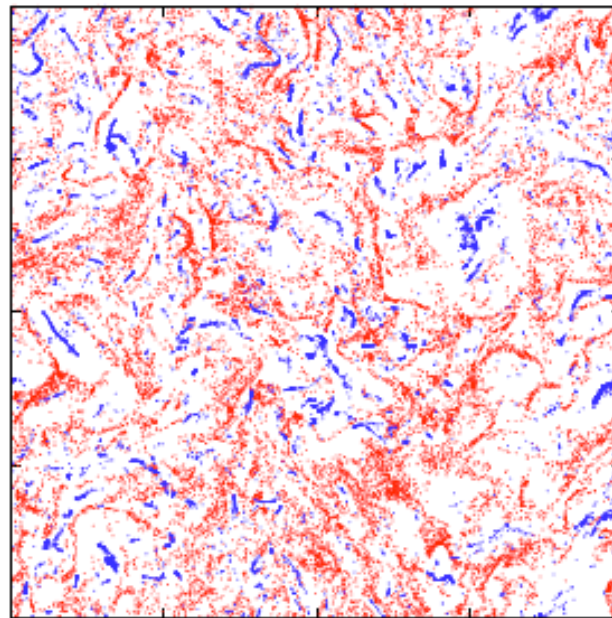
## 2) Finite response time to fluid fluctuations (smoothing of fast time scales)

Slice  $\sim 512 \times 512 \times 8$   $\eta$  from DNS

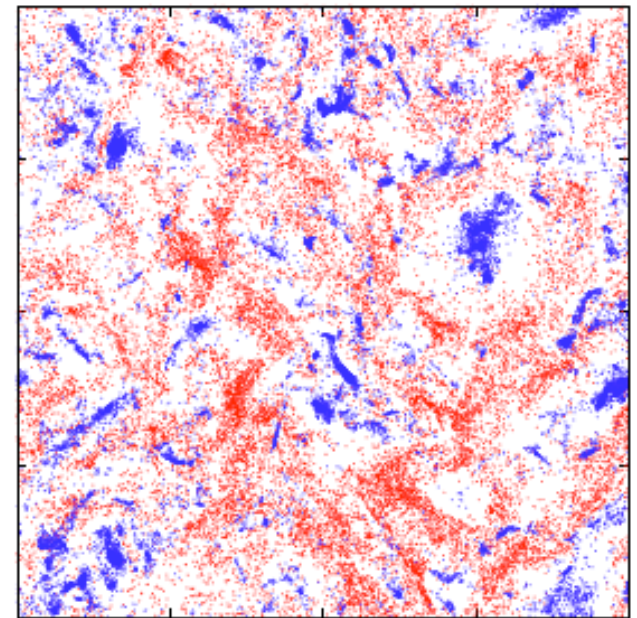
**heavy** particles  $\rho_p \gg \rho_f$  (**red**) and **light** particles  $\rho_p \ll \rho_f$  (**blue**)



Stokes number  $St = 0.1$



$St = 1$



$St = 4.1$

# Objective

study statistical properties and  
correlation with the carrier flow structures  
of inertial particle clusters  
for a wide range of density ratios and response times

quantitative measure  
of the effects of particle inertia  
in turbulent flows.

# Numerical Simulations

Incompressible flow field  $\mathbf{u}$

Navier-Stokes

$$\mathbf{D}_t \mathbf{u} = \partial_t \mathbf{u} + \mathbf{u} \cdot \nabla \mathbf{u} = -\nabla p + \nu \Delta \mathbf{u} + \mathbf{F}$$

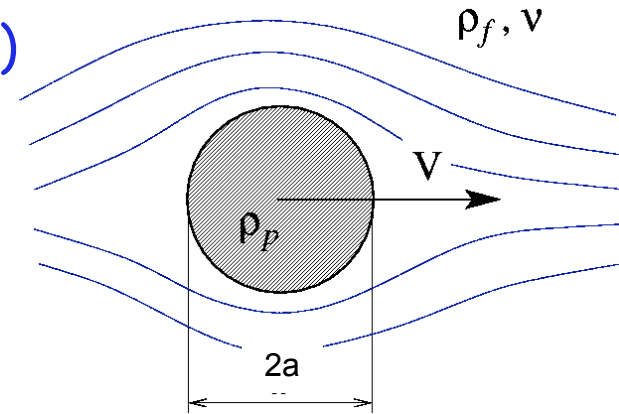
- Homogeneous isotropic turbulence
- Large scale forcing
- Periodic cubic domain
- $Re_\lambda \approx 78$  ( $L^3 = 128^3$ )
- $Re_\lambda \approx 180$  ( $L^3 = 512^3$ )

# Particle's equation of motion

Particles with  $a \ll \eta$  (Kolmogorov scale)

Particle Reynolds:  $Re_a = a v / \nu \ll 1$

Dilute suspensions (no collisions),  
no gravity



$$\frac{d\mathbf{x}}{dt} = \mathbf{v}$$

$$\frac{d\mathbf{v}}{dt} = \beta \frac{D}{Dt} \mathbf{u}(\mathbf{x}(t), t) - \frac{1}{\tau_p} (\mathbf{v} - \mathbf{u}(\mathbf{x}(t), t))$$

$$\beta = \frac{3\rho_f}{\rho_f + 2\rho_p}$$

$$\tau_p = \frac{1}{3\beta} \frac{a^2}{\nu}$$

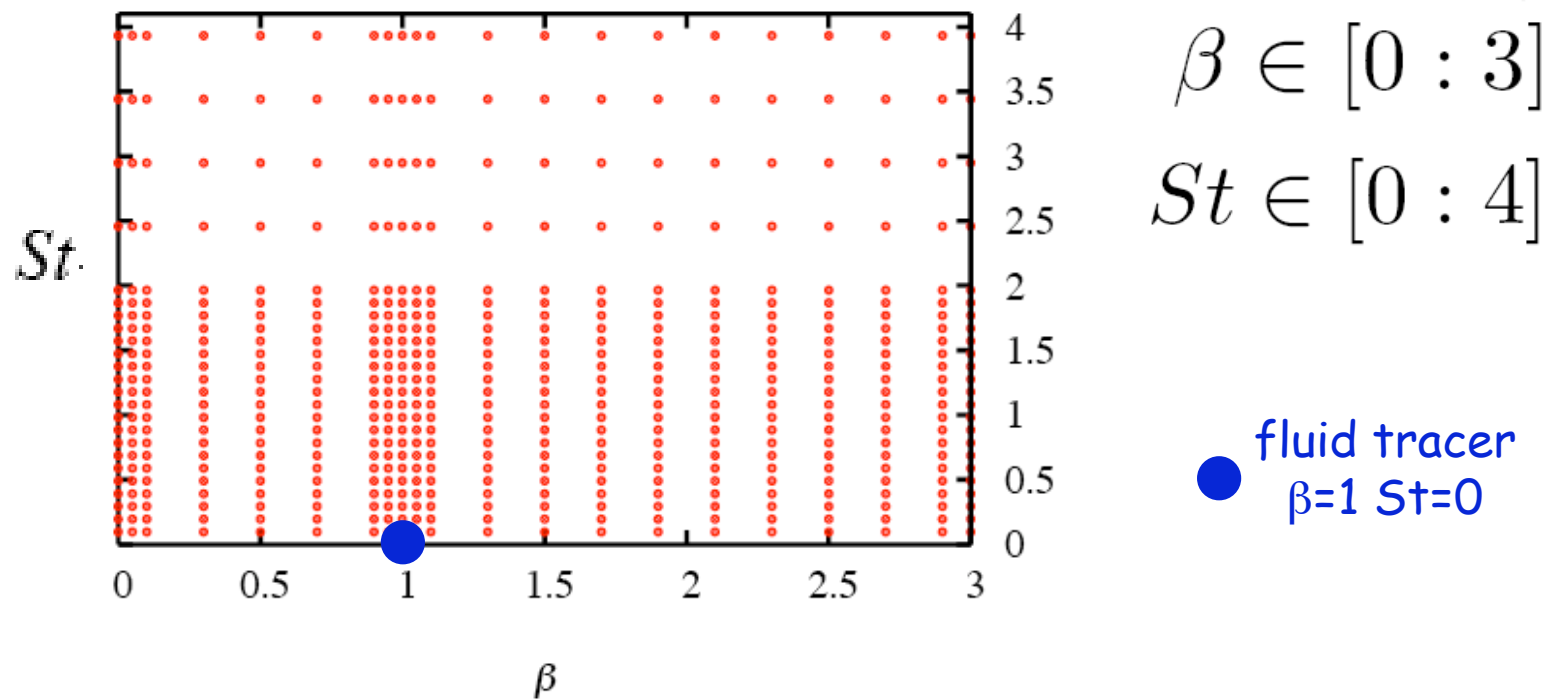
$$St \equiv \frac{\tau_p}{\tau_\eta} = \frac{1}{3\beta} \frac{a^2}{\eta^2}$$

(essentially: Maxey & Riley *Phys. Fluids* 1983, T.R.Auton et al. *JFM* 1988)

# Numerical simulations: particles

Total number of particles:  $N_{\text{tot}} \approx 50 \cdot 10^6$ :

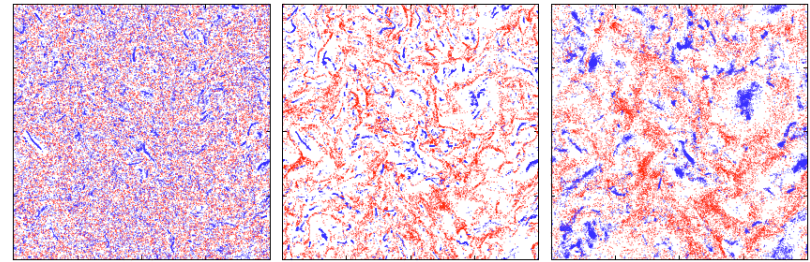
Grouped in  $\sim 500$  types on the  $\beta$ - $St$  parameter-space:



Particles tracked for  $10s T_{\text{eddy}}$

**Database:** particle's position, velocity, acceleration,  
fluid velocity and gradients at particle position

# Outline



## (i) Clusters dependence on $\beta$ and $St$ (small-scale features):

- attractor (Kaplan-Yorke) dimension  $D_{KY}$
- correlation dimension  $D_2$
- Minkowski functionals.

## (ii) Clusters correlation to local flow properties

- particle concentration conditioned to local flow topology.



## (i) Kaplan-Yorke dimension: $D_{KY}$

Particle equations of motion  
defines a dissipative dynamical system

Attractor's dimension in the  $(\mathbf{x}, \mathbf{v})$  space:  
Kaplan Yorke dimension  $D_{KY}$

$$D_{KY} \equiv J - \frac{\lambda_1 + \dots + \lambda_J}{\lambda_{J+1}} \quad \begin{array}{l} \lambda_1 + \dots + \lambda_J \geq 0 \\ \lambda_1 + \dots + \lambda_{J+1} < 0 \end{array}$$

6 Lyapunov exponents computed by tracking

$$\mathbf{R}(t) \equiv (\delta \mathbf{x}(t), \delta \mathbf{v}(t))$$

$$\frac{d\mathbf{R}}{dt} = \mathcal{M}_t \mathbf{R}$$

$$\lambda_i = \lim_{T \rightarrow \infty} \gamma_i(T) \quad \leftarrow \text{stretching rates}$$

Standard ortho-normalization  
Gram-Schmidt procedure adopted

As in Bec *Phys. Fluids* (2003), Bec *JFM* (2005), Bec et al. *Phys. Fluids* (2006)

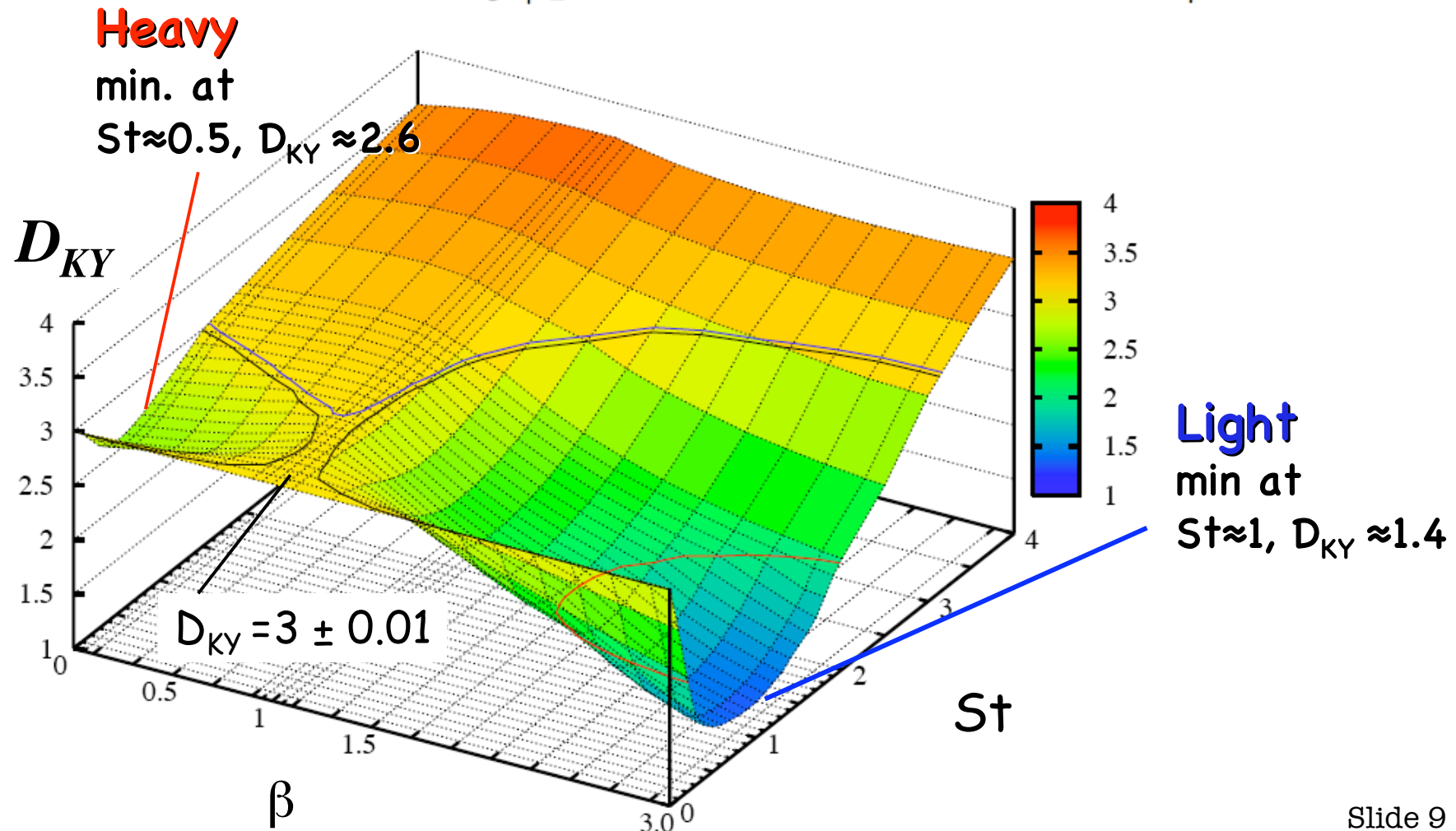


# Kaplan-Yorke dimension

Balance between contraction and expansion

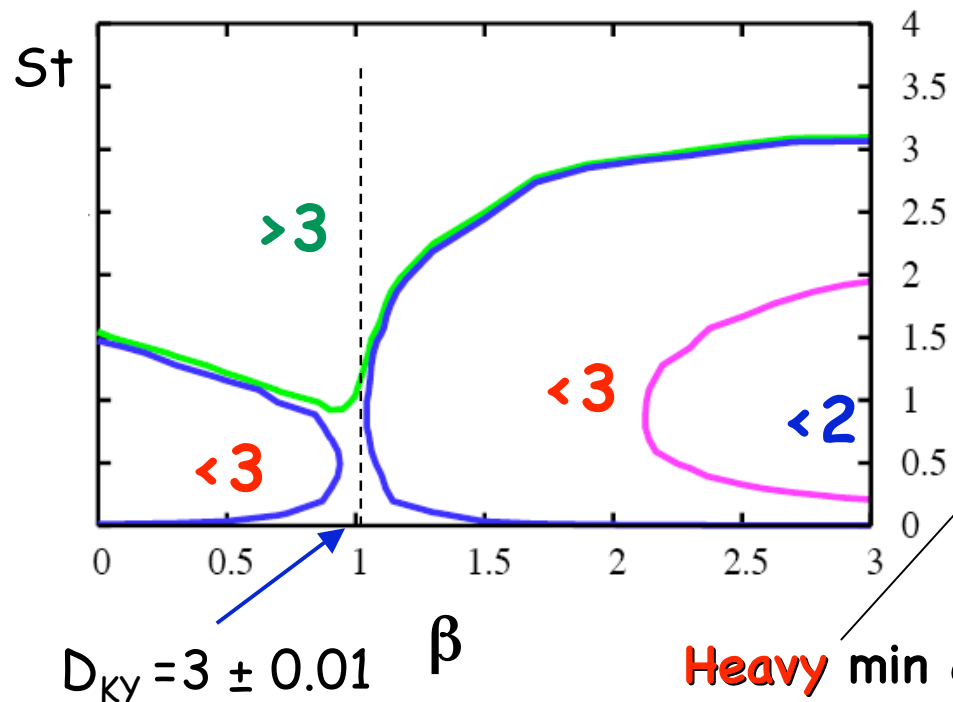
$$D_{KY} \equiv J - \frac{\lambda_1 + \dots + \lambda_J}{\lambda_{J+1}}$$

$$\begin{aligned} \lambda_1 + \dots + \lambda_J &\geq 0 \\ \lambda_1 + \dots + \lambda_{J+1} &< 0 \end{aligned}$$

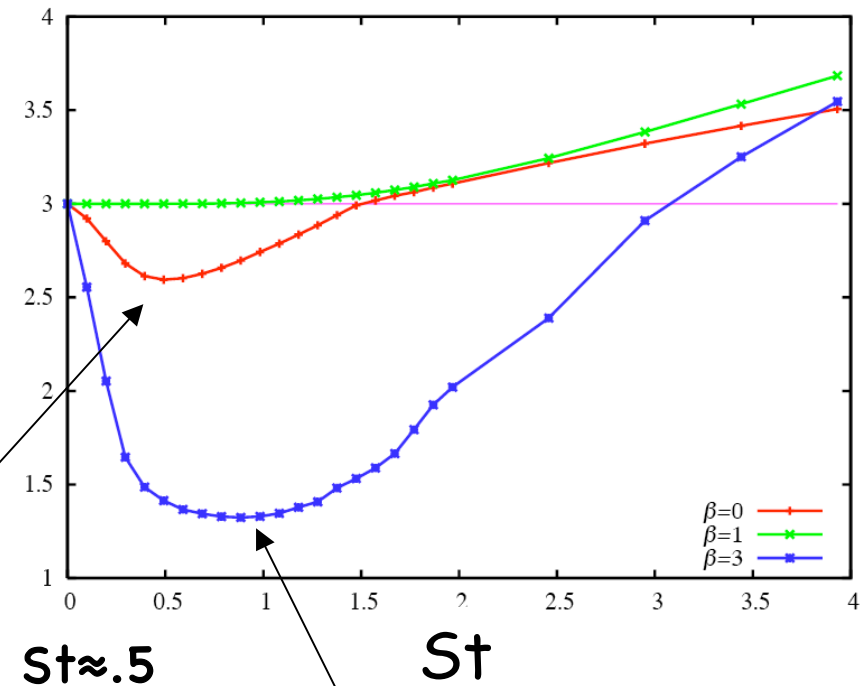


# Projection of $D_{KY}$

## Horizontal projection



## Vertical projection



Light min at  $St \approx 1$

Close to fractal dimension of  
vortex filaments in turbulence  
(Moisy&Jimenez JFM 04)

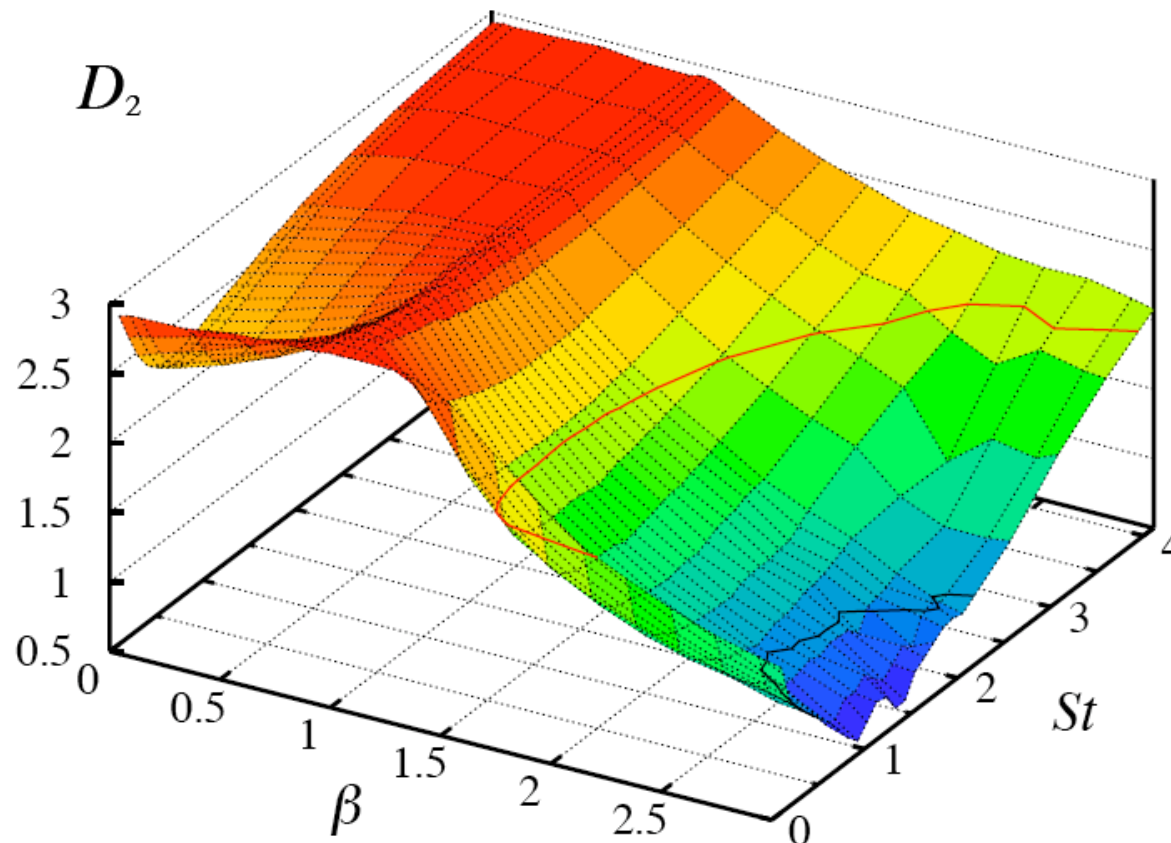
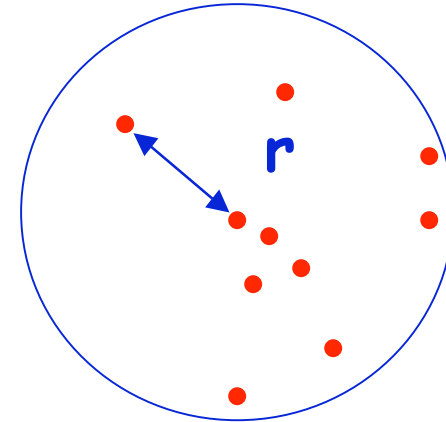
$$D_{\omega} \rightarrow 1.1 \pm 0.1$$

# Correlation dimension $D_2$

$P_2(r)$  Probability to find a couple of particle whose distance is below  $r$ .

At  $r \ll \eta$   $P_2(r) = A r^{D_2}$

fractal dimension hierarchy:  $D_2 \leq D_1 = D_{KY}$



Same features  
as  $D_{KY}$

More accessible  
in experiments

# Morphological analysis of point clouds

- Put balls  $\mathcal{B}_r(\mathbf{x}_i)$  with radius  $r$  around each particle  $i$
- Let  $r$  increase
- Measure total volume, surface, mean curvature and Euler characteristic of the emerging structure

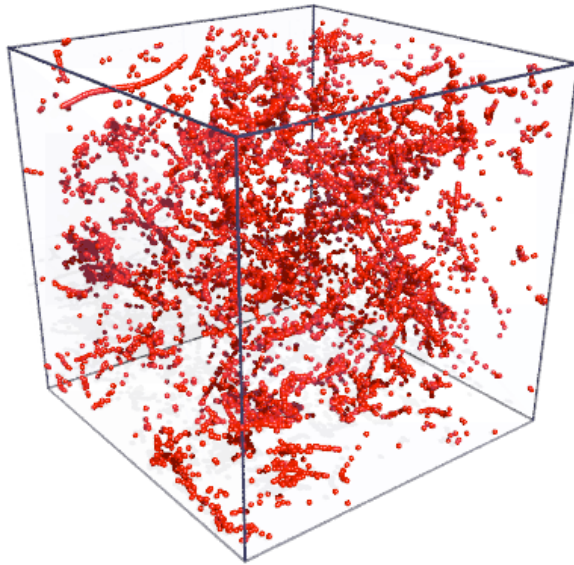
$$A_r = \bigcup_{i=0}^N \mathcal{B}_r(\mathbf{x}_i)$$

**Minkowski functionals** provide complete morphological characterization of point cloud!

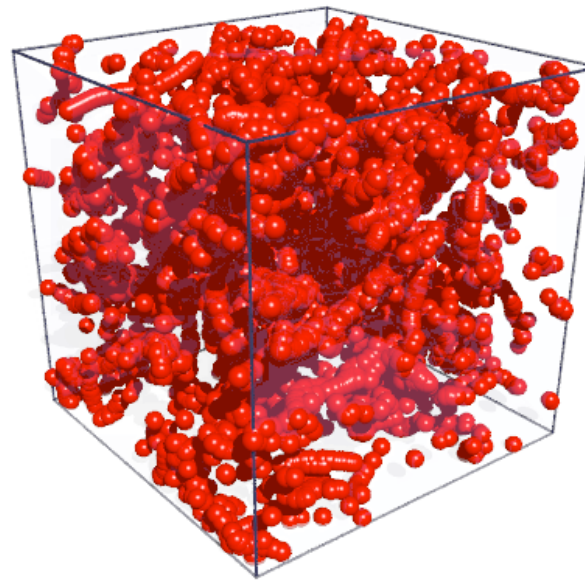


# Visualization of $A_r$

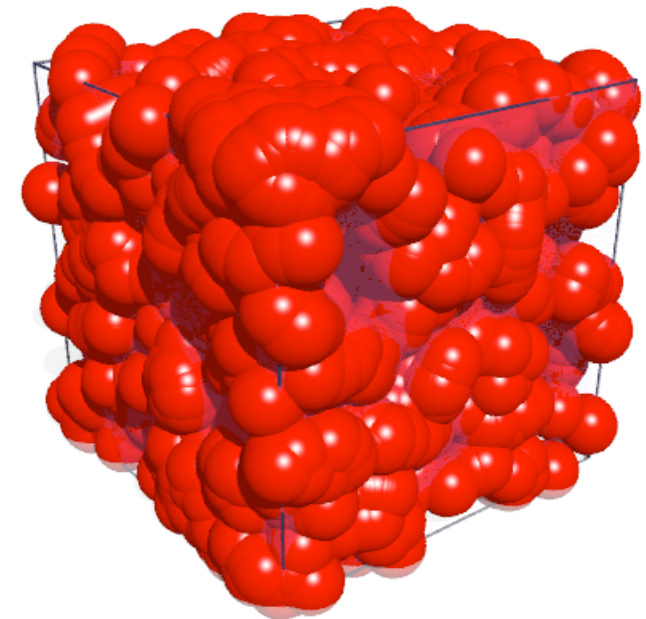
$2 \cdot 10^4$  particles with  $\beta=3$  and  $St=1$



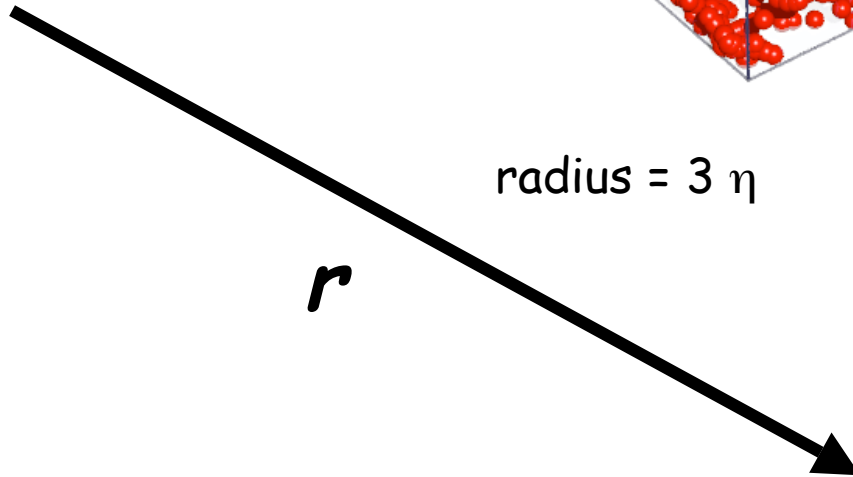
radius =  $0.5 \eta$



radius =  $3 \eta$



radius =  $10 \eta$



# Minkowski functionals $V_\mu(r)$ in 3D

$\mu$	$V_\mu(r)$	geometric quantity
0	$V$	$V$ Volume
1	$A/6$	$A$ Surface
2	$H/(3 \pi)$	$H$ Mean curvature
3	$\chi$	$\chi$ Euler characteristic

In collaboration with M. Kerscher (Munich University, Dept. Mathematics)

**see also:** Mecke, K.R., Buchert, T. and Wagner, H. (1994). Robust morphological measures for large scale structure in the universe. *Astron. Astrophys.*, **288**, 697-704.

# Comparison of three extreme cases

$\beta = 0$ , heavy



$\beta = 1$ , tracer



Poisson distribution

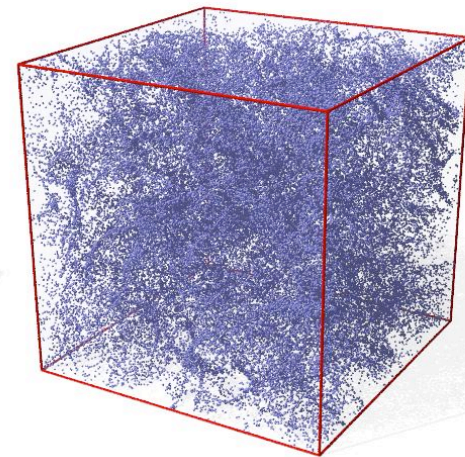
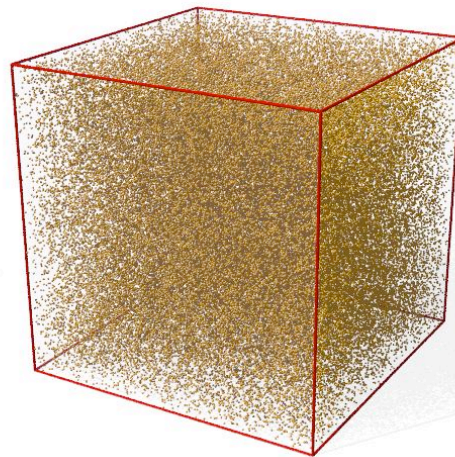
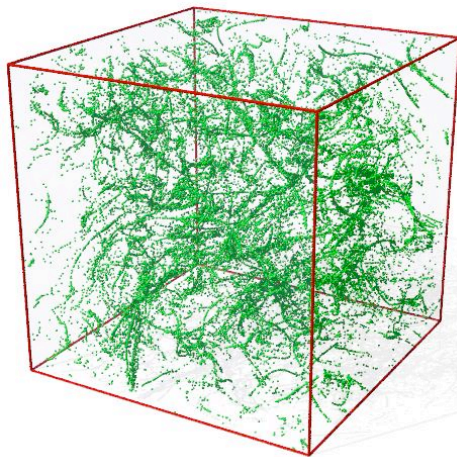
$\beta = 3$ , bubble



bubble

tracer

heavy

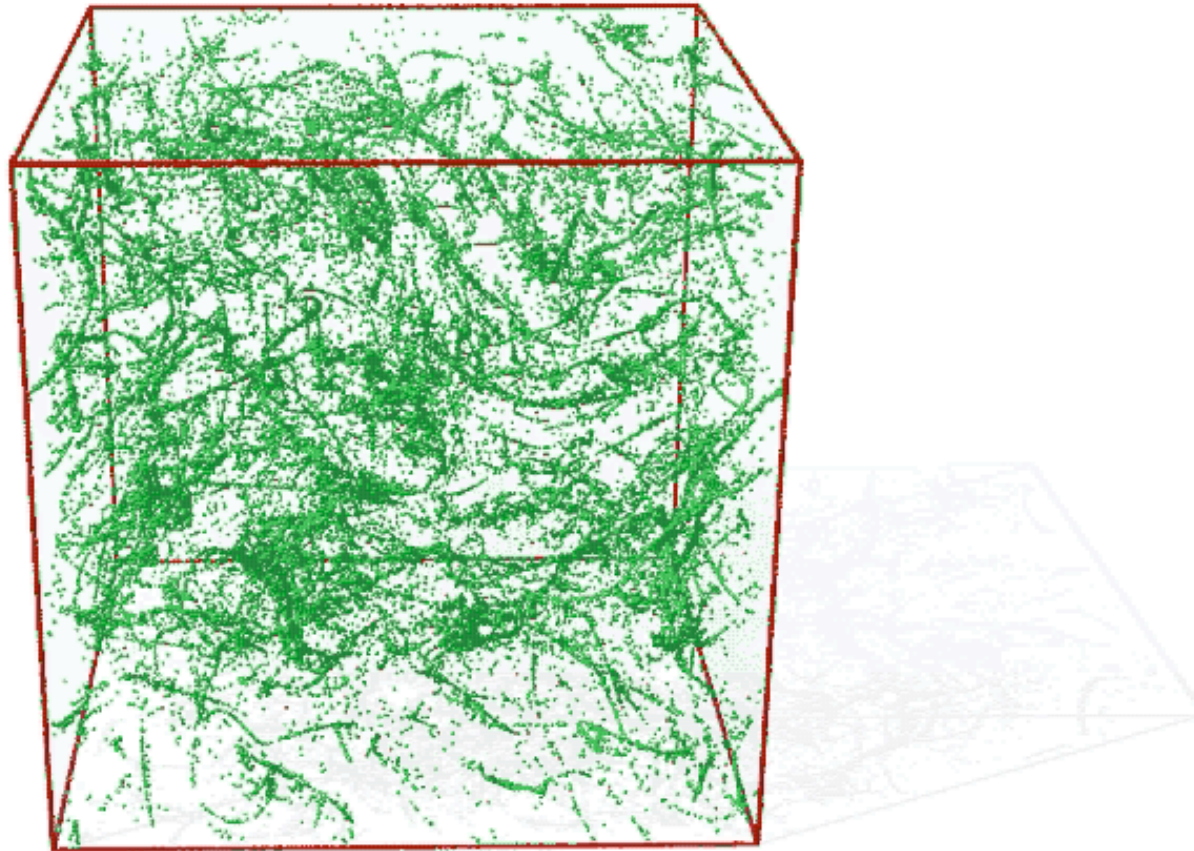


$St=0.6$        $10^5$  particles



# Bubbles $\beta=3$ , $St=0.6$ and $Re_\lambda=78$

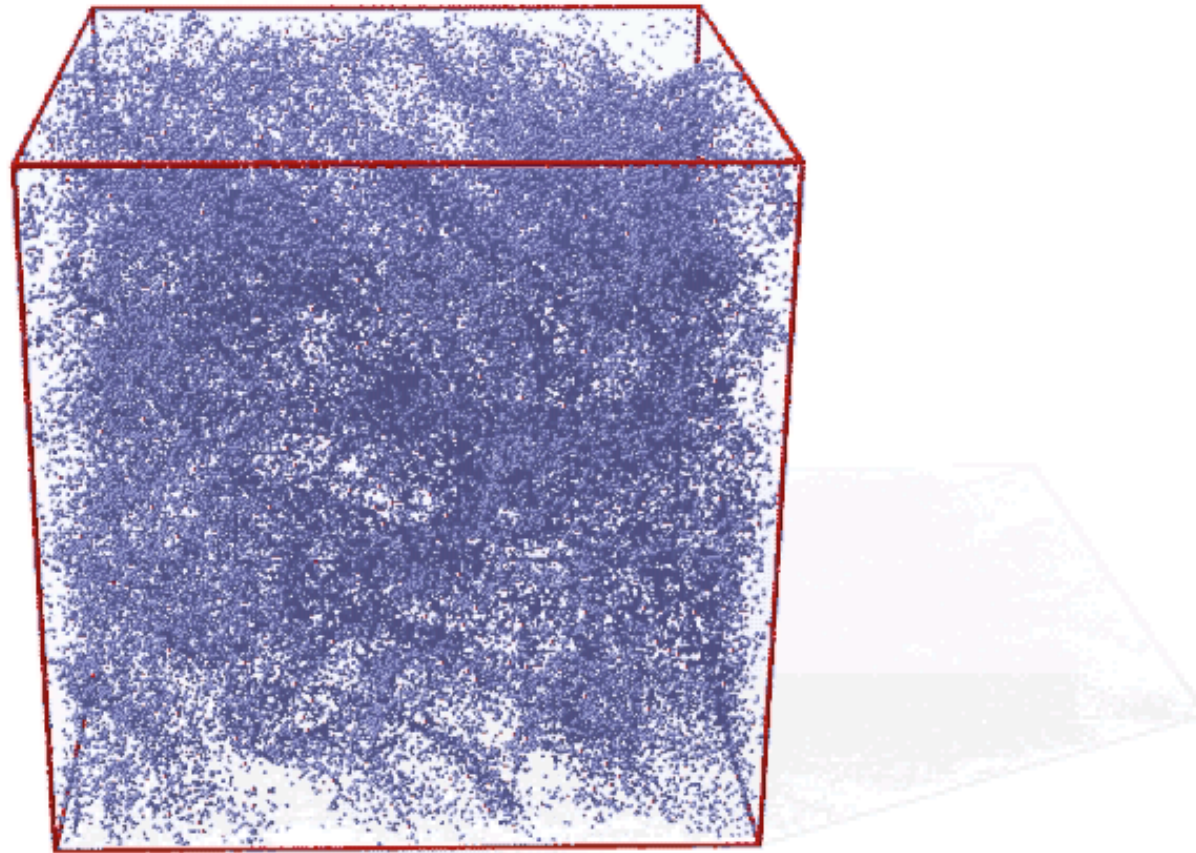
$10^5$   
particles



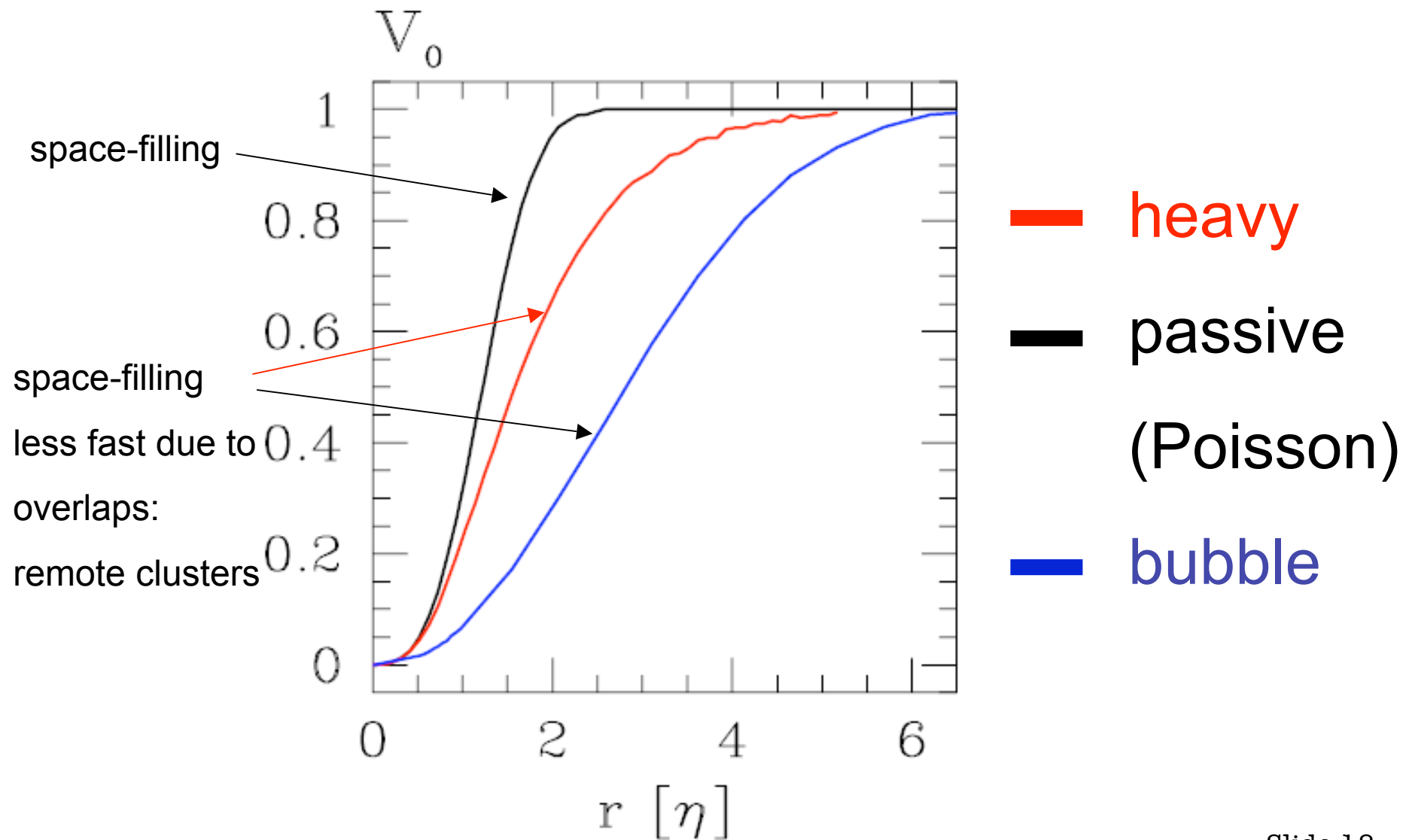


# Heavy particles $\beta=0$ , $St=0.6$ and $Re_\lambda=78$

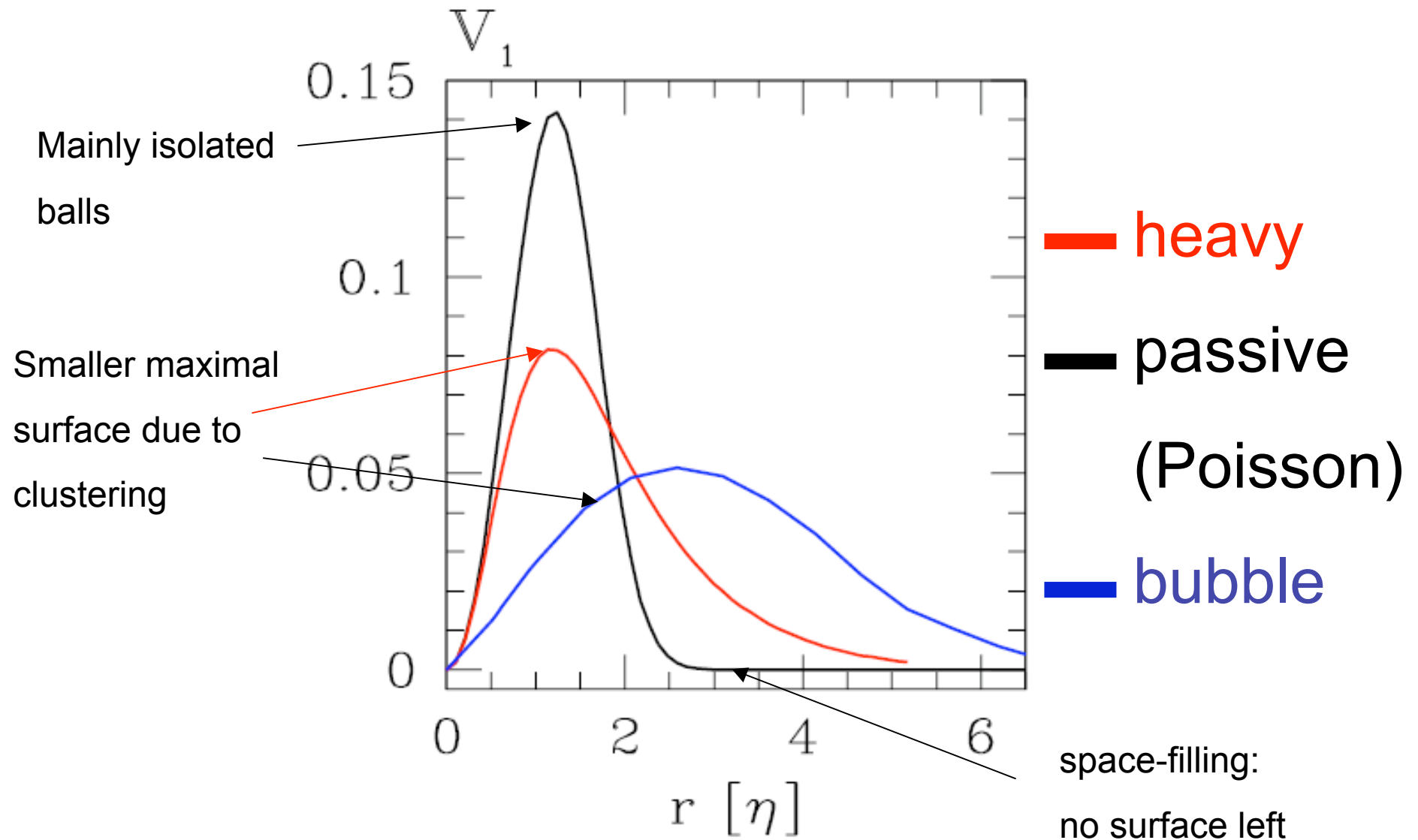
$10^5$   
particles



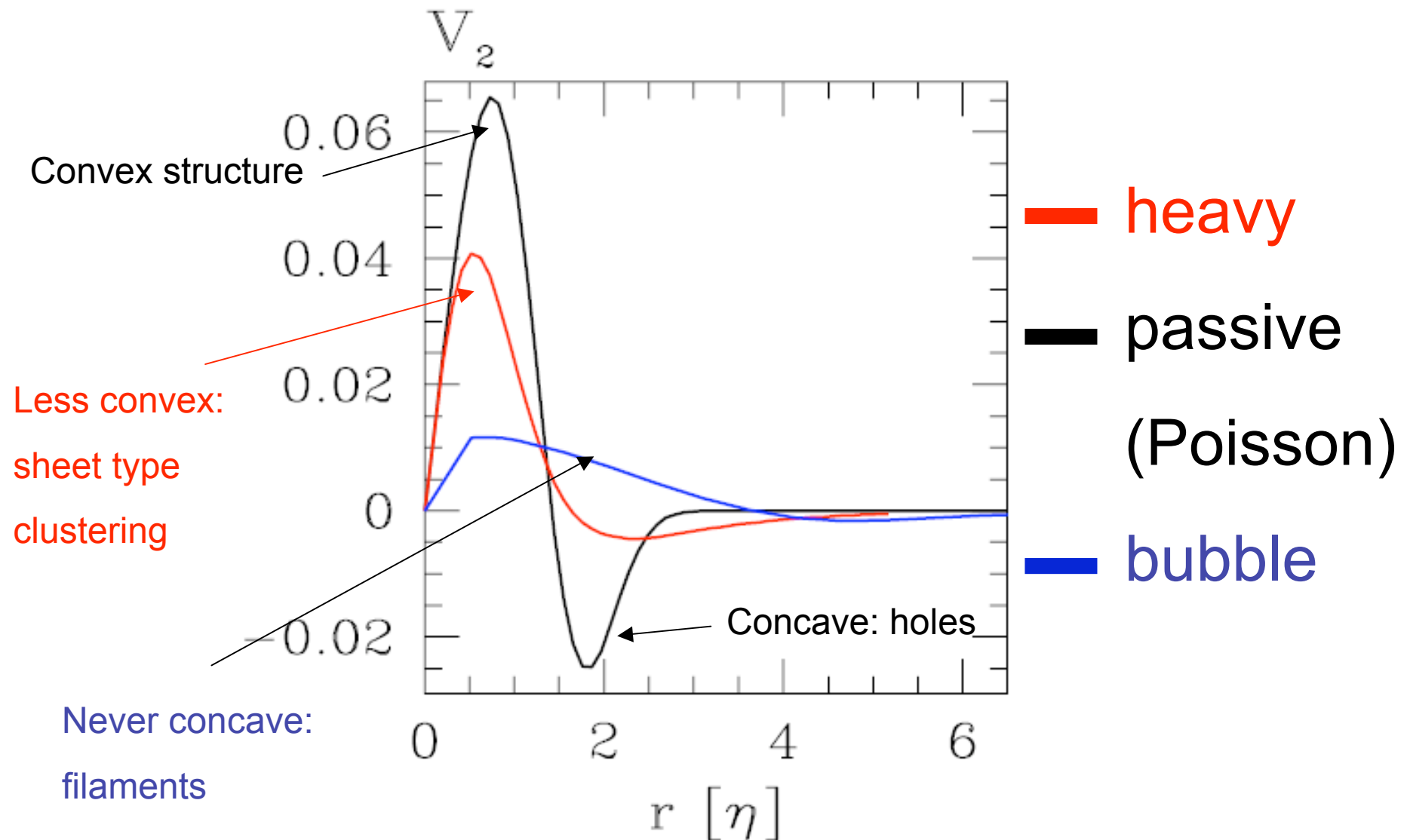
# Volume $V_0(r)$



# Surface $V_1(r)$



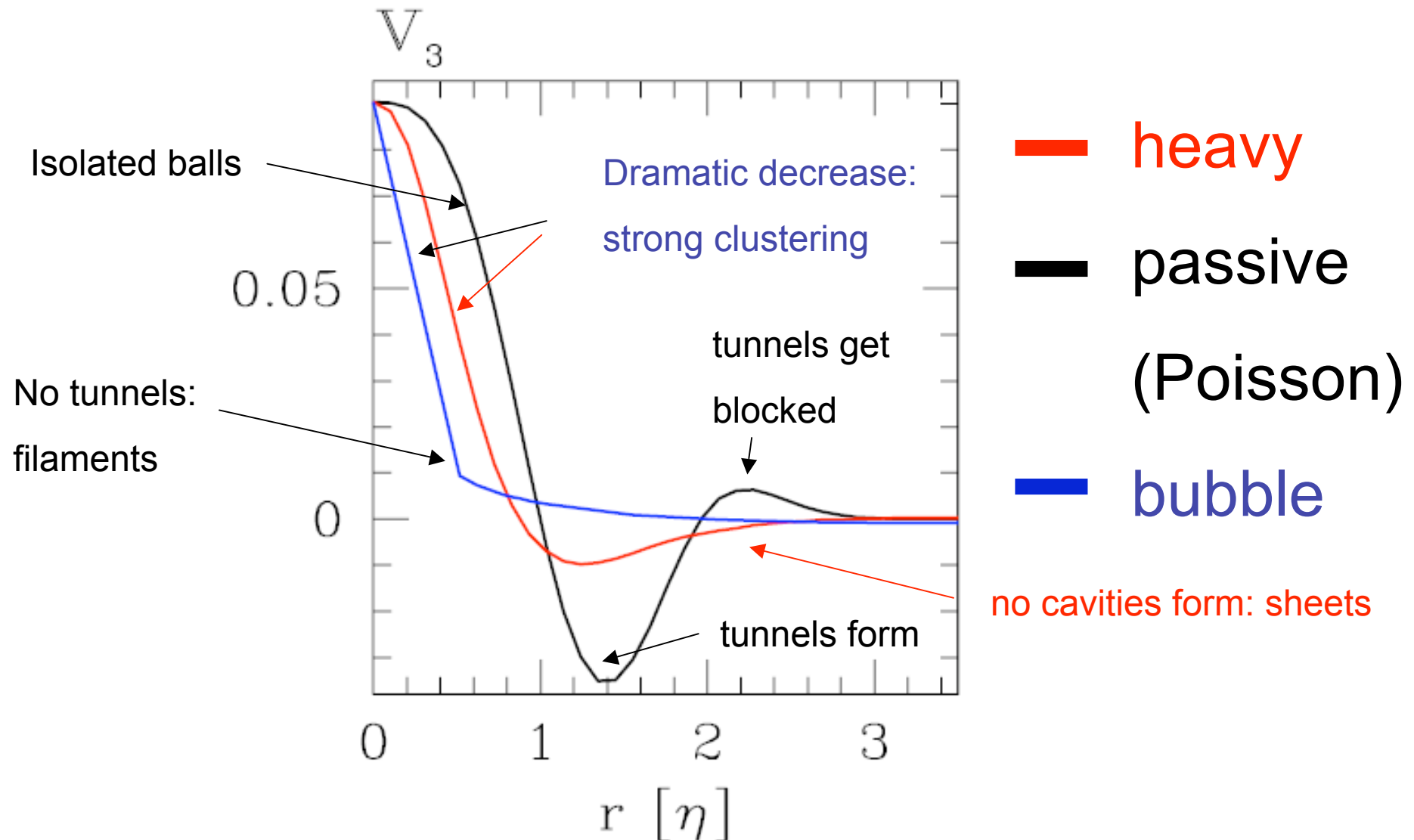
# Mean curvature $V_2(r)$





# Euler characteristics $V_3(r)$

$$V_3 = \chi = n. \text{ components} - n. \text{ tunnels} + n. \text{cavities}$$



## (ii) Concentration conditioned to local flow geometry

### Eigenvalues of the strain matrix

$$\hat{\sigma}_{ij} = \partial_i u_j$$

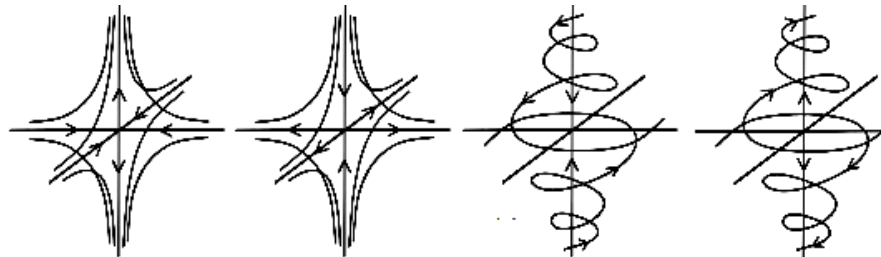
Discriminator:

$$\Delta = \left( \frac{\det[\hat{\sigma}]}{2} \right)^2 - \left( \frac{\text{Tr}[\hat{\sigma}^2]}{6} \right)^3$$

$\Delta \leq 0$  3  $\mathcal{R}$  eigen  
 $\Delta > 0$  1  $\mathcal{R}$  + 2  $\mathcal{C}$  eigen.

Hyperbolic

non-hyperbolic

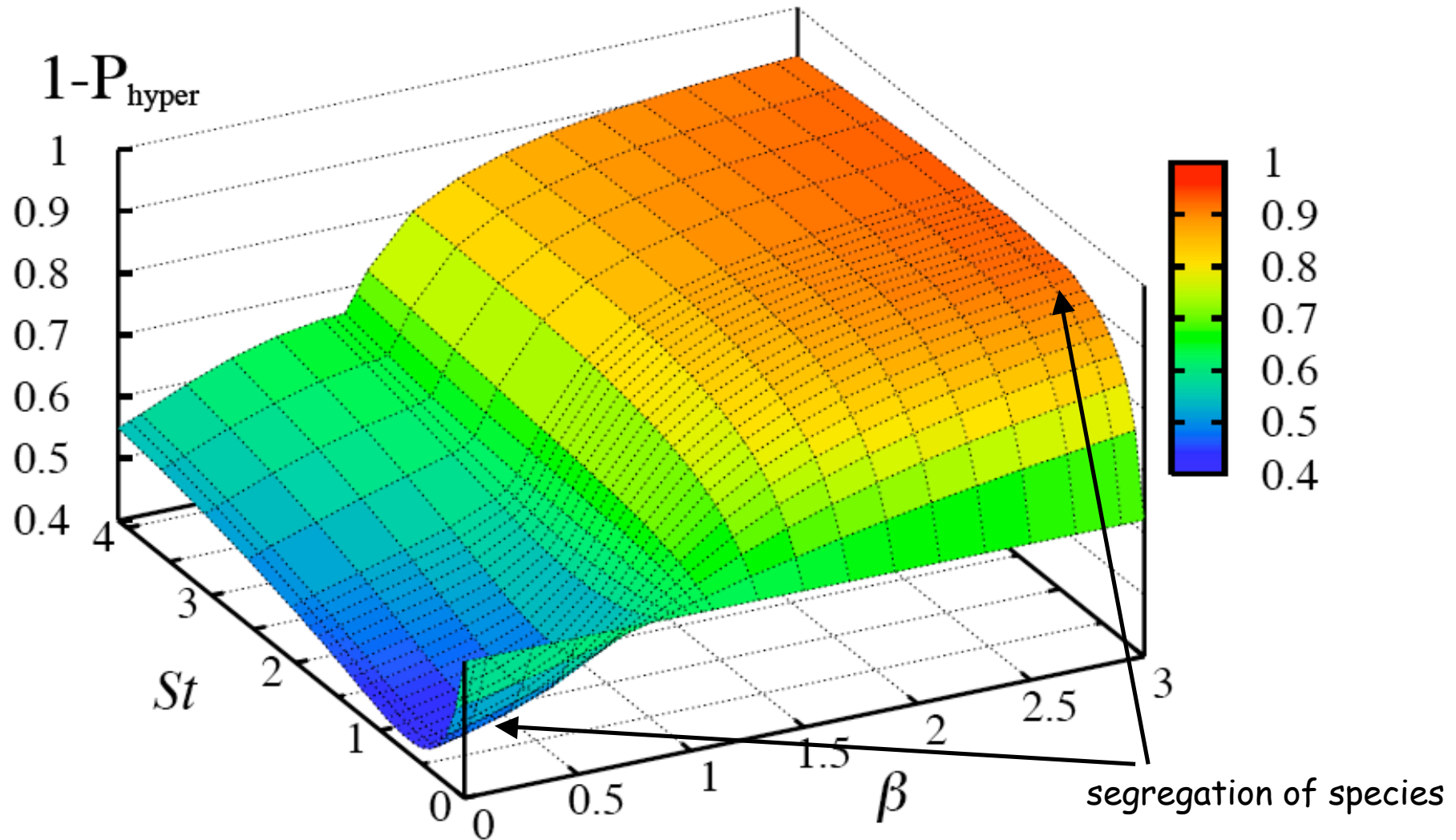


(see Chong, Perry, Cantwell PF 1990)

$$P_{hyper} = \langle N(\Delta < 0) / N_{tot} \rangle$$

# Conditioned concentration: $1-P_{\text{hyper}}$

Probability to be in non-hyperbolic regions



# Conclusions

## Summary:

Small-scale clustering (dissipative range) quantified by:

$D_{KY}$ ,  $D_2$  and Minkowski functionals.

Concentration conditioned to local flow geometry

( $\rightarrow$  segregation) quantified by:  $P_{hyper}$

## Ongoing and future work:

- Quantifying clustering at larger scales (inertial-range).
- Investigate spatial statistics of dilute **bi-disperse** solutions.
- Trapping/ejection signature in temporal velocity statistics
- Trapping/ejection signature in acceleration statistics.
- Modeling needed.