



# Numerical Simulation of Turbulence-microphysics Interactions

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# Outline

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- **Background**
- **Mathematics model**
- **Direct numerical simulation(DNS)**
- **Preliminary results**
- **Future work**



# Background

- **What**

Water (vapor and liquid)

Turbulence

Interactions

- **How**

Direct Numerical Simulation

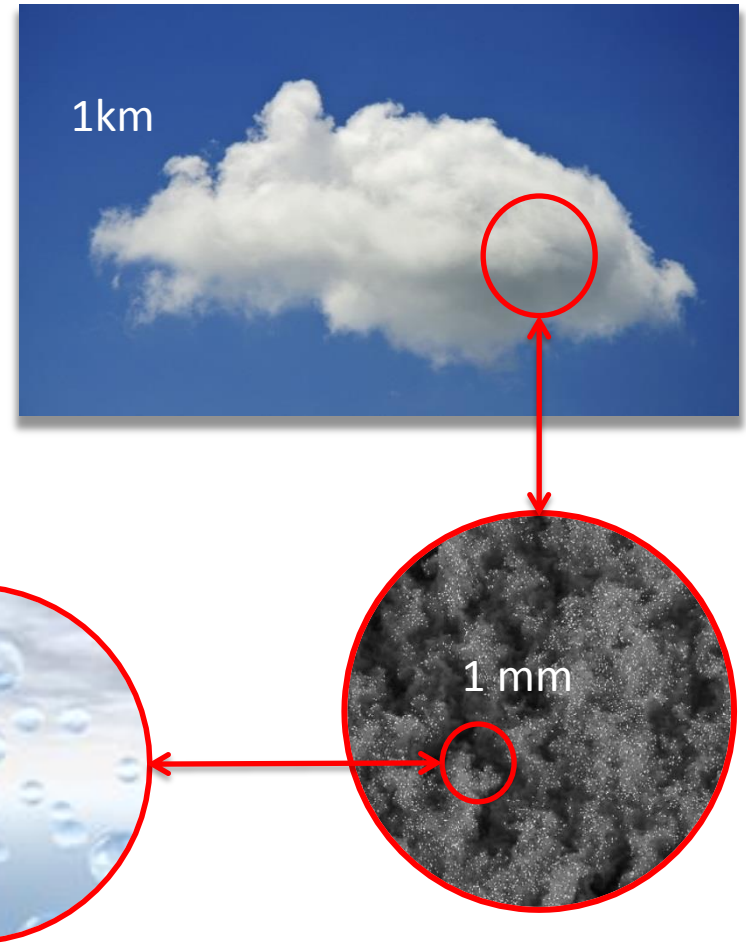
Particle model

- **Why**

Multi-scale

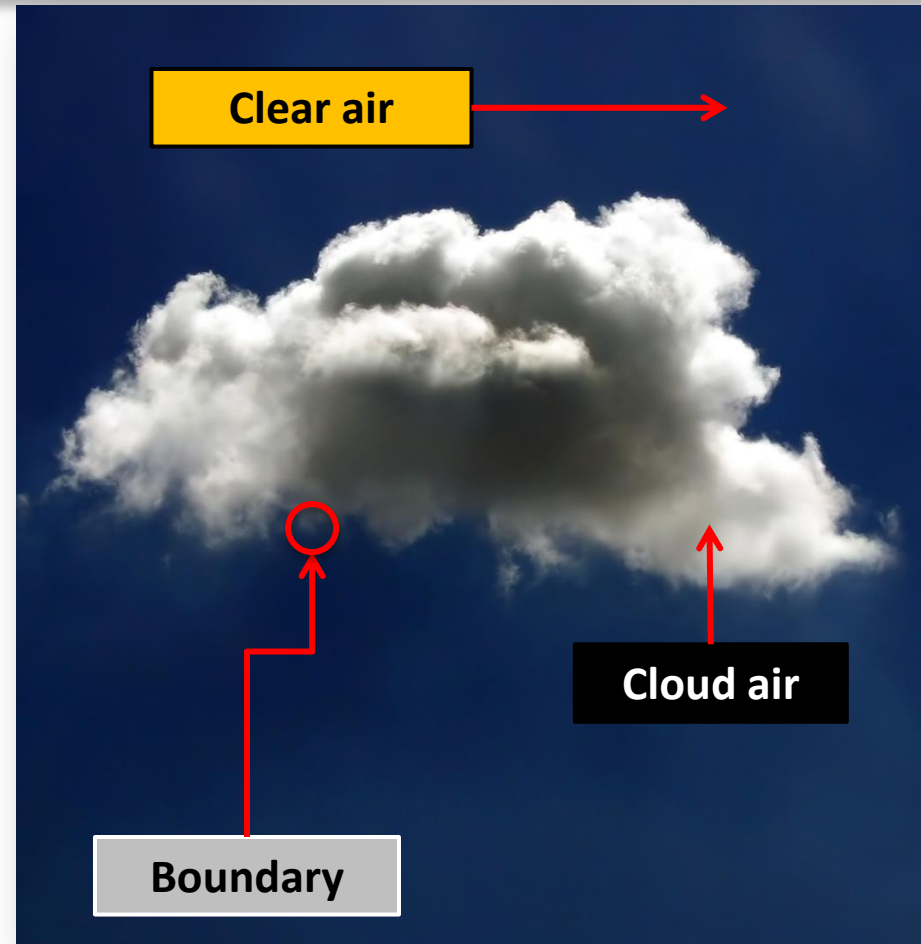
Turbulence

Particle tracking



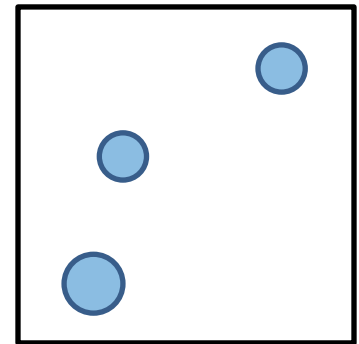
# Background

- **Clear air:**
  - Less droplets
  - Low humidity
- **Cloud air:**
  - More droplets
  - High humidity
  - Collision
- **Boundary:**
  - Entrainment
  - Mixing
  - Measurement



# Particle Model

Particles length scale:

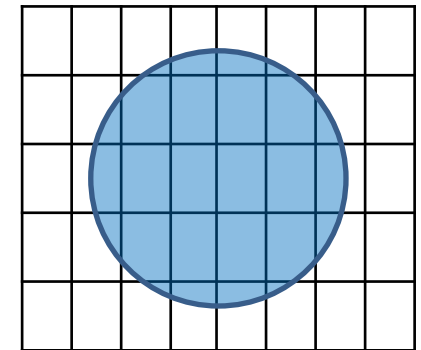


Cloud Droplets

Turbulence:

Dissipation scale  $> 1\text{mm}$  ( $10^3\text{um}$ )

Much **larger** than droplets and  
**comparable** to raindrops



Raindrops



# Particle Model

## Simulation difficulty



**Motion:** inertial and sedimentation

**Condensation:** condensate or evaporate

**Collision:** detection and handling

**Coalescence:** merge or break up



# Mathematics Model

## 1. Important variables

- Velocity field  $\vec{u}(X, t)$ : velocity of air (m/s)
- Vapor mixing ratio  $q(X, t)$ : ratio of vapor in dry air (g/kg)
- Temperature field  $T(X, t)$ : temperature of air (K)
- Saturated vapor mixing ratio  $q_s(X, t)$ : equilibrium state



# Mathematics Model

## 2.1 Vector field

$$\frac{\partial \mathbf{u}}{\partial t} + (\mathbf{u} \cdot \nabla) \mathbf{u} = -\frac{1}{\rho_0} \nabla p + \mu \Delta \mathbf{u} + \mathbf{f} \quad \text{Navier stokes equation}$$
$$\nabla \cdot \mathbf{u} = 0$$

## 2.2 Scalar field

$$\frac{\partial q}{\partial t} + \mathbf{u} \cdot \nabla q = -C_d + \kappa \Delta q \quad \text{Vapor mixing ratio}$$

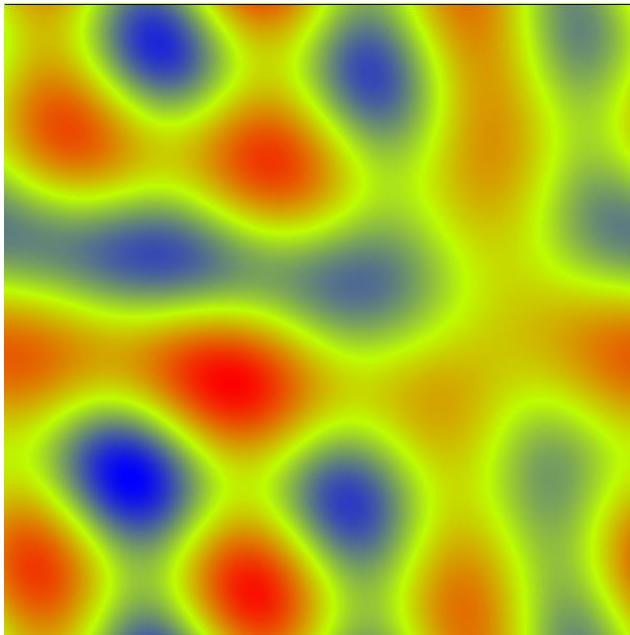
$$\frac{\partial T}{\partial t} + \mathbf{u} \cdot \nabla T = \frac{L}{c_p} C_d + \mu_T \Delta T \quad \text{Temperature}$$



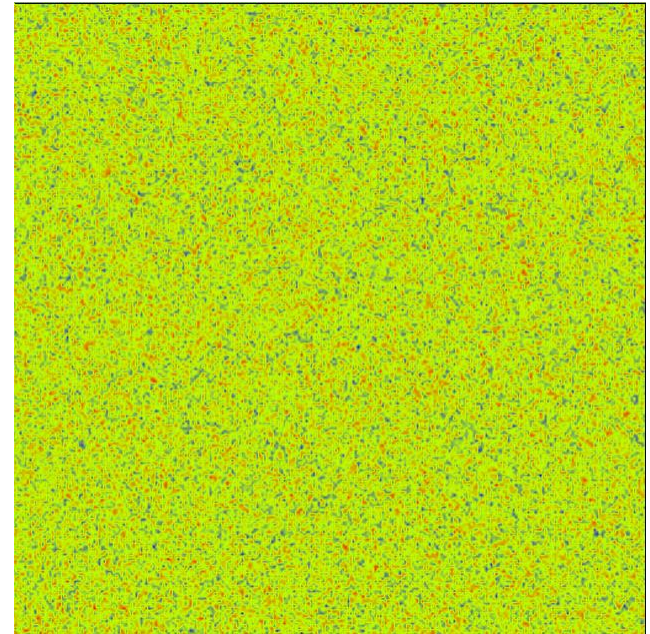


# Mathematics Model

Magnitude of vorticity field



Vapor field



# Mathematics Model

## 3. Droplets model

$$S(X, t) = \frac{q_v(X, t)}{q_{v,s}} - 1$$

$$\frac{dR_i(t)}{dt} = A_3 \frac{S(x, t)}{R_i(t)}$$

Condensation and evaporation

$$\frac{dX(t)}{dt} = V(t)$$

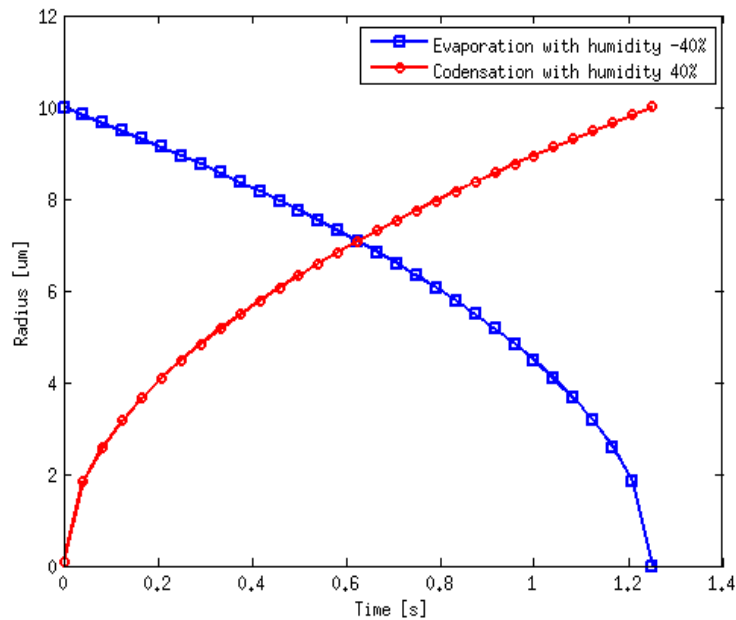
$$\frac{dV(t)}{dt} = \frac{1}{\tau_p} [u(X, t) - V(t)] + g$$

Droplets motion

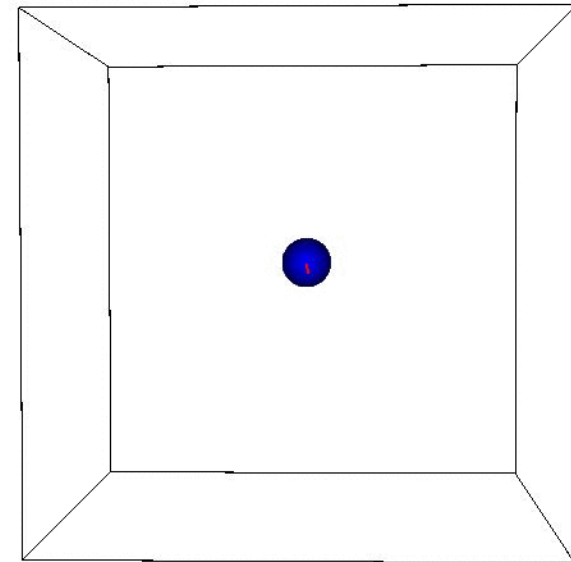


# Mathematics Model

Radius in condensation and evaporation process

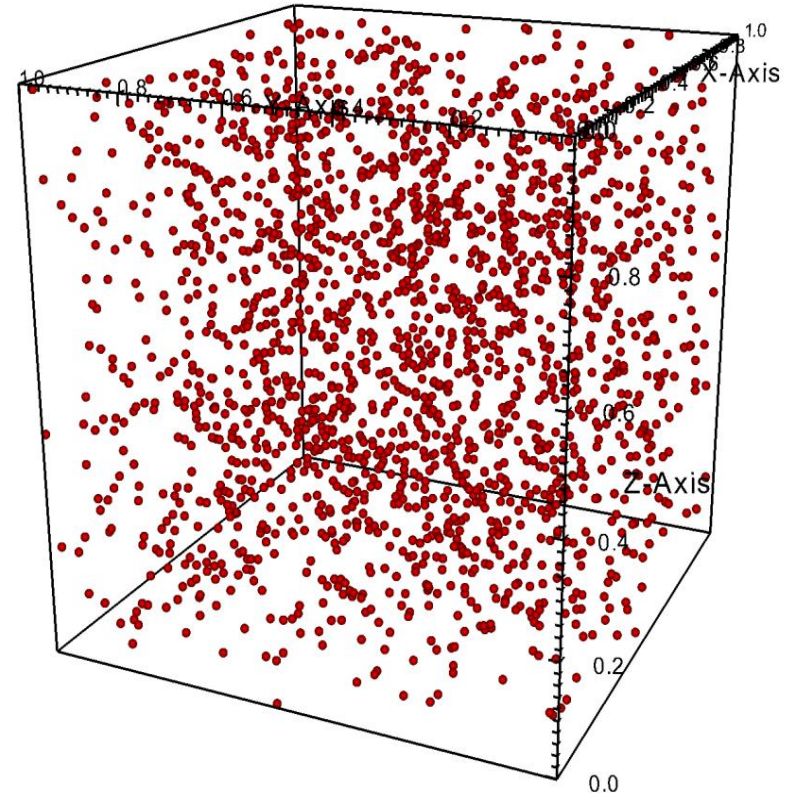


Motion of droplets



# Numerical Simulation

- **Domain:**  
 $1m \times 1m \times 1m$   
Periodic boundary box
- **Droplets:**  
Radius  $10\mu m$   
Density  $10/cc$   
Number  $10^7$



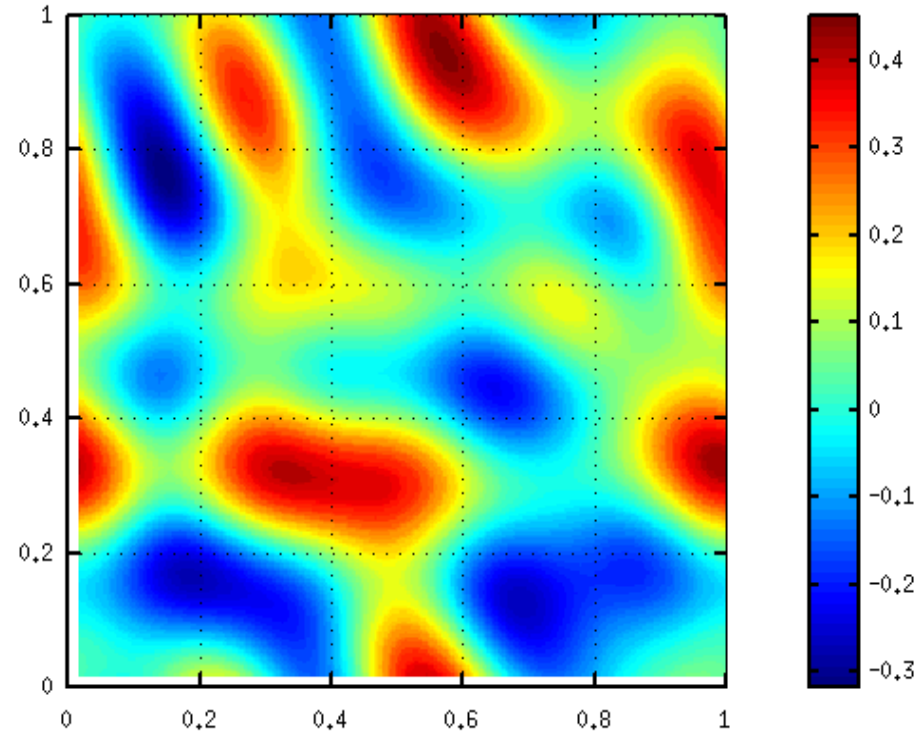
# Numerical Simulation

- Isotropic initialization with filter in Fourier space

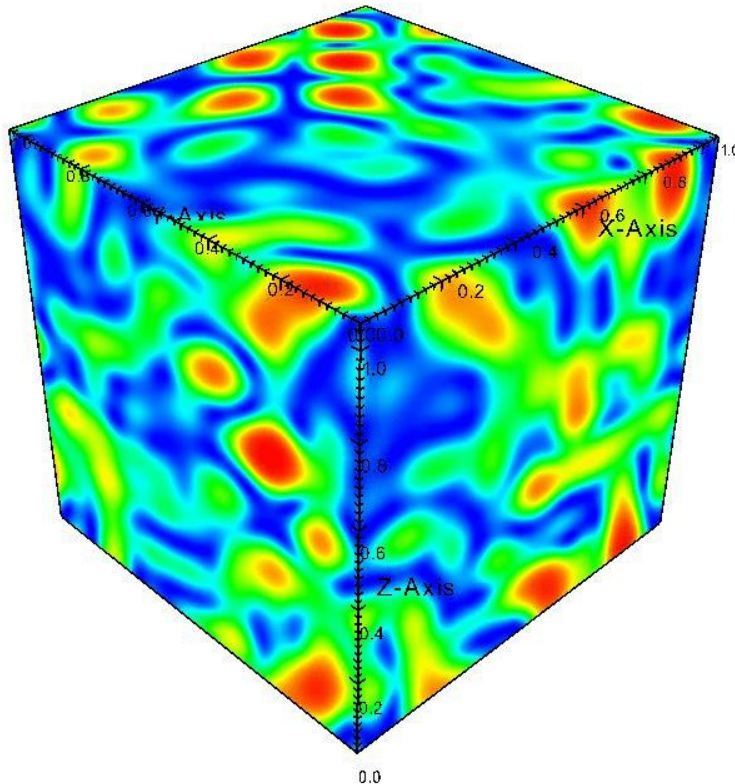
$$\hat{u}(k) = k^2 \exp\left\{-\frac{k^2}{k_0^2} [\cos(2\pi\varphi) + i\sin(2\pi\varphi)]\right\}$$

- Scale the velocity to control the intensity
- Use Taylor microscale Reynolds number

$$Re_\lambda = U_{rms}\lambda/\nu$$



# Numerical Simulation



- Energy input only in large wave length



- Energy cascades to small length automatically



- Energy dissipated in Kolmogorov length scale

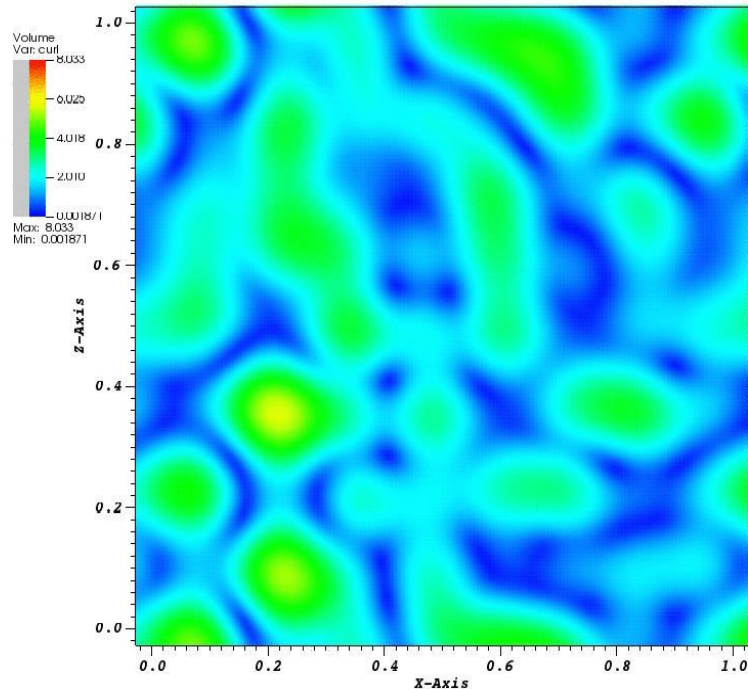




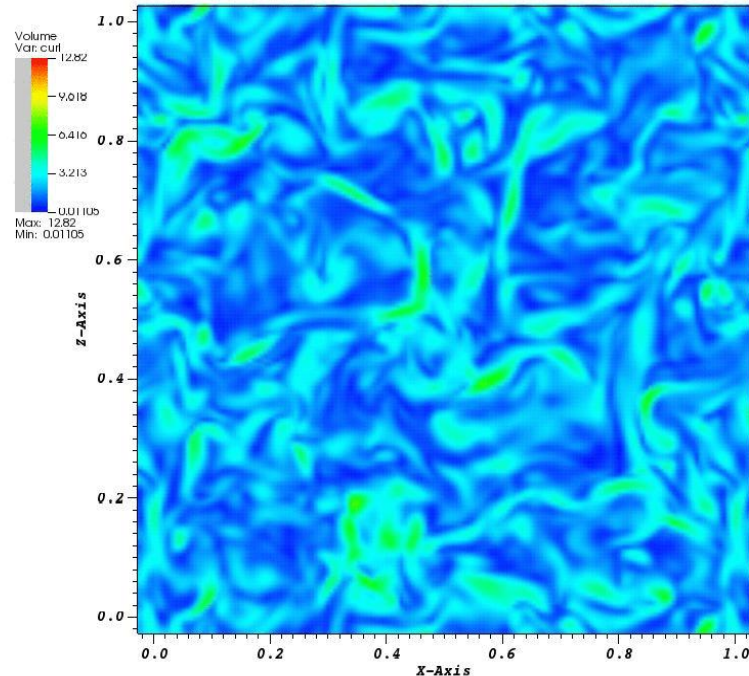
# Numerical Simulation

Enstrophy ( $|\nabla \times \mathbf{U}|^2$ ) in x-z cross sectional plane

Enstrophy at 0s



Enstrophy at 80s



# Numerical Simulation

- Turbulence properties**

Group	$u_{rms}(\text{m/s})$	$\varepsilon(\text{m}^2\text{s}^{-3})$	$\eta(\text{m})$	$Re_\lambda$
Flow A	0.01074	3.1e-5	0.003	20
Flow B	0.02109	1.7e-4	0.002	34
Flow C	0.03422	4.0e-4	0.001	58

- $\varepsilon = 2\nu \sum_{i=1}^3 \left( \frac{\partial u_i}{\partial x_j} + \frac{\partial u_j}{\partial x_i} \right)$        $\lambda = \sqrt{15\nu u_{rms}^2 / \varepsilon}$        $Re_\lambda = U_{rms}\lambda/\nu$





# Parallel computing

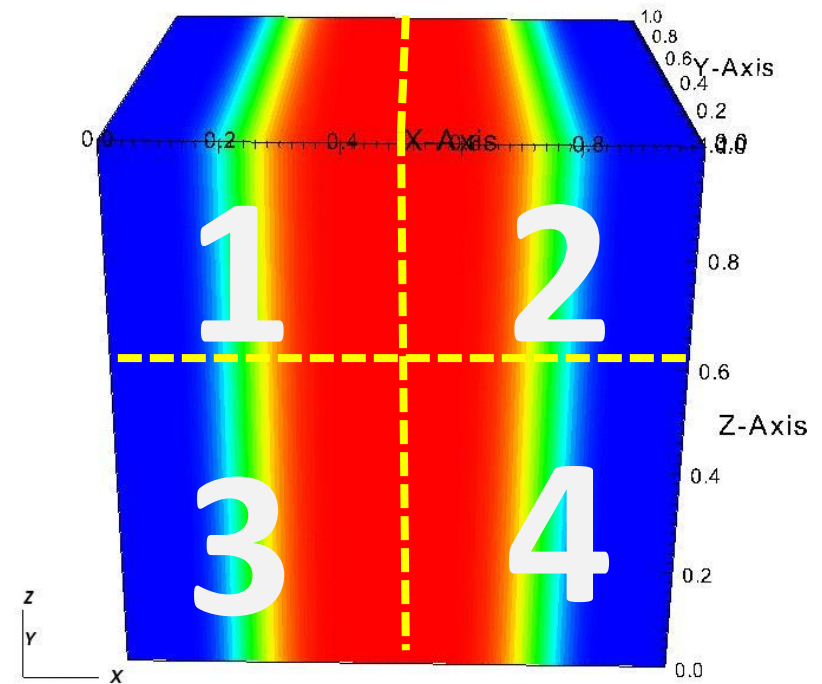
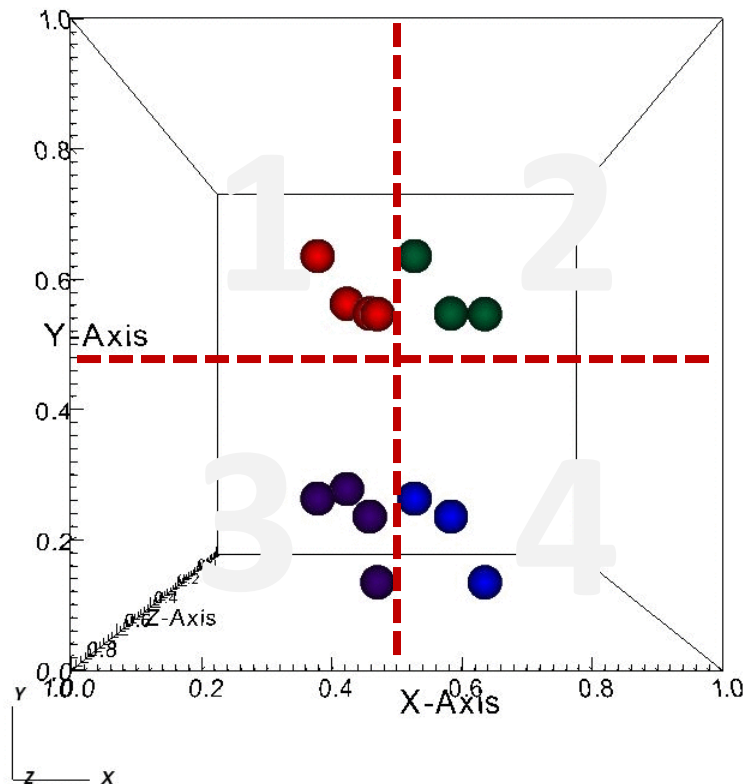
- MPI
- Parallel communication of field (**FronTier**)
- Parallel communication of particles (**New**)
- Parallel statistics: deviation, PDF (**New**)
- Basic idea:

Add buffers at boundary

Exchange buffers direction by direction (x, y, z)

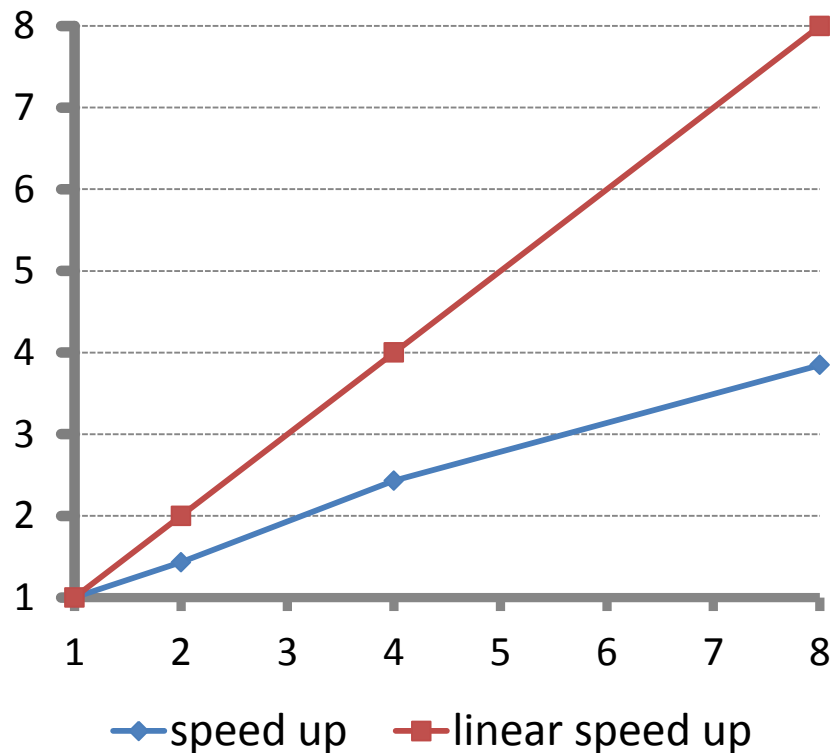


# Parallel computing



# Parallel computing

Strong scaling for 10s simulation



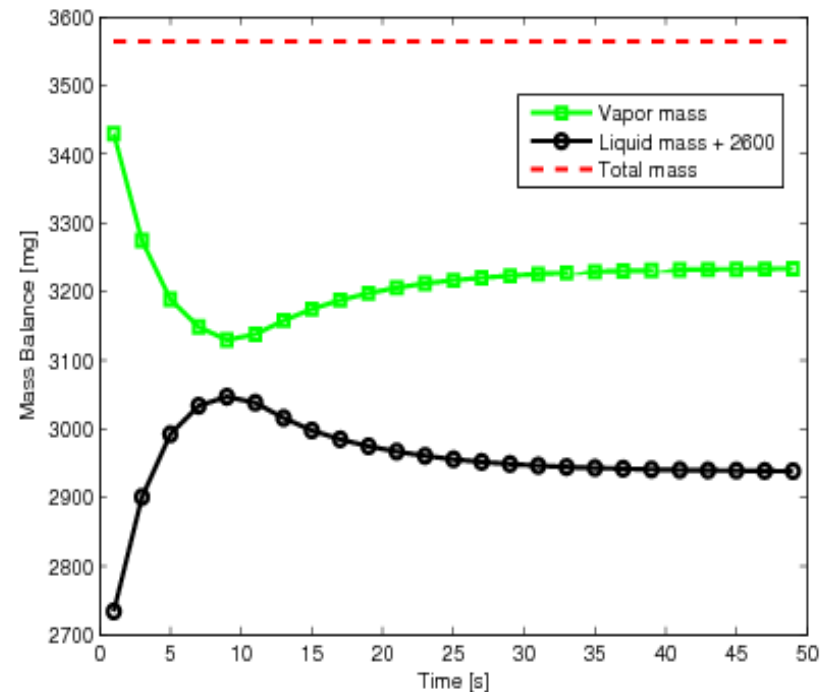
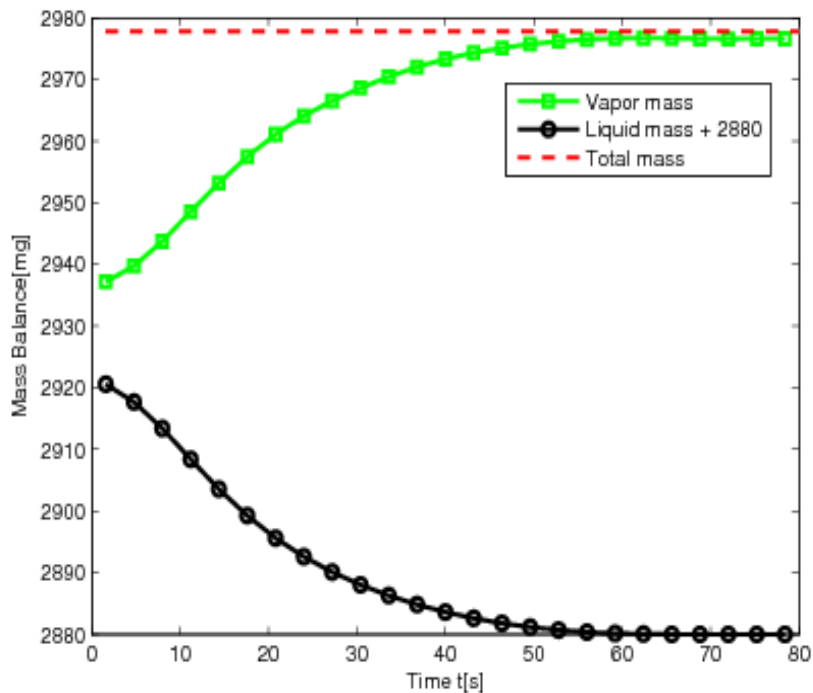
No.	Time	Speed up
1	1h 22m 19s	1
2	57m 33s	1.4
4	33m 52s	2.4
8	21m 24s	3.8

Speed up:  $t_1/t_N$



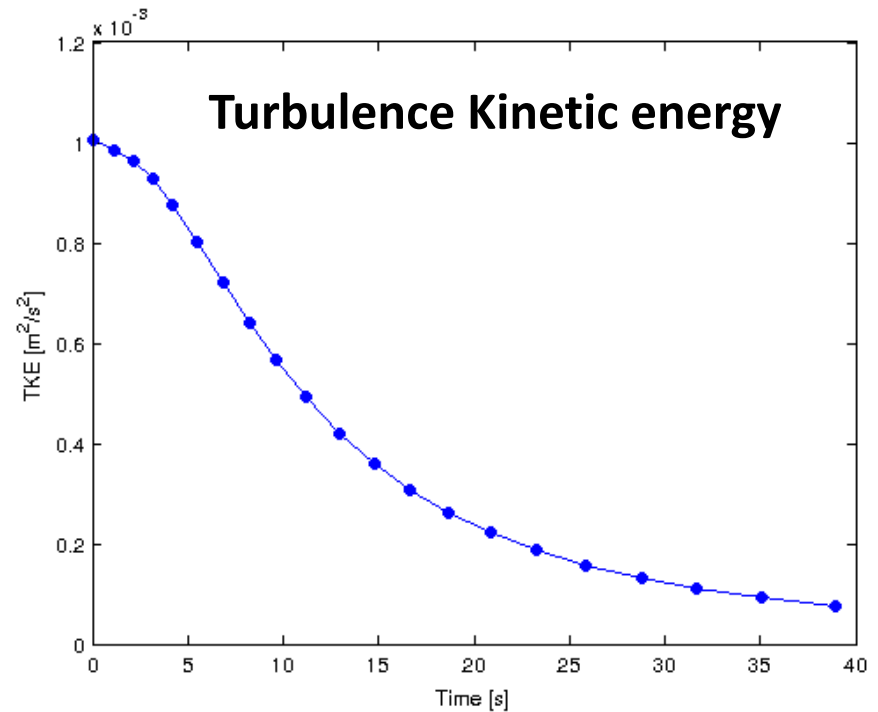
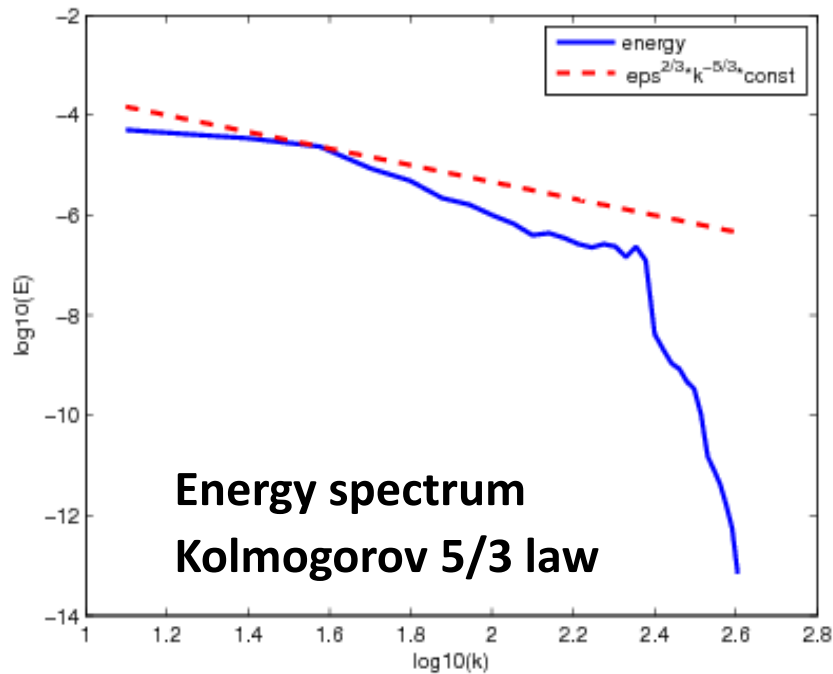
# Verification and Validation

## Mass conservation



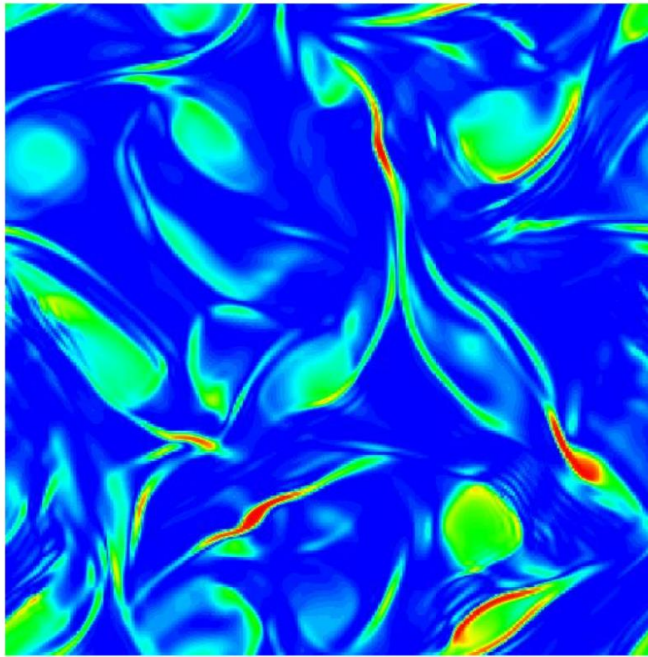
# Verification and Validation

## Turbulence properties

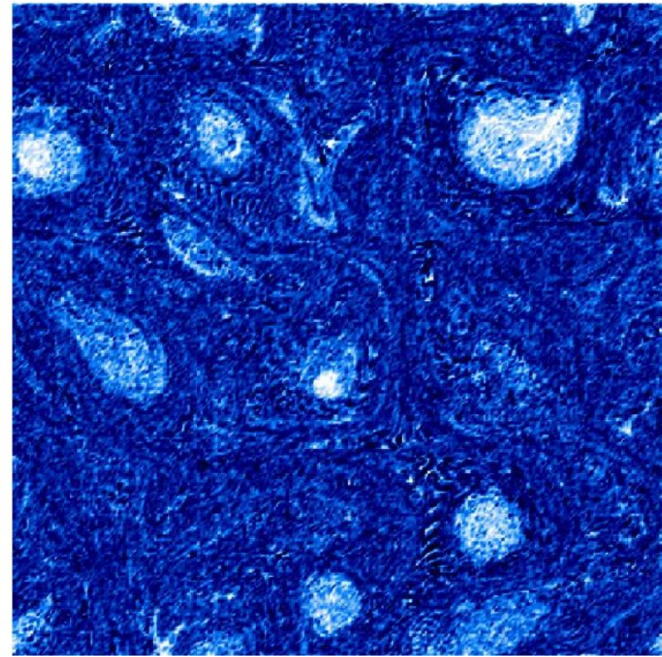


# Cloud Microphysics

## Preferential concentration



Magnitude of vortices

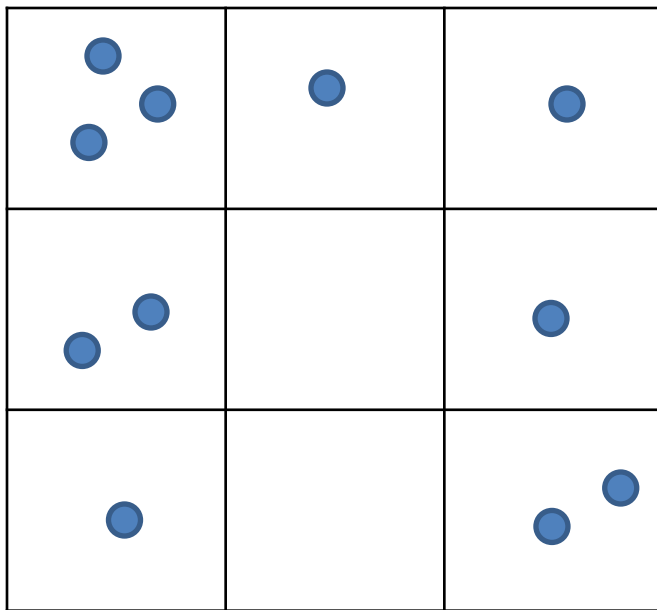


Number density of particles



# Cloud Microphysics

## Number density



Particles in grid cell

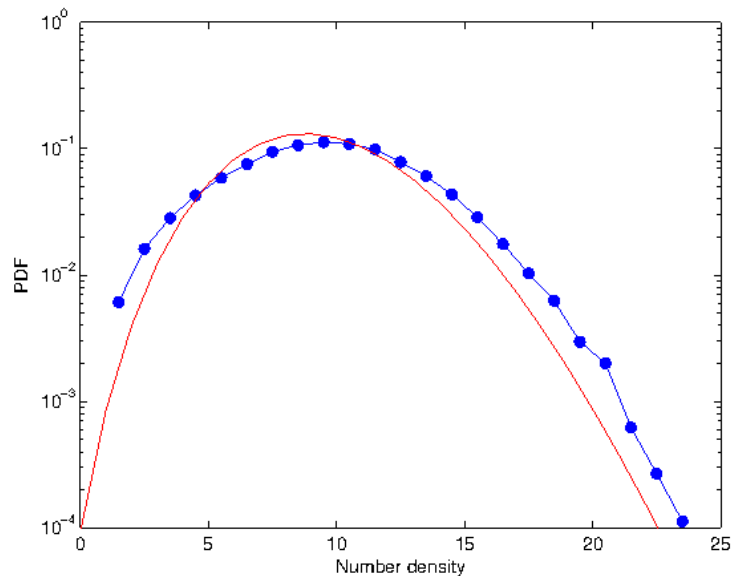
3	1	1
2	0	1
1	0	2

Number density of particles

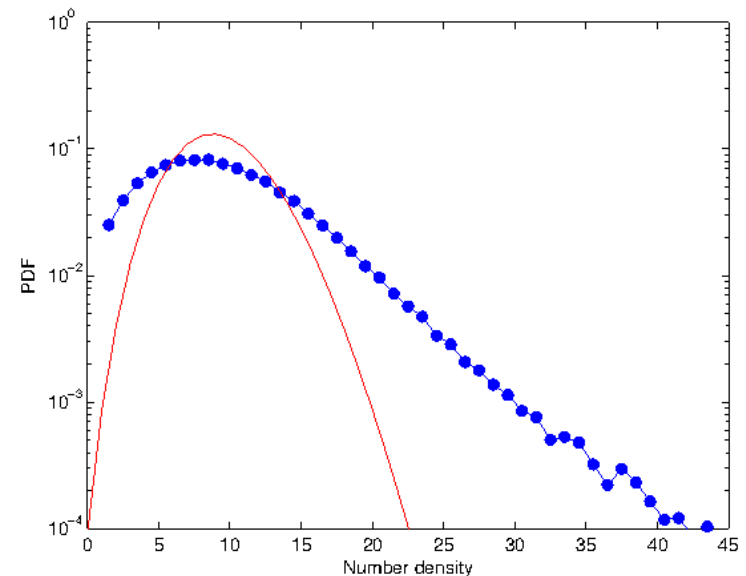


# Cloud Microphysics

## Preferential concentration



PDF of number density  
at  $t = 0s$



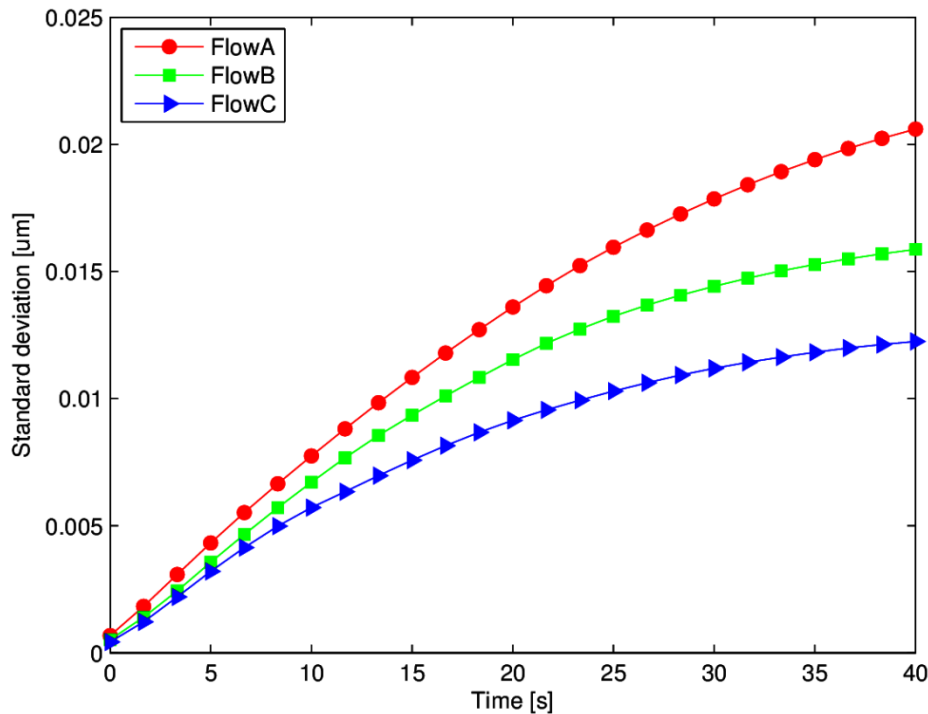
PDF of number density  
at  $t = 40s$





# Cloud Microphysics

## Condensational growth



Standard deviation of radius distribution with three different turbulence configuration.

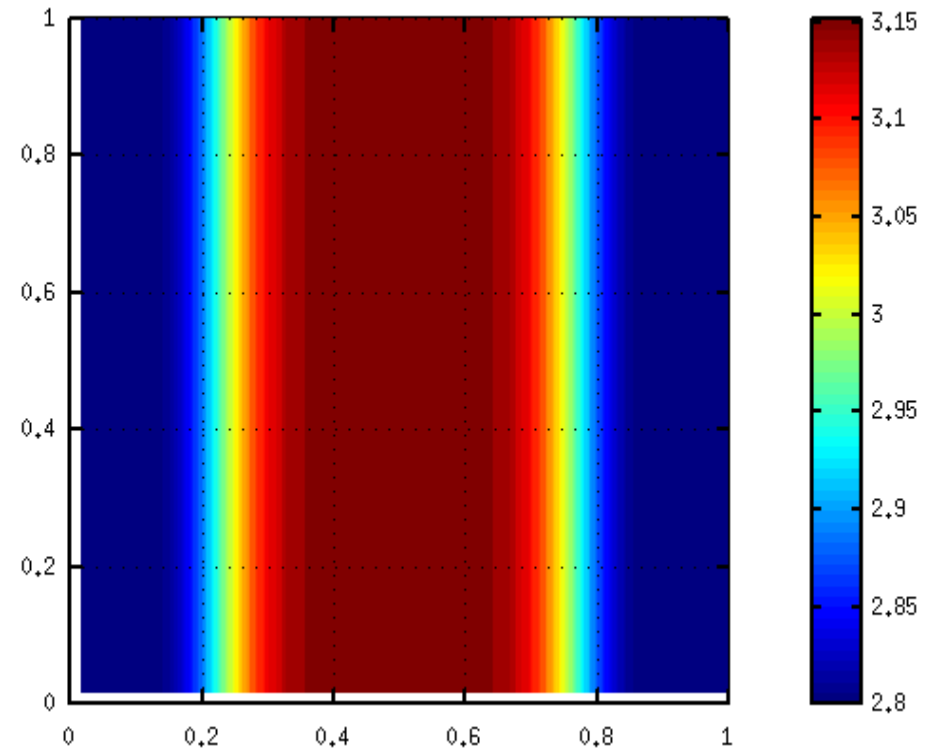
**Intensity:**

Flow A < Flow B < Flow C



# Entrainment and Mixing

- Vapor mixing ratio is set continuously from dry to moist
- Define some variables for measurement

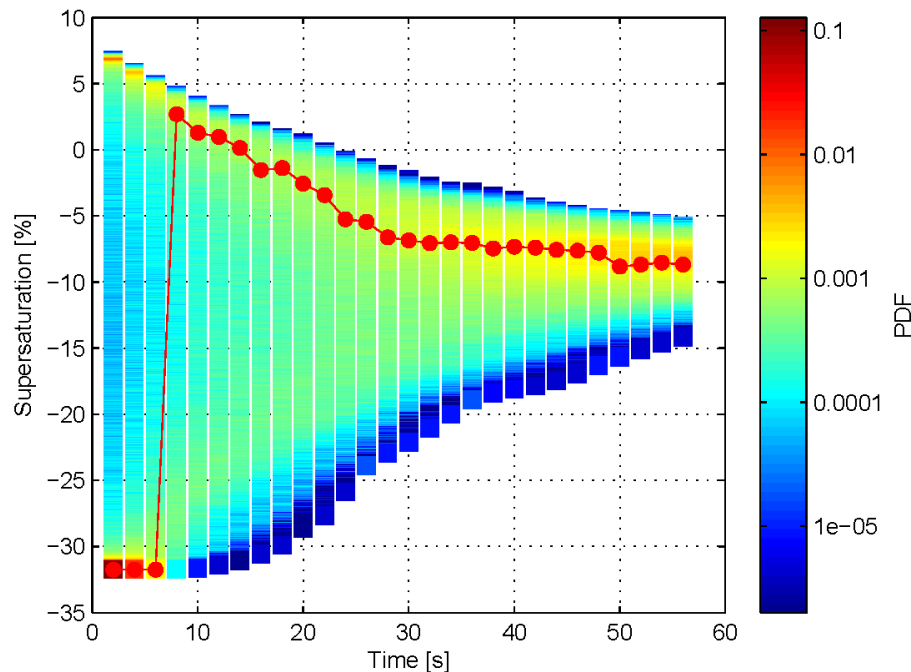


Vapor mixing ratio in x-z plane

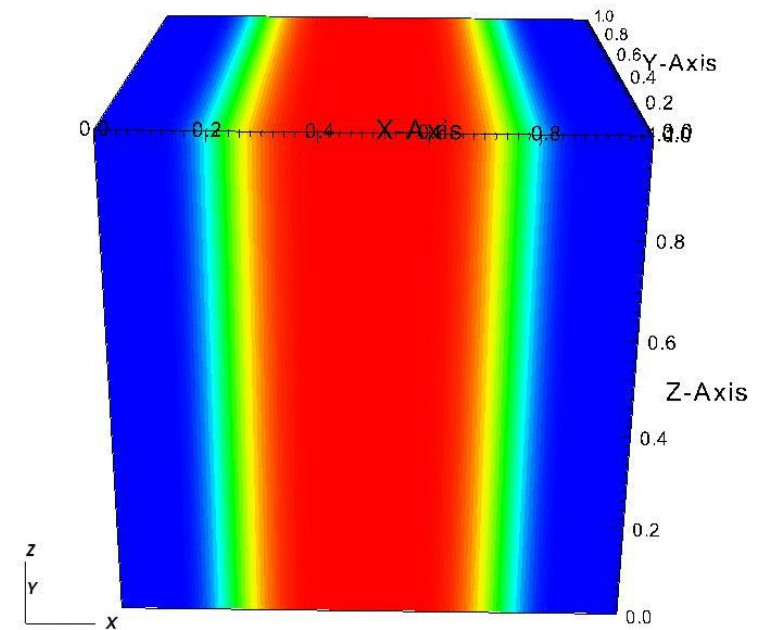


# Entrainment and Mixing

- Distribution of the humidity

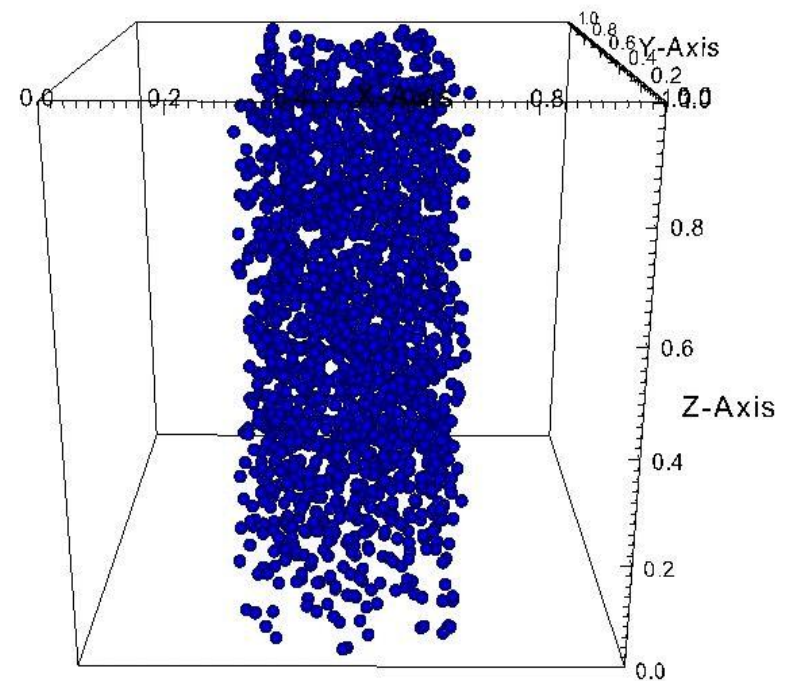
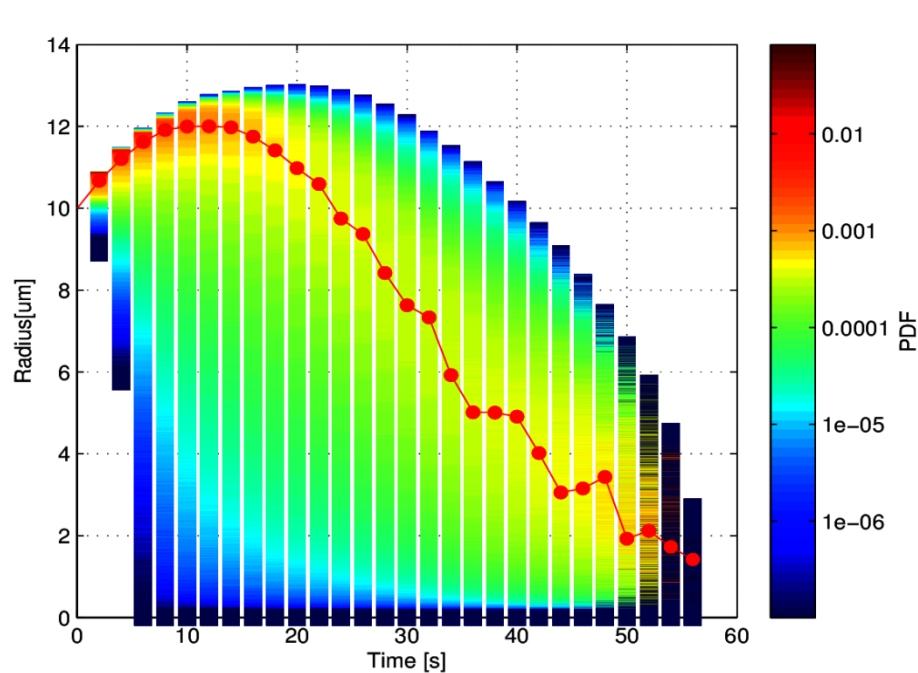


- The vapor mixing ratio field



# Entrainment and Mixing

Radius distribution



# Future Work

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- Current resolution is  $128^3$ , improve resolution
- CUDA-Aware MPI to accelerate particles
- Entrainment from the top and bottom
- Collision and coalescence
- Thank you for coming

