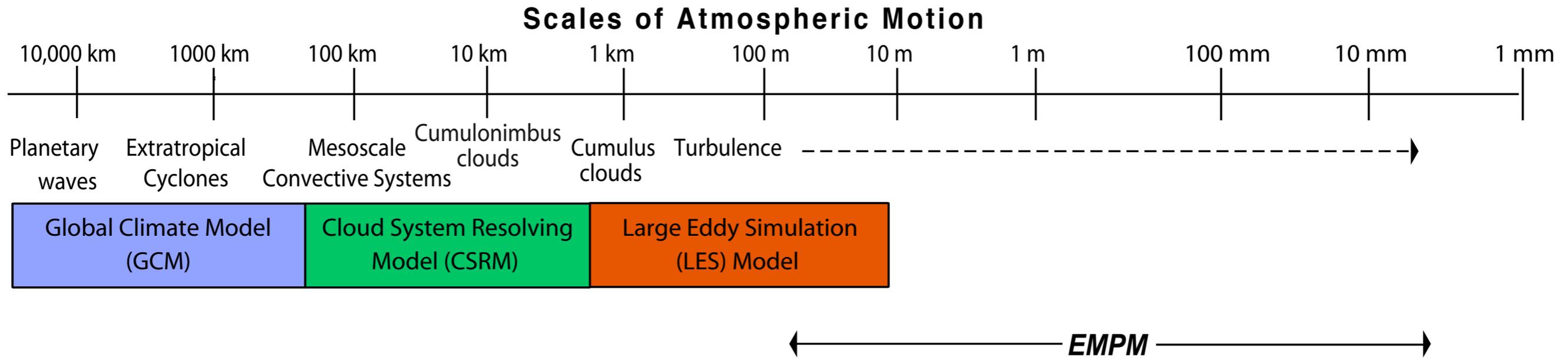


# **Multi-Scale Modeling of Turbulence and Microphysics in Clouds**

Steven K. Krueger  
University of Utah

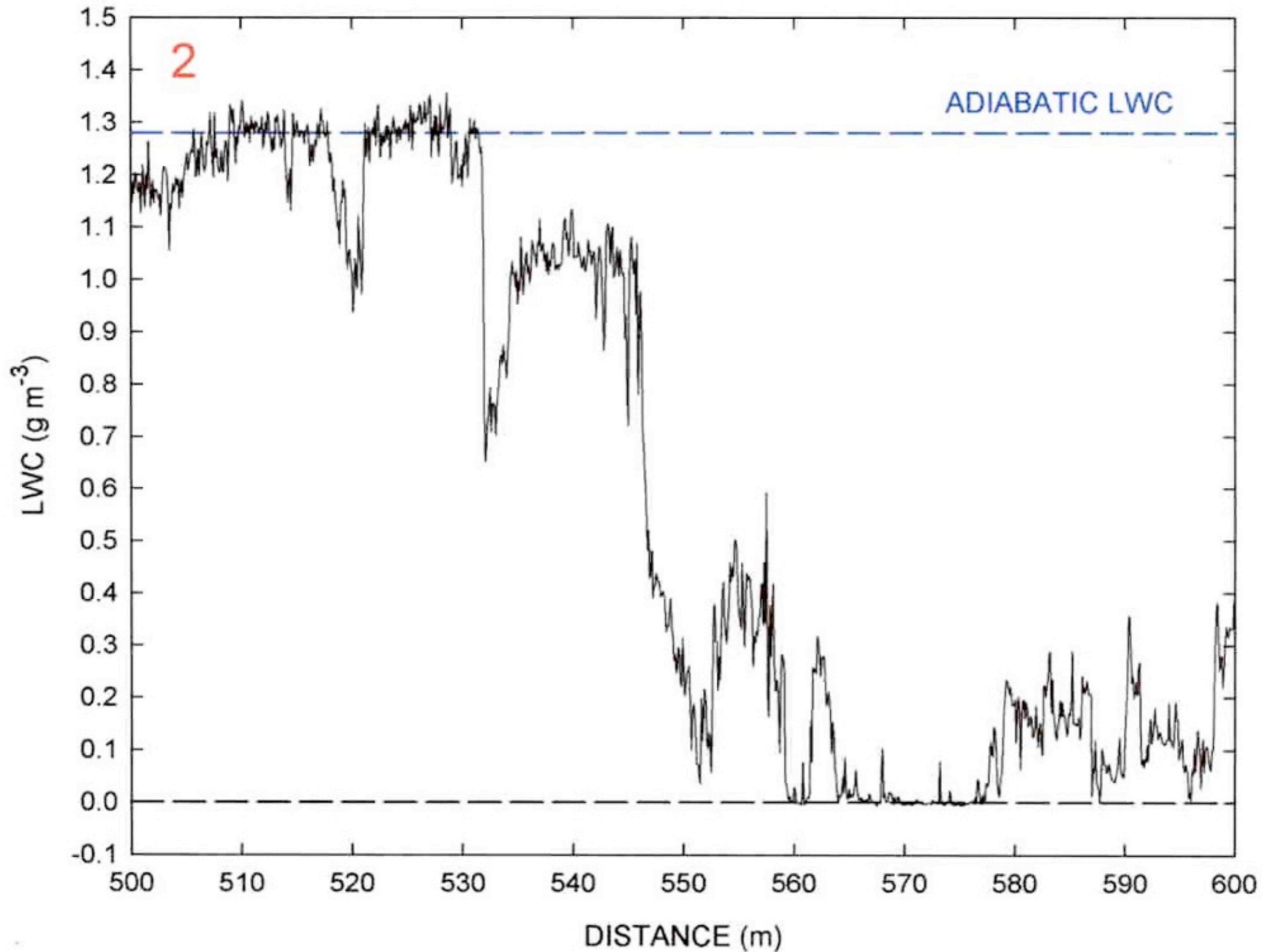


The smallest scale of turbulence is the Kolmogorov scale:

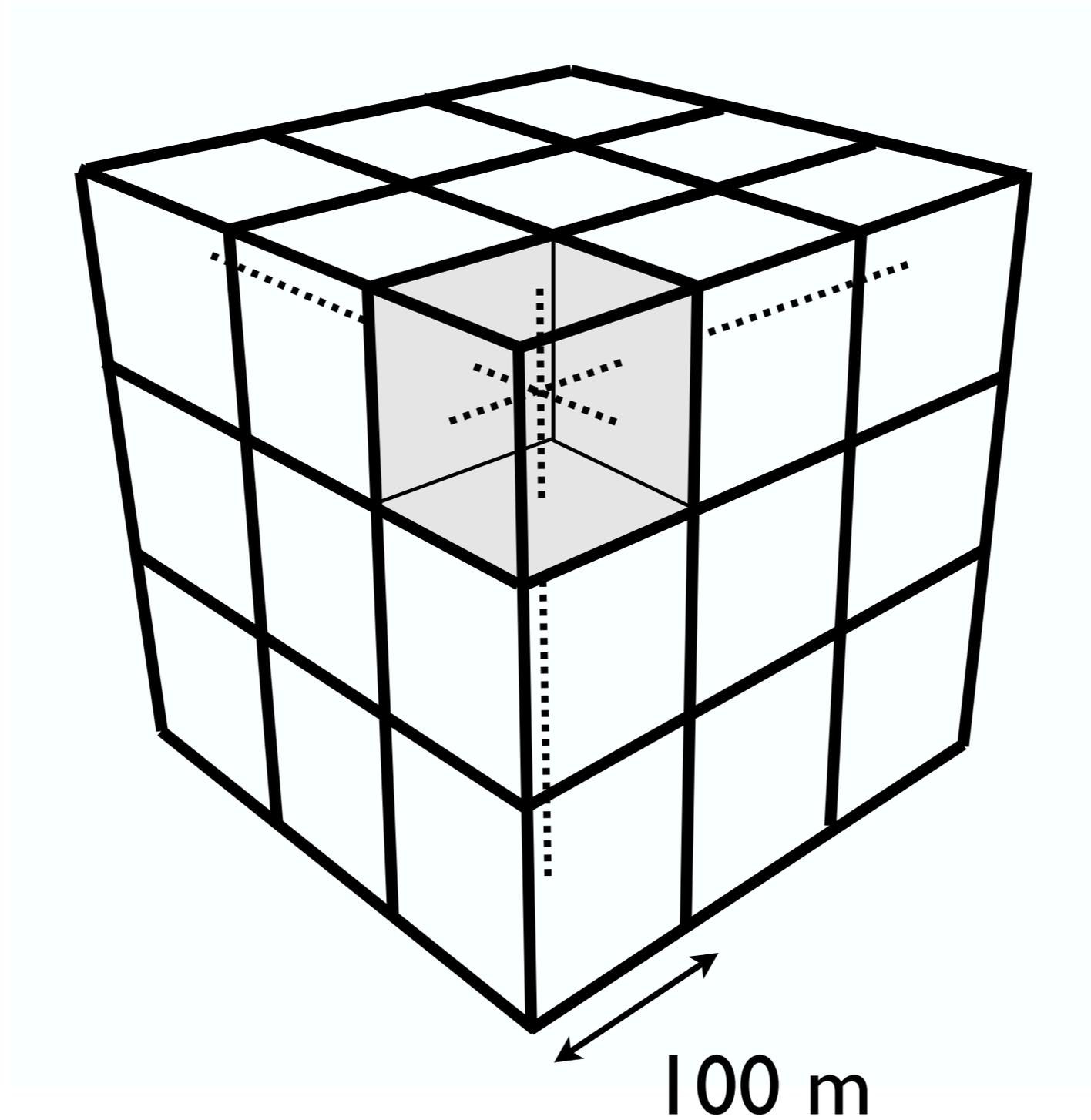
$$\eta \equiv (\nu^3 / \epsilon)^{1/4}$$

For  $\epsilon = 10^{-2} \text{ m}^2 \text{ s}^{-3}$  and  $\nu = 1.5 \times 10^{-5} \text{ m}^2 \text{ s}^{-1}$ ,  $\eta = 0.7 \text{ mm}$ .

# Aircraft Measurements of Liquid Water Content



# Large-Eddy Simulation (LES) model



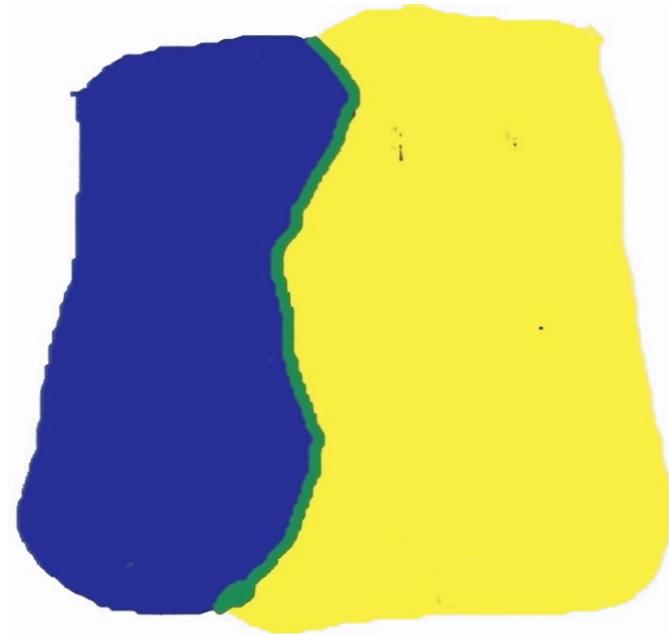
# LES Limitations

- The premise of LES is that only the large eddies need to be resolved.
- Why resolve any finer scales? Why resolve the finest scales?
- LES is appropriate if the important small-scale processes can be parameterized.
- Many cloud processes are subgrid-scale, yet can't (yet) be adequately parameterized.

# Subgrid-scale Cloud Processes

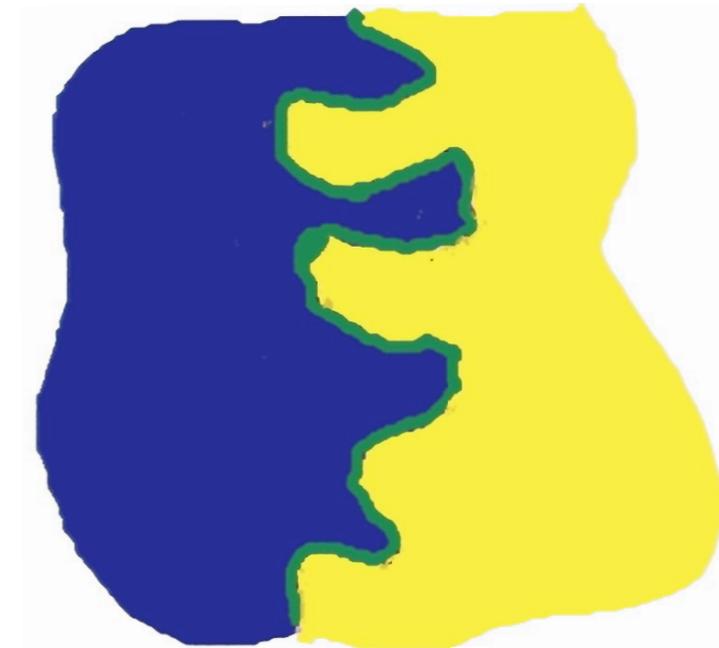
- SGS finite-rate mixing of clear and cloudy air slows evaporative cooling and affects buoyancy and cloud dynamics.
- SGS variability of water vapor due to entrainment and mixing broadens droplet size distribution (DSD) and increases droplet collision rates.
- SGS turbulence increases droplet collision rates.

# Turbulent Mixing: Process by which a fluid with two initially segregated scalar properties mix at the molecular level



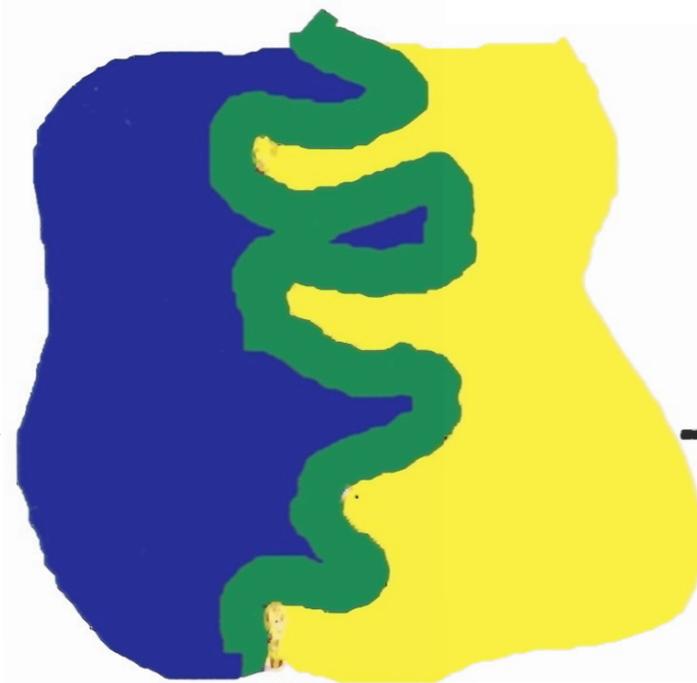
$$t_D = L^2 / D_m$$

Stirring

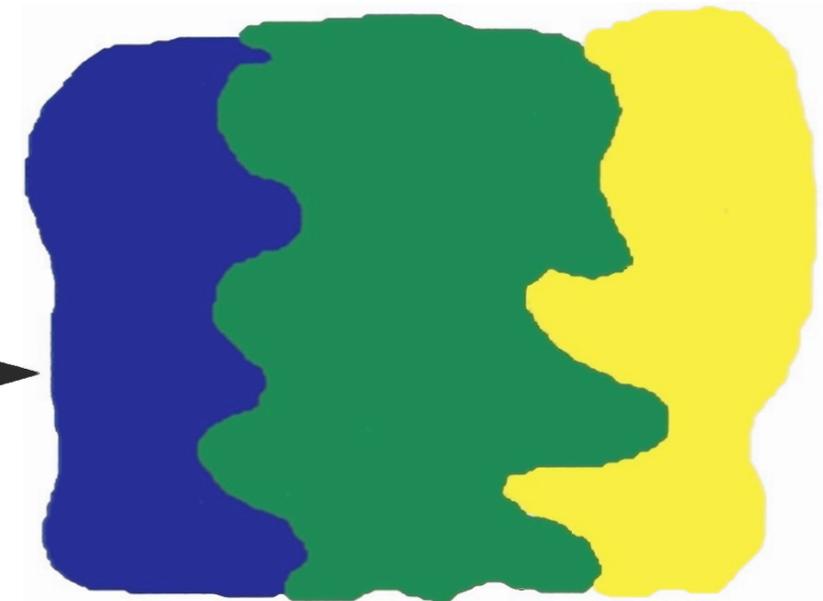


$$t_T = L / U$$

Stirring +  
Diffusion



Final Mixed  
State





LES of passive scalar in a convective boundary layer  
(grid size = 20 m)

# Mixing Time Scale

$$\tau = \left( \frac{d^2}{\epsilon} \right)^{1/3},$$

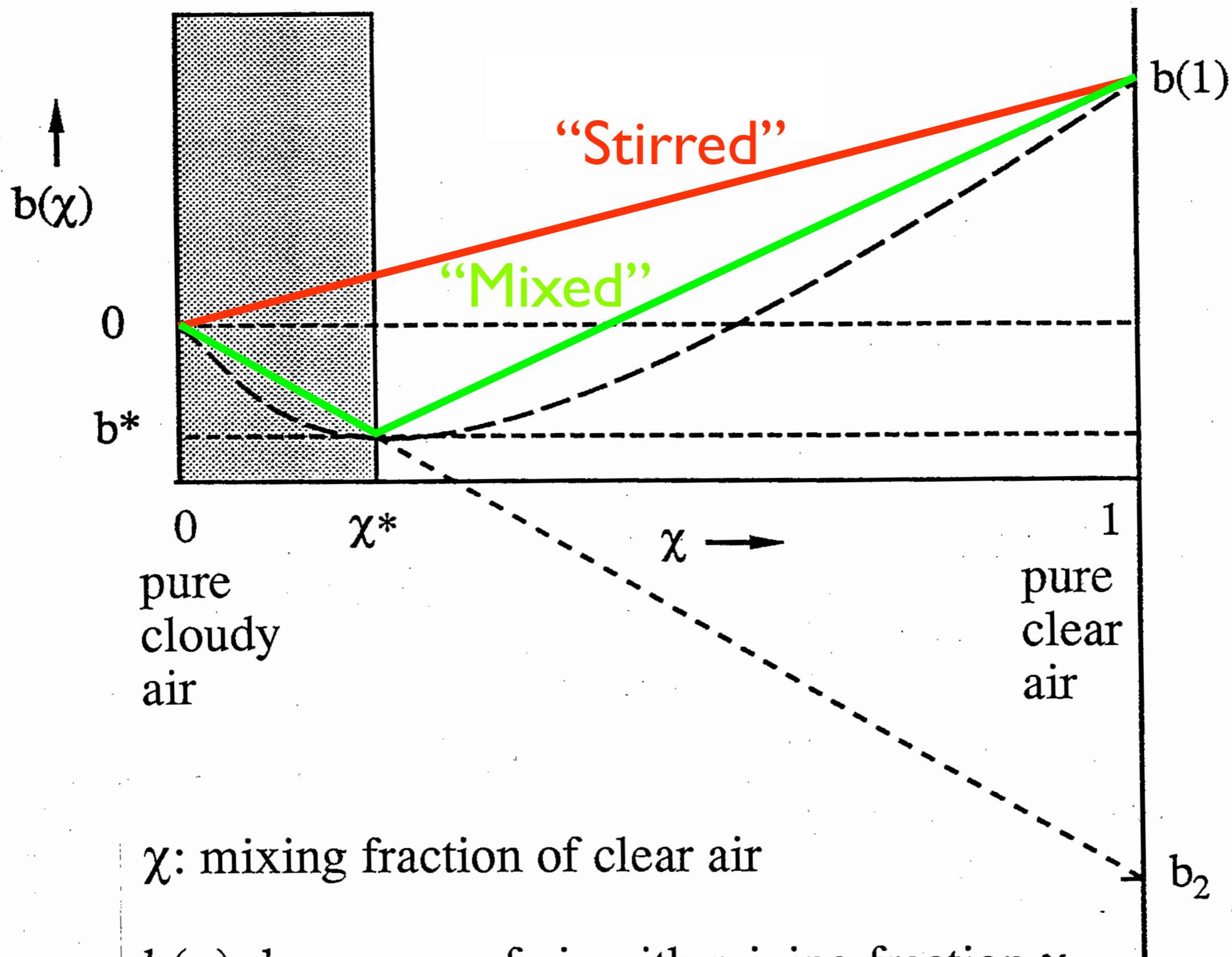
$d$  is entrained blob size,  $\epsilon$  is dissipation rate of turbulence kinetic energy.

For a **cumulus cloud**,  $U \sim 2$  m/s,  $L \sim 1000$  m, so  $\epsilon \sim U^3/L = 10^{-2}$  m<sup>2</sup>/s<sup>3</sup>. For  $d = 100$  m,  $\tau \sim 100$  s.

**Classic (instant mixing) parcel model** is recovered when

- Entrained blob size,  $d \rightarrow 0$
- Turbulence intensity,  $\epsilon \rightarrow \infty$

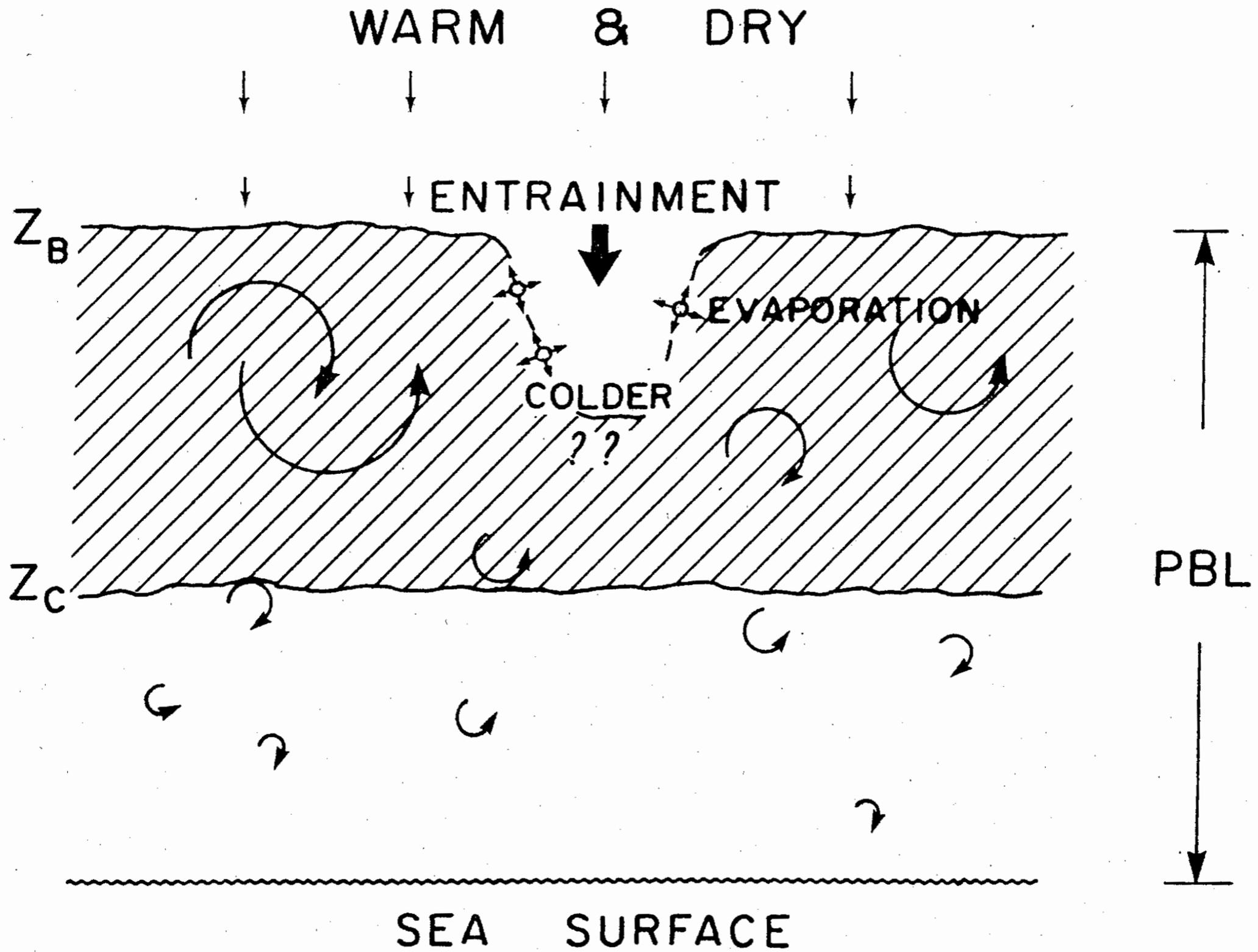
# Buoyancy vs Mixture Fraction



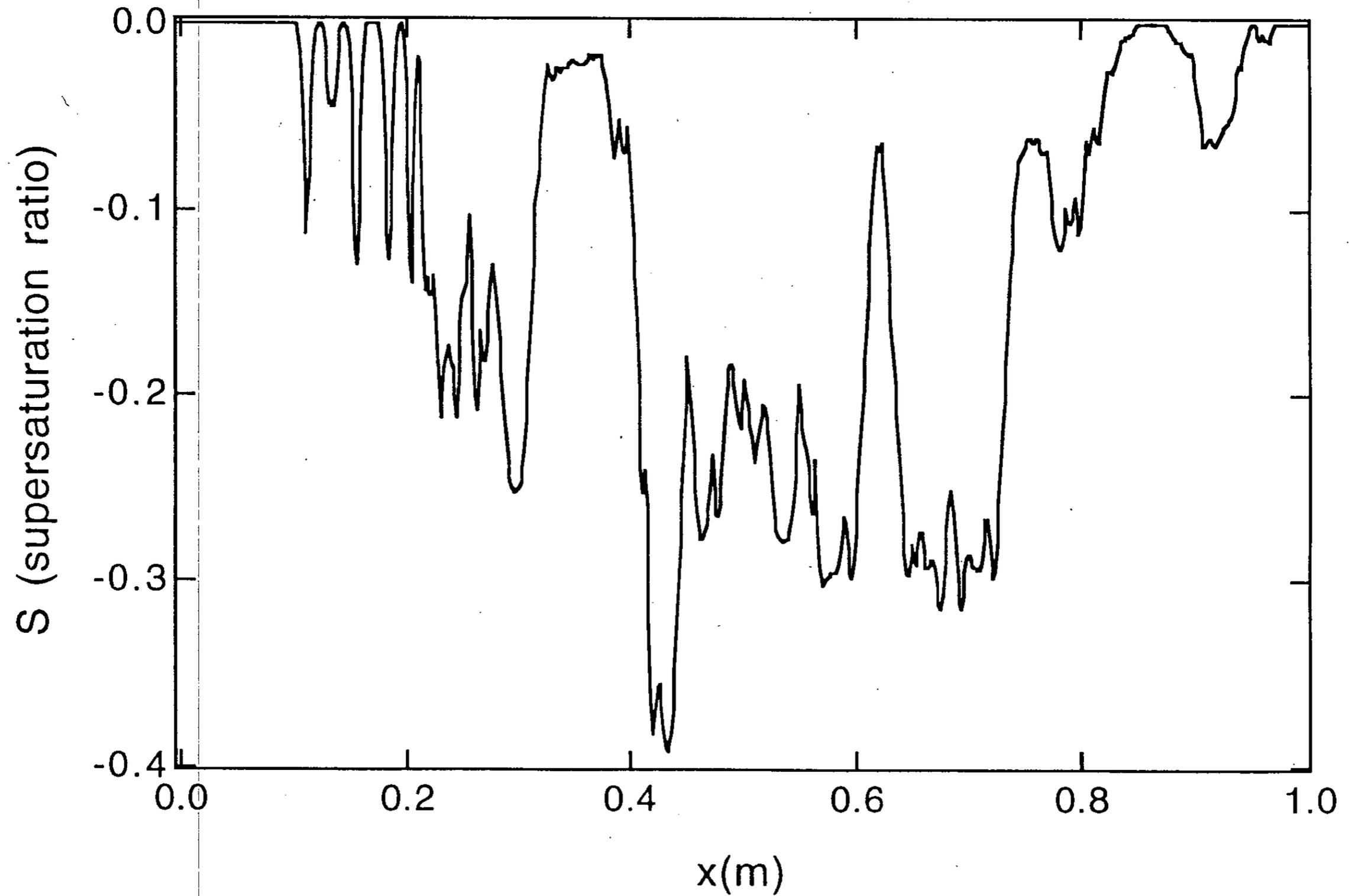
$\chi$ : mixing fraction of clear air

$b(\chi)$ : buoyancy of air with mixing fraction  $\chi$

# Cloud-top Entrainment Instability (CEI)



# Snapshot of supersaturation ratio during mixing



# An unsaturated blob is entrained

individual droplet radii

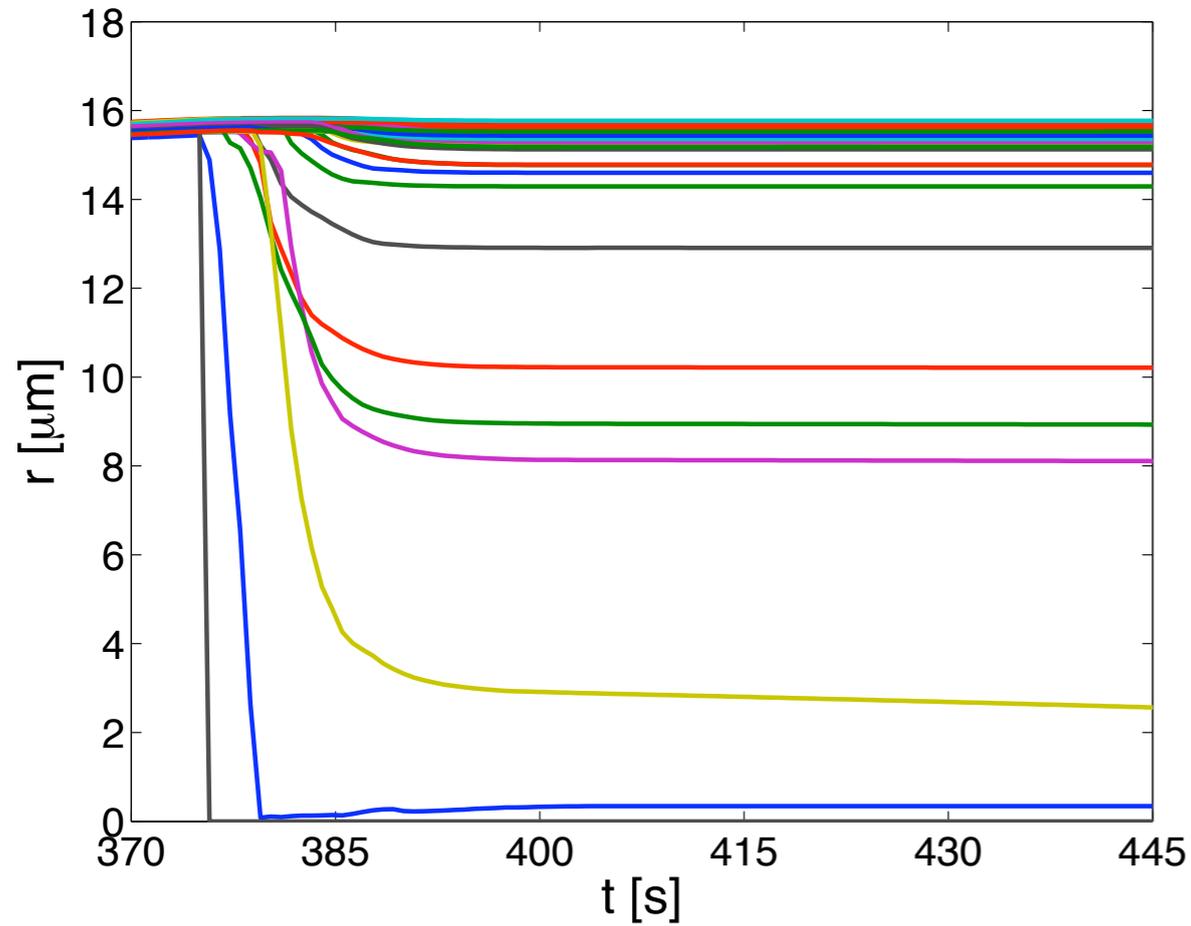


Figure 4.10: Radius histories of 30 droplets for  $f = 0.1$  and  $RH_e = 0.219$ .

width of droplet size distribution

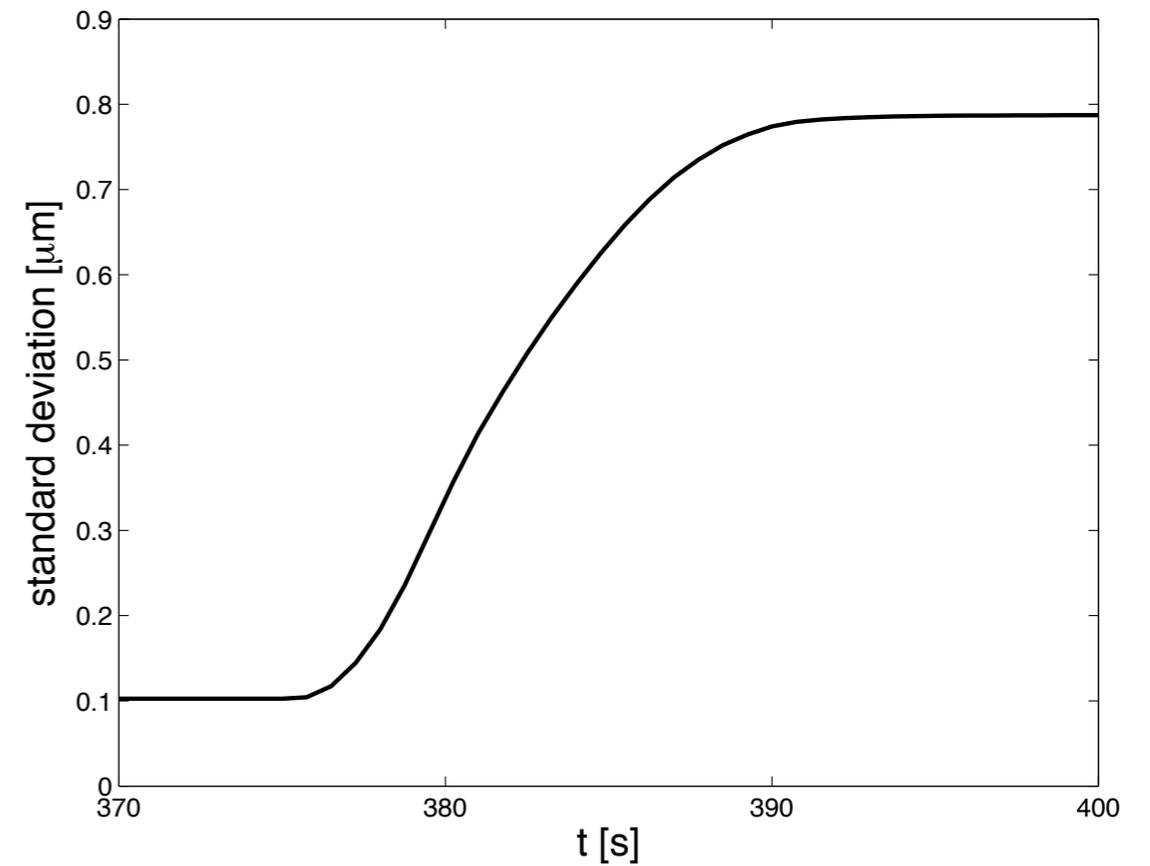
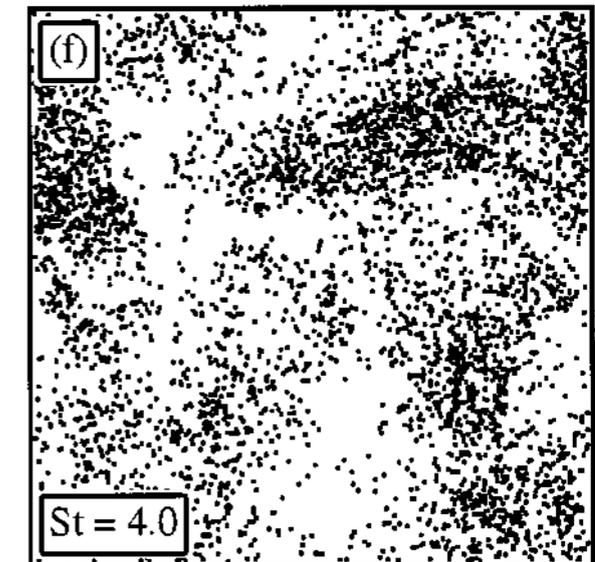
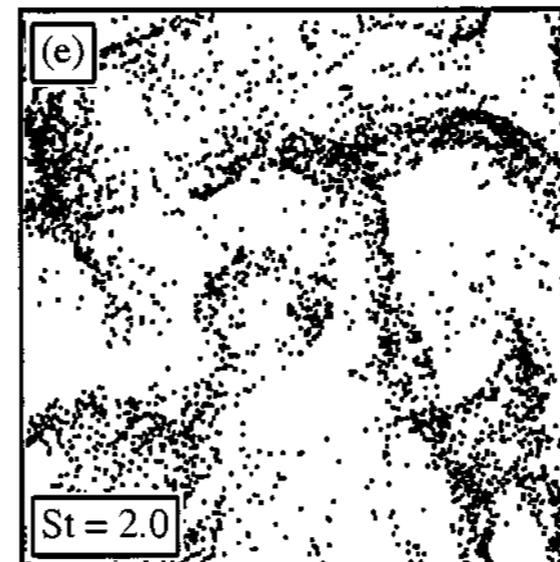
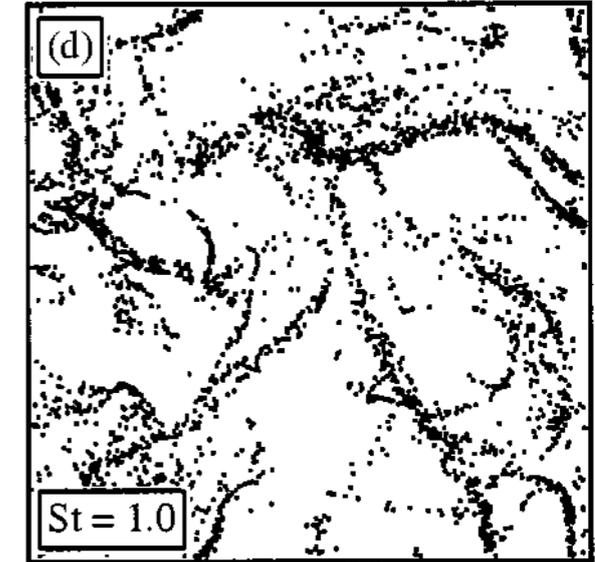
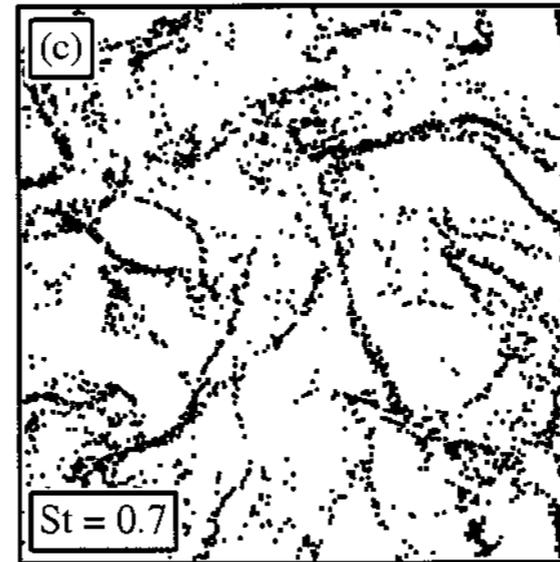
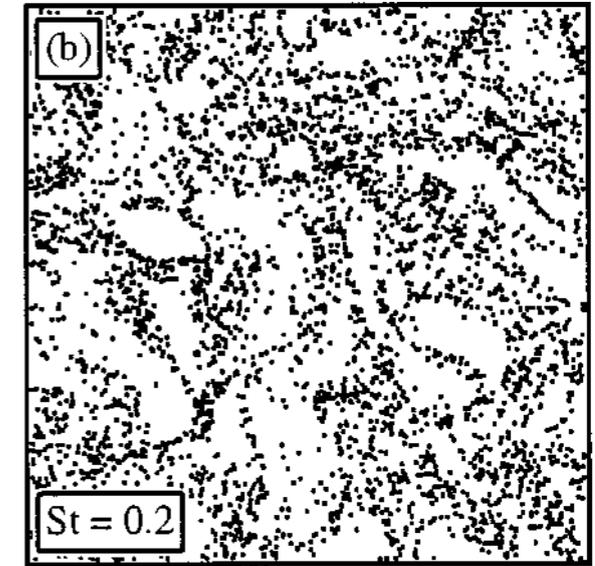
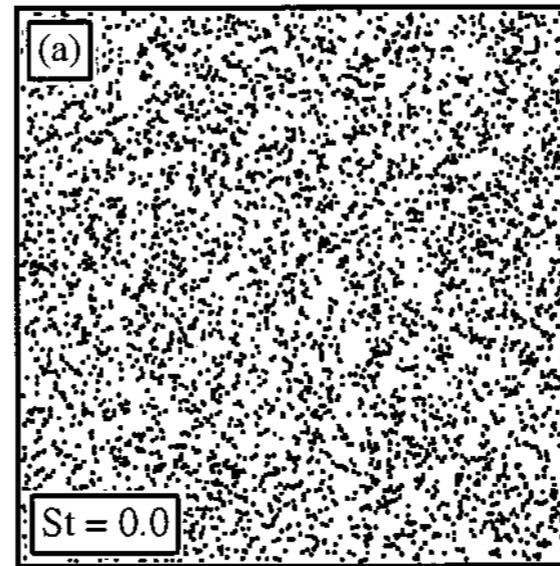


Figure 4.6: Standard deviation of the droplet radii just before entrainment until homogenization for entrainment fraction  $f = 0.2$  for the control case.

# Large droplets are needed to initiate collision-coalescence growth

- *Processes that may contribute to large droplet production*
  - Entrainment and mixing of unsaturated air
  - Droplet clustering due to turbulence
  - Giant aerosols

# Clustering of inertial particles in turbulence increases collision rates



Direct numerical simulation results  
from Reade & Collins (2000)

# Parameterization of SGS Cloud Processes in LES

- SGS mixing is instantaneous in most LES.
- SGS variability does not affect DSD in any LES.
- SGS turbulence affects droplet collision rates in very few LES.

# Parameterization of SGS Cloud Processes in LES

(and how to improve, v. I)

- SGS mixing is instantaneous in most LES. (Decrease grid size or estimate SGS PDF.)
- SGS variability does not affect DSD in any LES. (Decrease grid size.)
- SGS turbulence affects droplet collision rates in very few LES. (Modify collision kernel.)

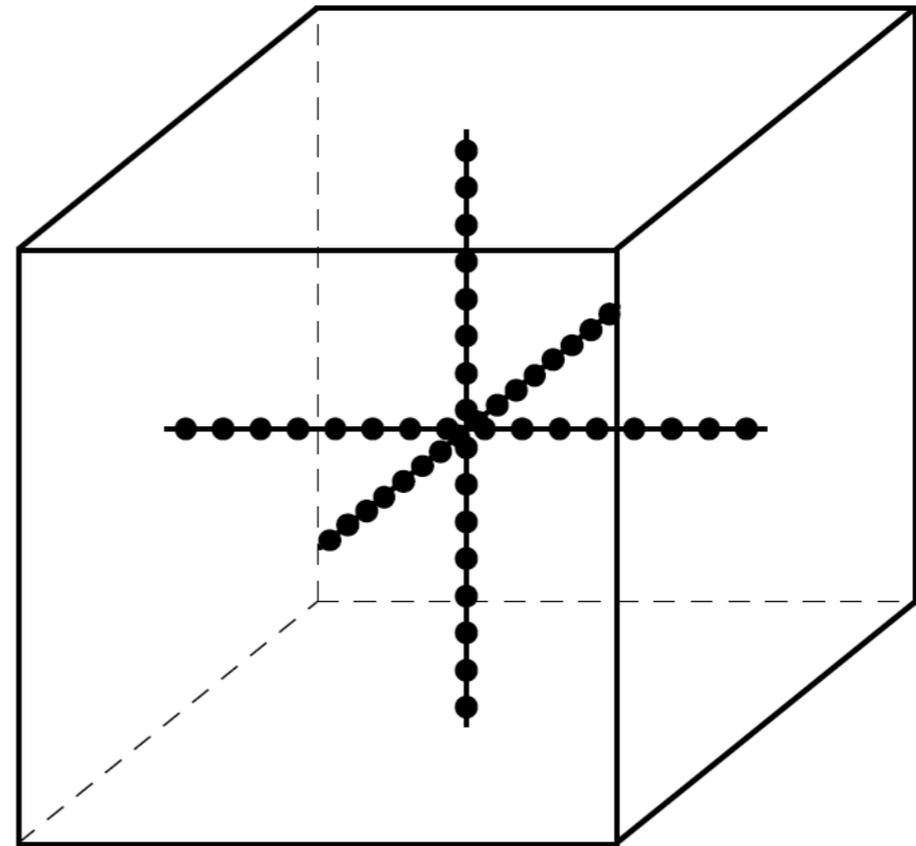
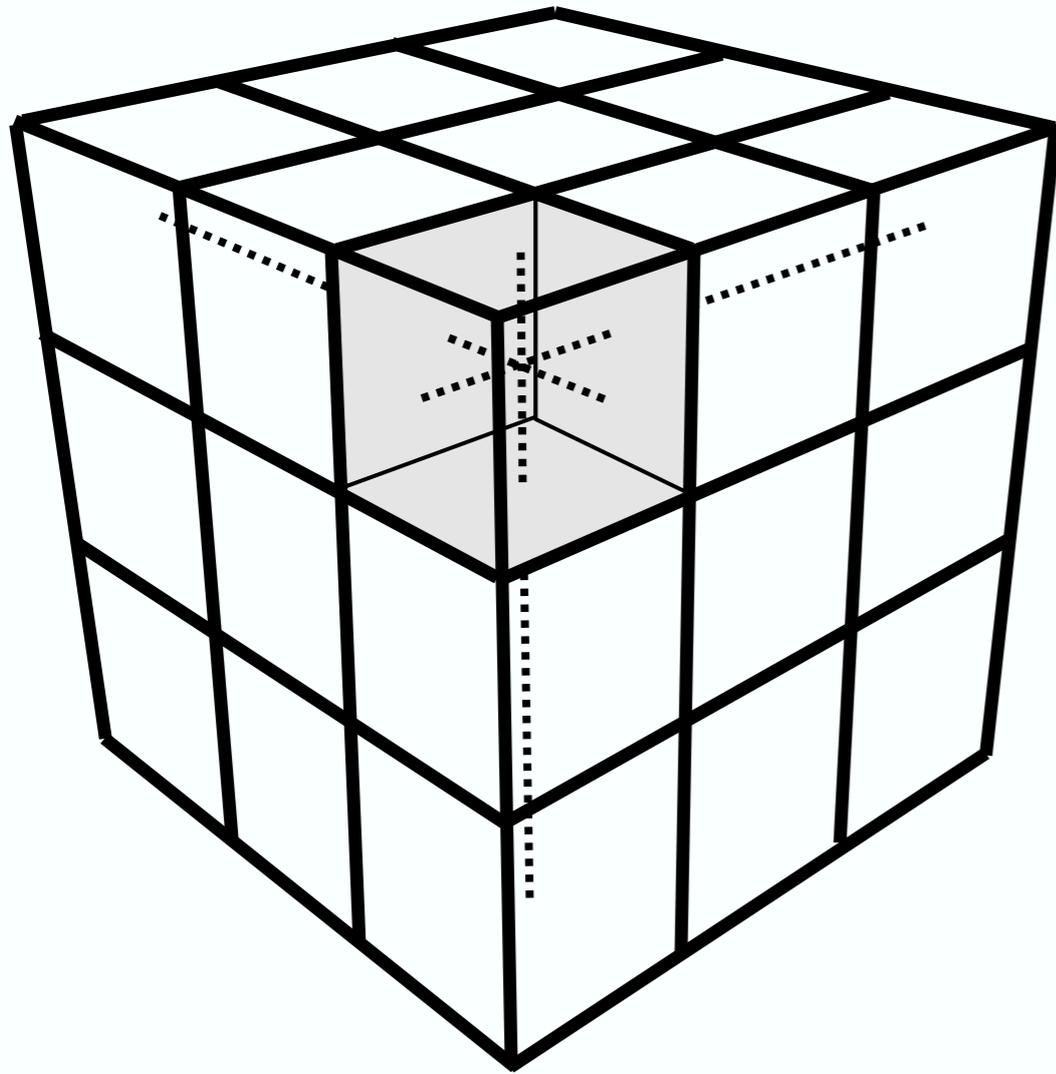
# How to resolve the small-scale variability?

- Decrease LES grid size?
  - To decrease LES grid size from 100 m to 1 cm would require  $10^{12}$  grid points per  $(100 \text{ m})^3$  and an increase in CPU time of  $10^{16}$ .
  - *This is not possible now or in the foreseeable future.*

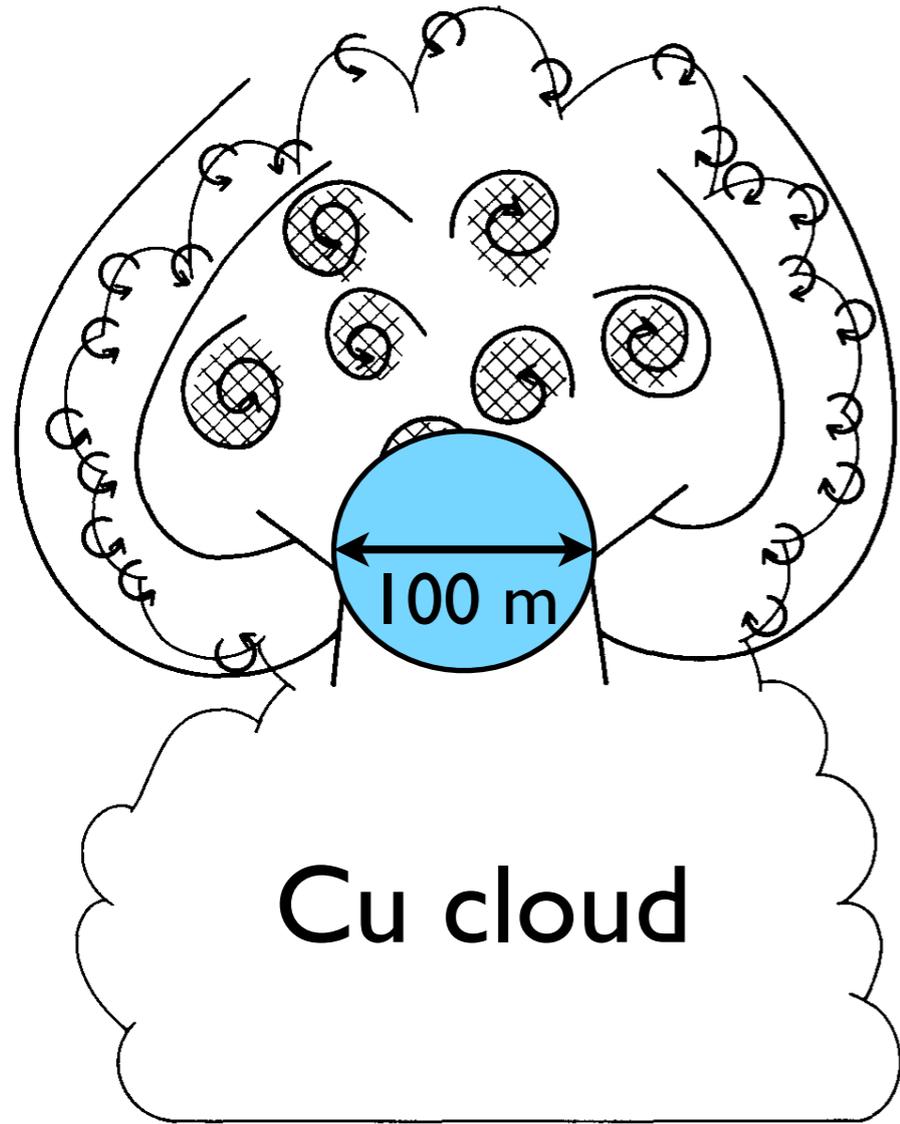
# How to resolve the small-scale variability?

- Decrease dimensionality from 3D to 1D?
- To decrease grid size from 100 m to 1 cm would require only  $10^4$  grid points per  $(100 \text{ m})^3$ .
- *This is feasible now.*

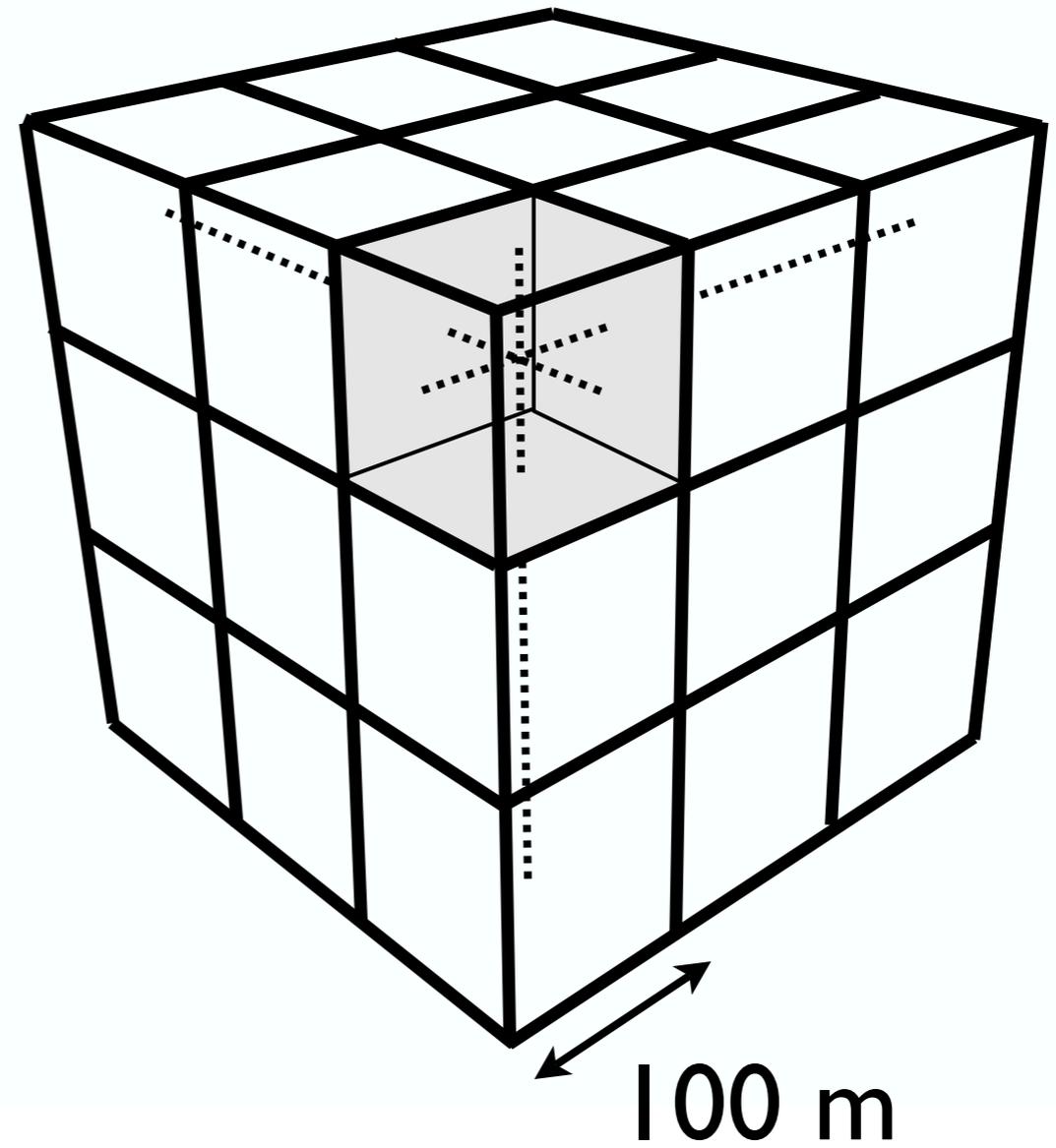
# LES with ID subgrid-scale model



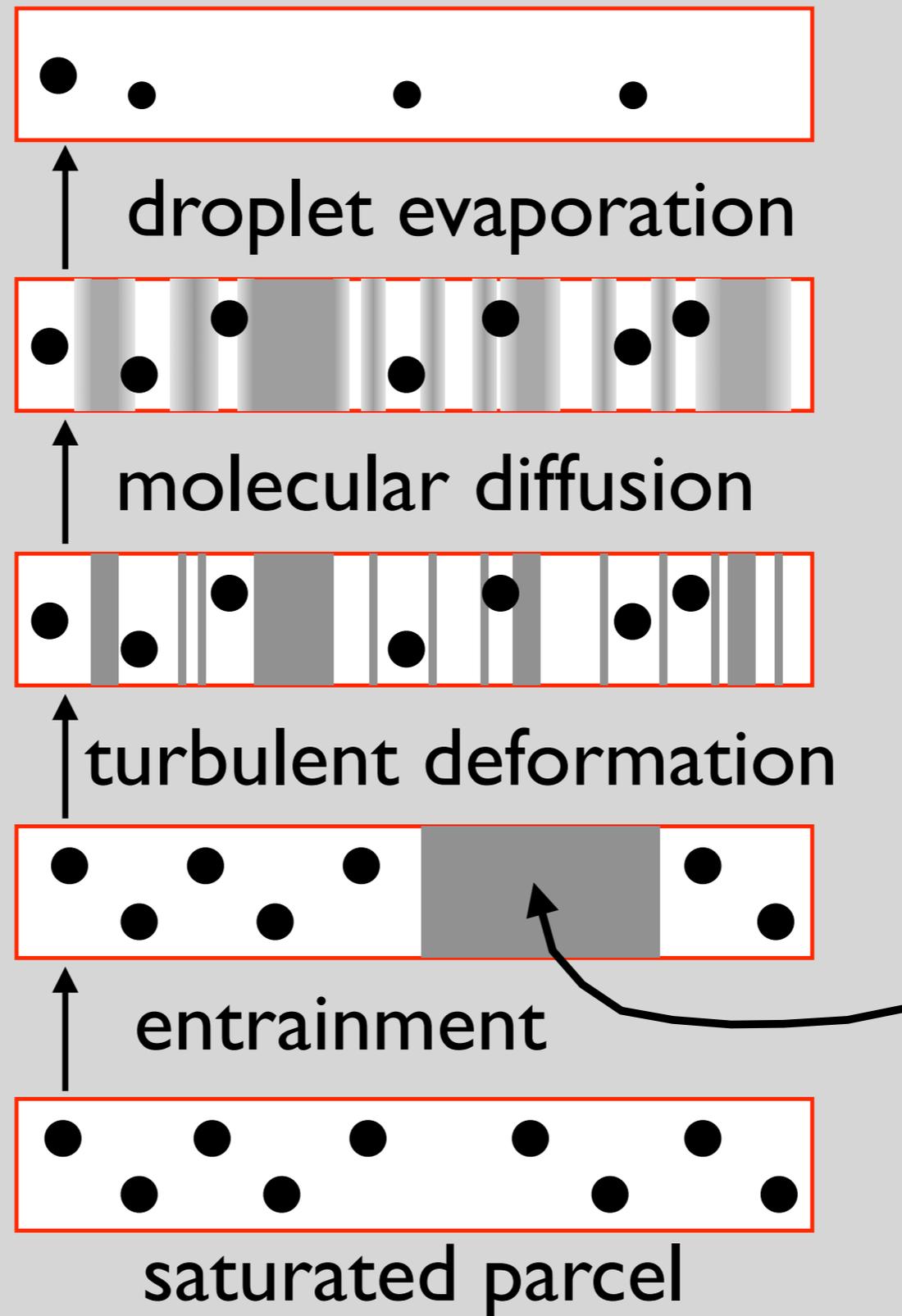
# Parcel model



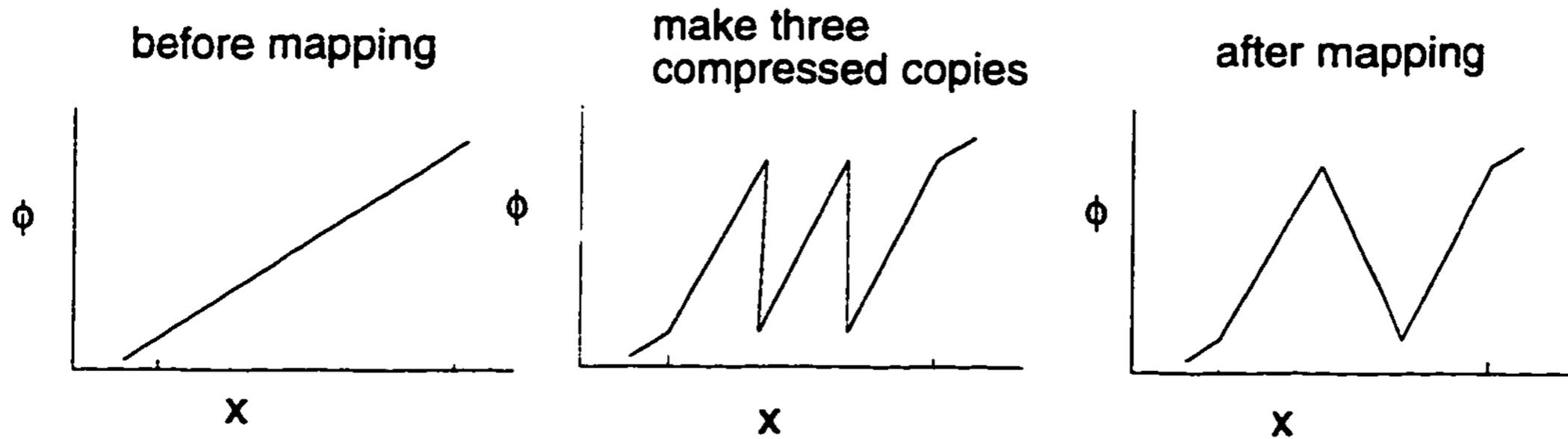
# Large-Eddy Simulation (LES) model



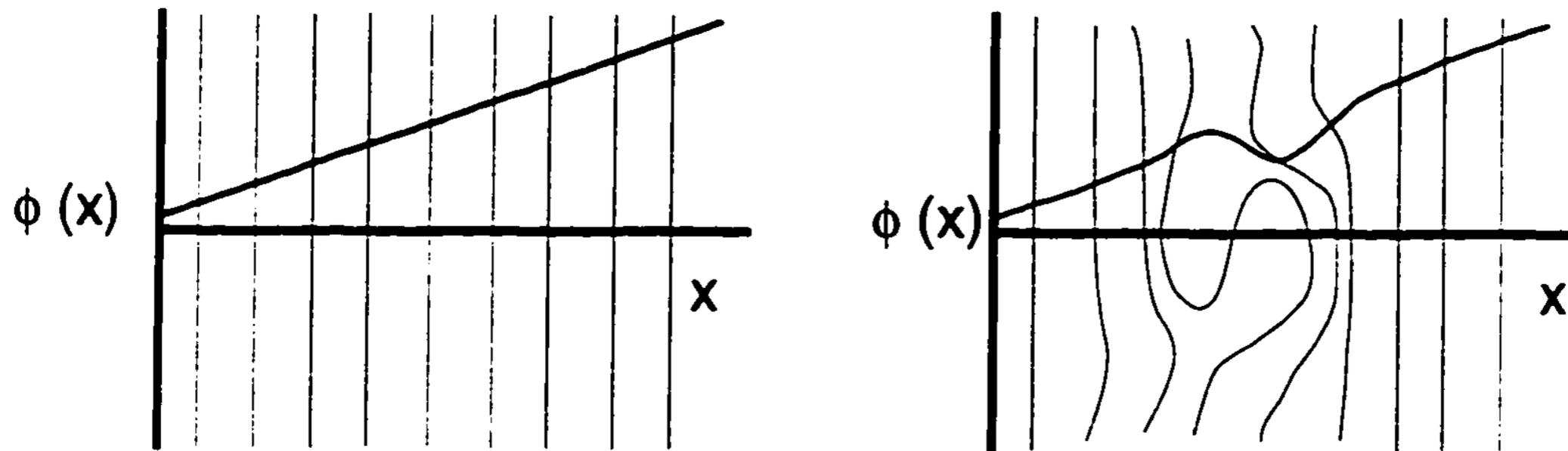
# I-D explicit mixing model



# Turbulent Motion is Represented by Applying Maps



**Figure 2.1.** Schematic diagram of a triplet mapping event.



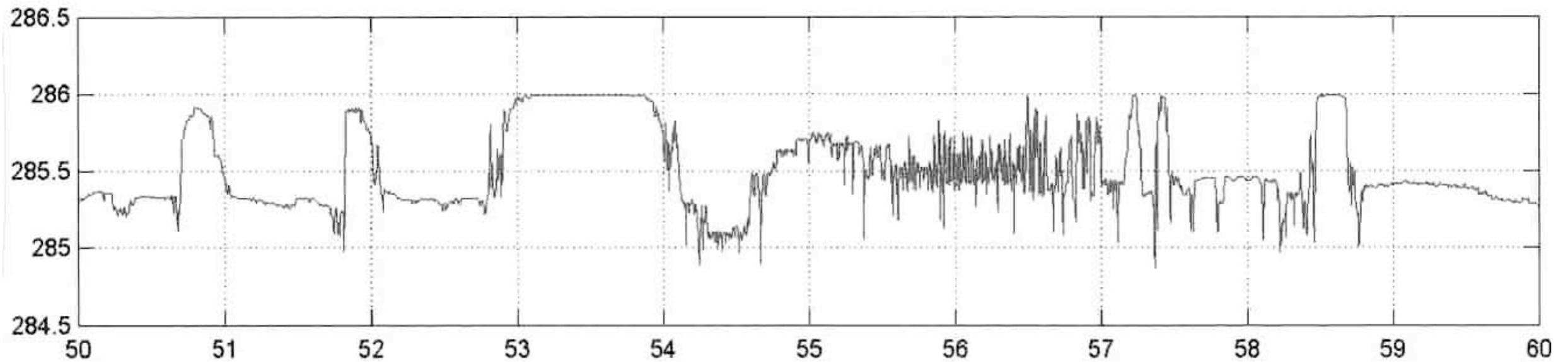
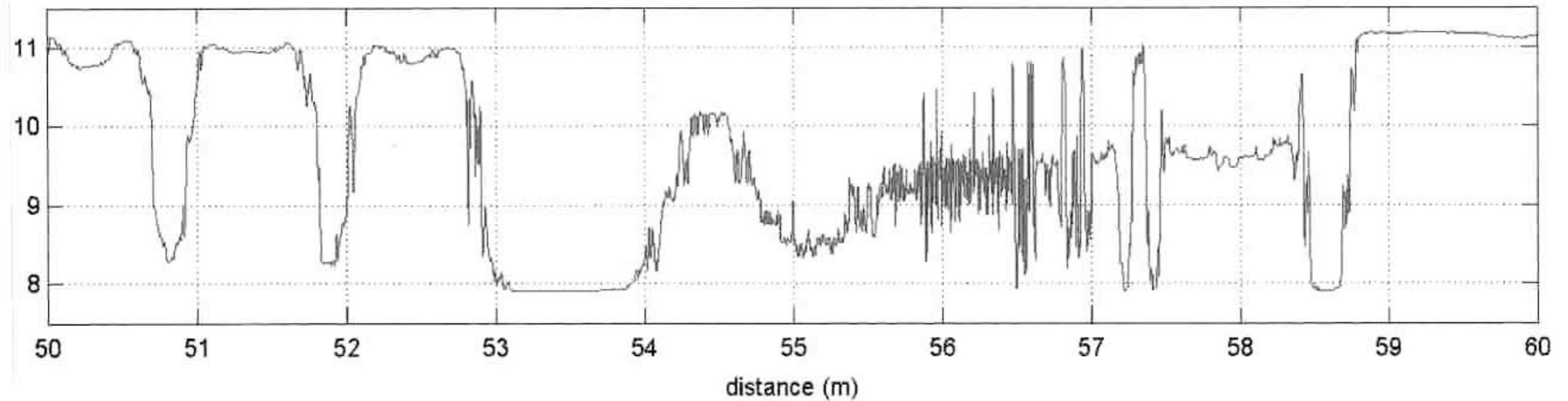
**Figure 2.2.** Effect of a single counterclockwise eddy on a scalar field with linear gradient.

# Triplet Map

Each triplet map has a location, size, and time.

- *Location* is randomly chosen.
- *Size* is randomly chosen from a distribution that matches inertial range scalings.
  - *Smallest* map (eddy) is Kolmogorov scale.
  - *Largest* eddy is  $L$ , usually domain size.
- Eddies occur at a *rate* determined by the large eddy time scale and eddy size range.

# I-D Explicit Mixing Model: water vapor and temperature fields



# I-D SGS model for LES

- *LES*: grid size = 10 m.
- *SGS mixing*: Explicit mixing model (EMM) with grid size = 1 m.
- *Microphysics*: bin model in each EMM grid cell.
- *Collection kernel*: increased to represent turbulence effects.
- *CPU time* ~ LES with bin model at 5-m grid size.

# Summary

- Reducing the dimensionality is an established method.
- Removes or reduces the need for SGS parameterizations.
- It is very well suited for high-Reynolds number turbulent flows when small-scale mixing processes are important.

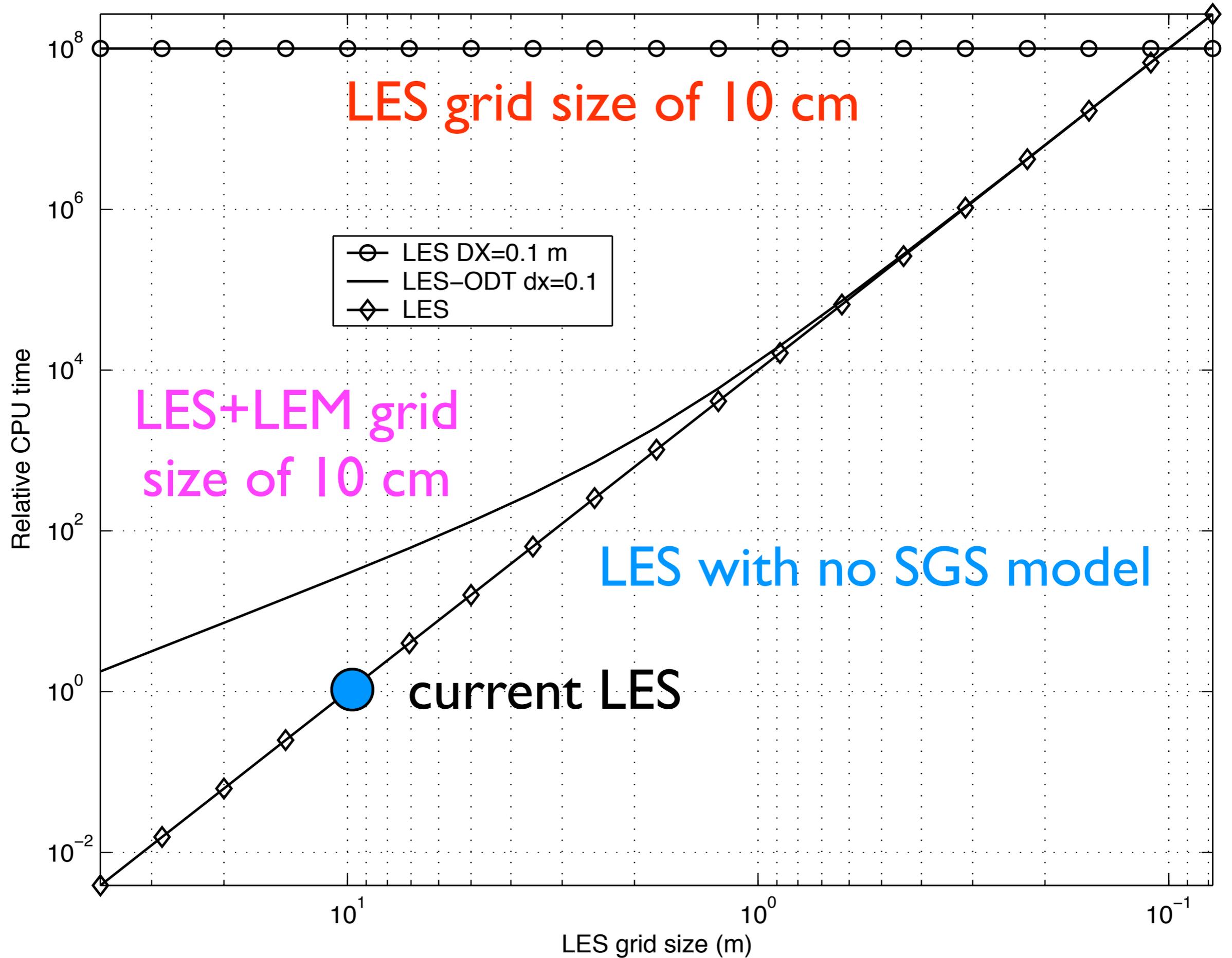


**EXTRA SLIDES**

# I-D SGS models for LES

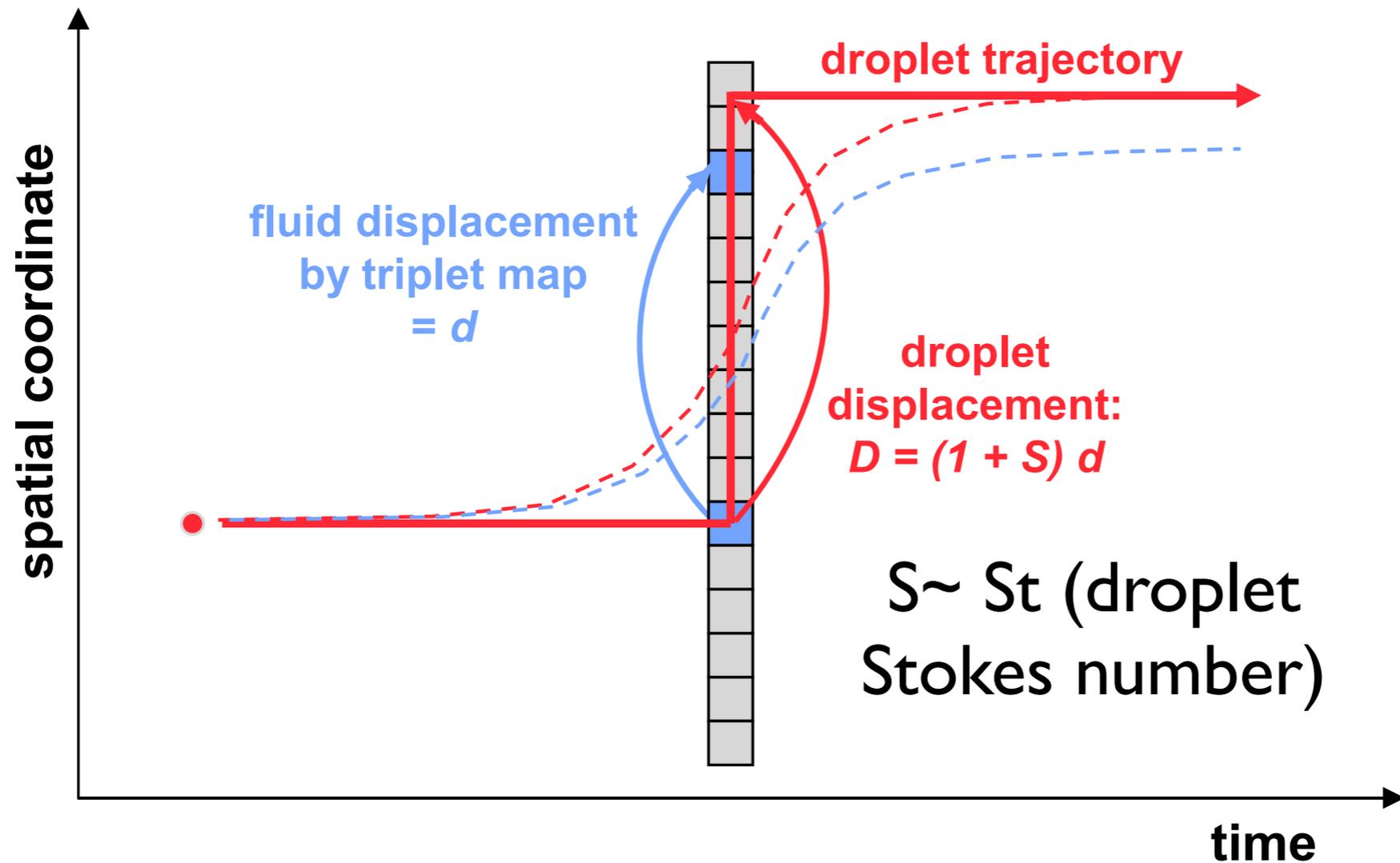
Turbulence	Physics	Microphysics	Dimension	Domain	Grid size	Grid points (Droplets)
LEM	mixing & buoyancy	bulk condensation & evaporation	1	10 m	1 m	10 -
LEM	mixing & DSD	droplet condensation & evaporation	1	10 m	1 mm	$10^4$ ( $10^3$ )
3D droplet triplet map	turbulence & collisions	droplet collision & coalescence	1 (3)	10 m $\times$ (1 cm) <sup>2</sup>	-	- ( $10^3$ )
LEM	all	bin model: droplet cond/evap & coll/coal	1	10 m	1 cm	$10^2$ -

CPU times relative to LES with DX=10



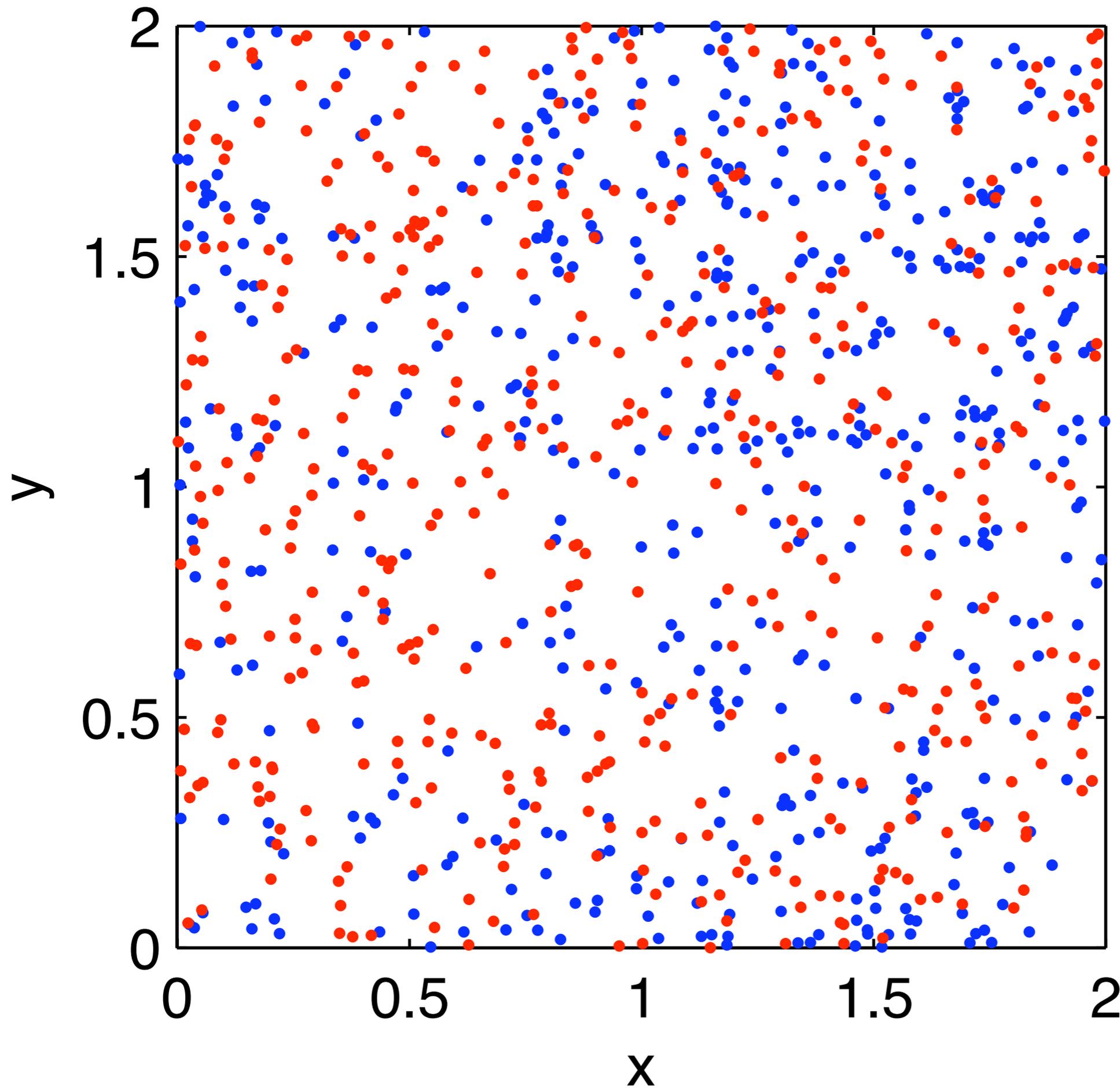
# A 3D triplet map for inertial droplets

The droplet trajectory model idealizes droplet response to continuum flow (dashed curves: notional continuum fluid streamline and droplet trajectory)



**Fig 3.** Difference between displacement due to triplet map and the total displacement. (A. R. Kerstein)

x-y plot for all z



$St = 0$

$St = 0.025$

length unit is  
triplet map  
eddy size =  
20 x  
Kolmogorov  
scale

# Triplet map vs. 3D turbulence

## Strengths

- **Transport:** map frequency is set so that fluid transport matches turbulent eddy diffusivity.
- **Length scale reduction:** by matching the inertial-range size-vs.-frequency distribution of eddy motions, the rate of length scale reduction as a function of fluid parcel size is consistent with 3D turbulence.
- **Intermittency:** Random sampling of triplet map occurrences and sizes reproduces, qualitatively and to some degree quantitatively, intermittency properties of 3D turbulence.
- **Mixing:** In conjunction with molecular diffusion, the map sequence reproduces mixing features.

# Triplet map vs. 3D turbulence

## Weaknesses

- Omits effects of time persistence of turbulent motions.
- When diffusive time scales are shorter than turbulent time scales, diffusion can suppress scalar fluctuations faster than they are generated in 3D turbulence.
- In some cases, turbulence spreads a slow-diffusing scalar faster than a fast-diffusing scalar. This is a multi-dimensional effect that 1D advection cannot capture.

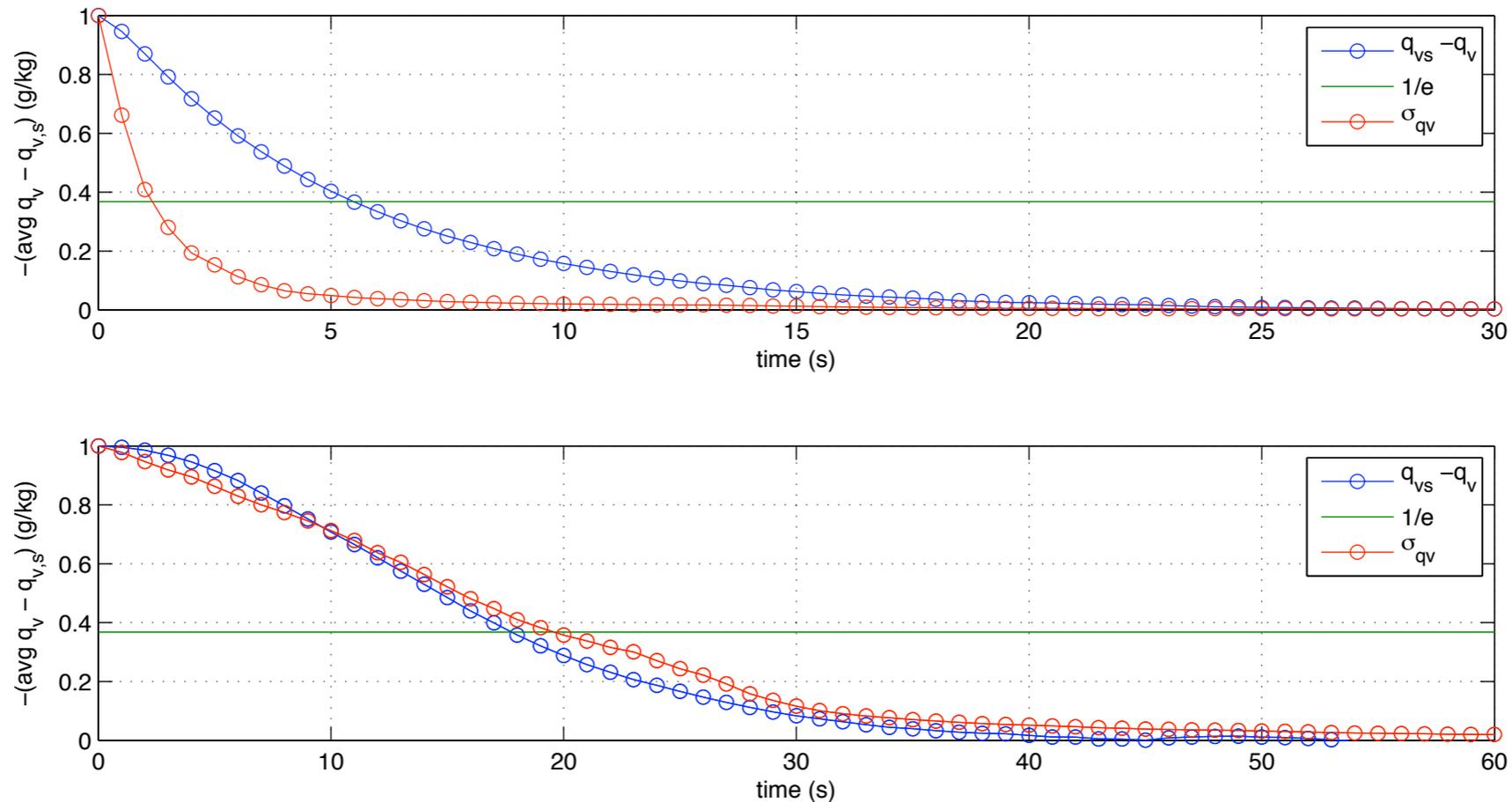
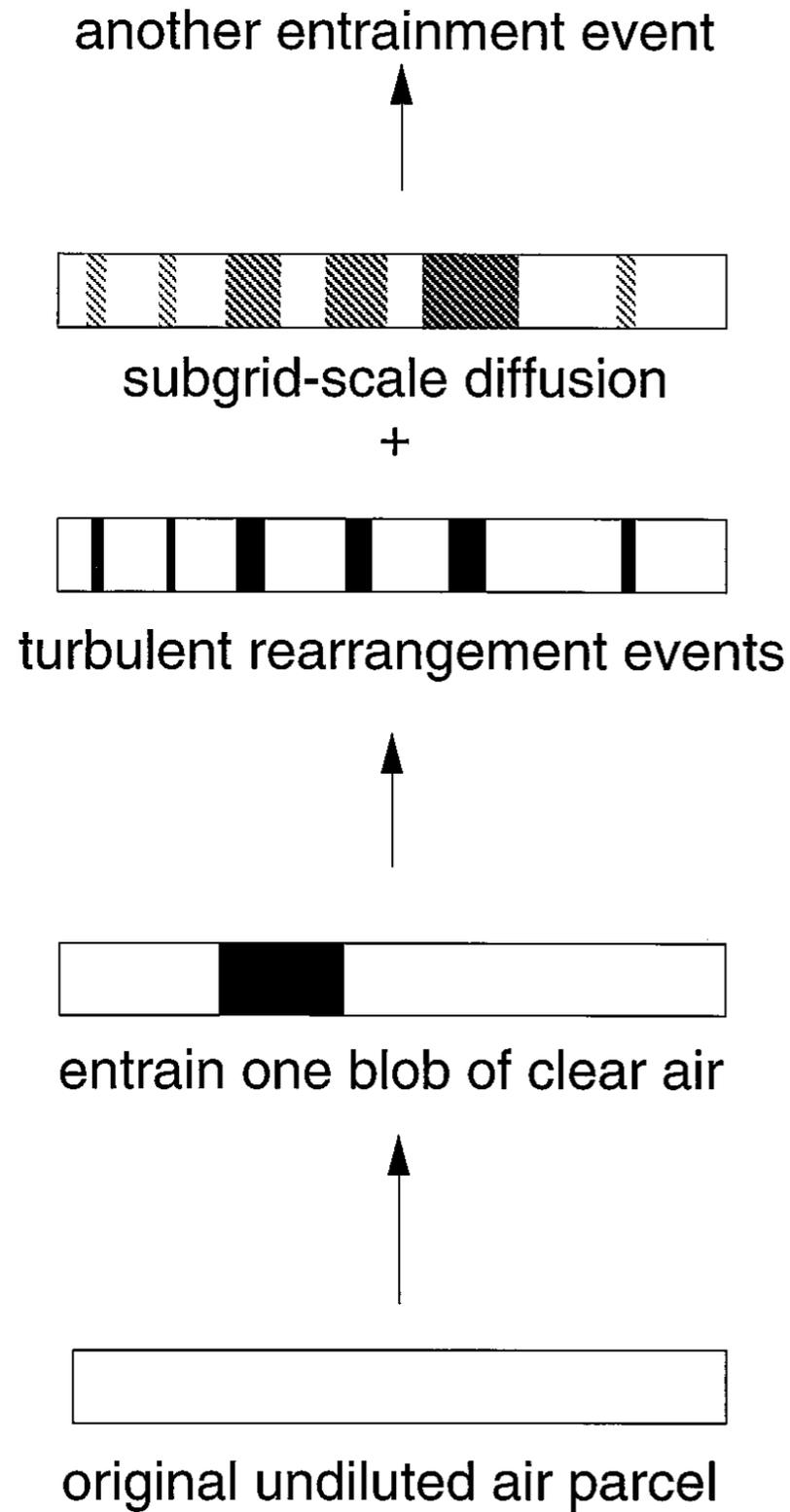


Figure 1: (top) Explicit Mixing Parcel Model simulation of isobaric mixing of saturated air (containing 100 cloud droplets per  $\text{cm}^{-3}$  of radius  $15 \mu\text{m}$ ) with 1 segment of subsaturated air 0.25 m in length in a 1D domain 20 m in length, with a dissipation rate of  $10^{-2} \text{ m}^2 \text{ s}^{-3}$ . The blue curve is the average subsaturation normalized by its initial value, the red curve is the std dev of the water vapor mixing ratio, and the green line is  $1/e$ . The  $e$ -folding times for saturation adjustment and decay of water vapor std dev obtained from the plot are 5.5 s and 1.2 s, respectively. The calculated evaporation and mixing timescales are 4 s and 1.8 s, respectively. (bottom) Same as top except for mixing of 5 segments of subsaturated air (each 10 m in length) in a 1D domain 100 m in length. The  $e$ -folding times for saturation adjustment and decay of water vapor std dev obtained from the plot are 18 s and 20 s, respectively. The calculated evaporation and mixing timescales are 4 s and 22 s, respectively.

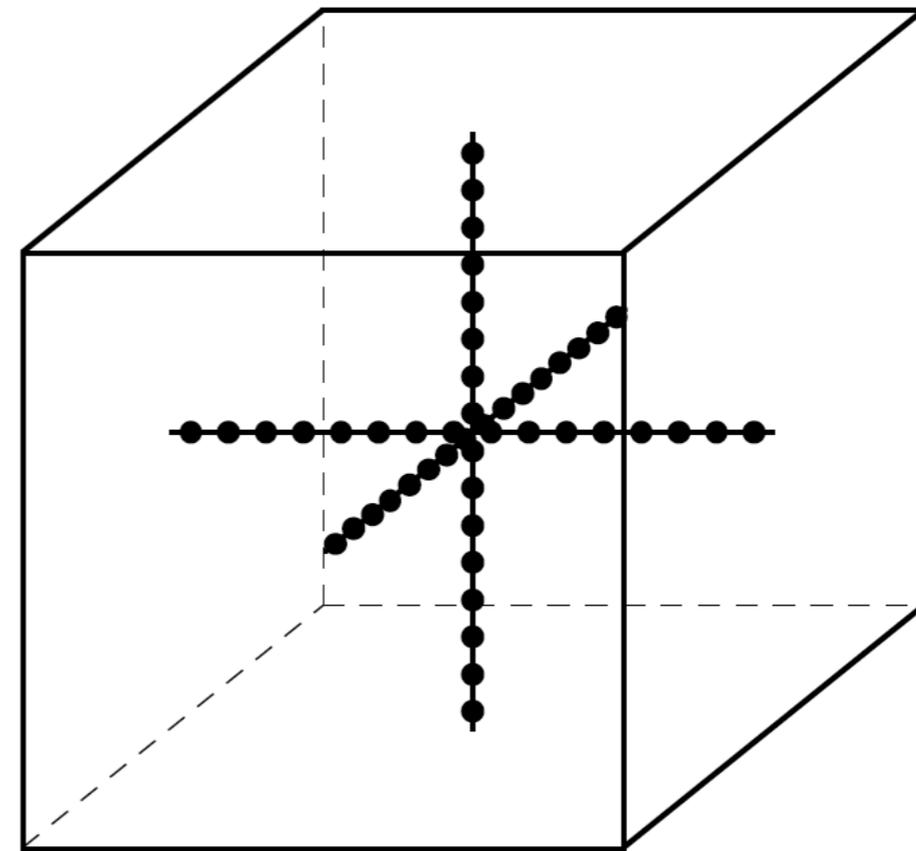
# Parameterization of SGS Cloud Processes in LES

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# Explicit Mixing Parcel Model (EMPM)



# LES with 1D subgrid-scale model



# Explicit Mixing Parcel Model (EMPM)

- The EMPM predicts the evolving in-cloud variability due to entrainment and finite-rate turbulent mixing using a 1D representation of a rising cloudy parcel.
- The 1D formulation allows the model to resolve fine-scale variability down to the smallest turbulent scales ( $\sim 1$  mm).
- The EMPM can calculate the growth of several thousand individual cloud droplets based on each droplet's local environment.

# EMPM Required Inputs

- Required for a classical (instant mixing) parcel model calculation:

Thermodynamic properties of cloud-base air

Updraft speed

Entrainment rate

Thermodynamic properties of entrained air

Aerosol properties

- In addition, the EMPM requires:

Parcel size

Entrained blob size,  $d$

Turbulence intensity (e.g., dissipation rate,  $\epsilon$ )

The droplet Stokes number is

$$\text{St} = t_d \gamma$$

where

$$t_d = \frac{m_p}{6\pi r \mu} = \frac{2\rho_p r^2}{9\mu}$$

is the droplet response time,  $m_p$  is the droplet mass,  $\rho_p$  the droplet density,  $r$  the droplet radius, and  $\mu$  the dynamic viscosity, and

$$\gamma = (\epsilon/\nu)^{1/2} = 1/\tau_K$$

is a global measure of strain, and  $\tau_K$  is the Kolmogorov time scale.

