

# Numerical modeling of multiscale atmospheric flows: From cloud microscale to climate

*Wojciech W. Grabowski*  
*(reporting on collaborative research)*

National Center for Atmospheric Research  
Boulder, Colorado, USA

# *7<sup>th</sup> WMO Cloud Modeling Workshop*

*23-27 July 2012 (the week before ICCP in Leipzig)*

*Warsaw, Poland*

*Cases are being finalized,  
info will send out once finished*

*Interested? If so, please email me ([grabow@ucar.edu](mailto:grabow@ucar.edu))*

# *NCAR GTP Workshop*

## *Multiphase turbulent flows in the atmosphere and ocean*

*13-17 August 2012*

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# Numerical modeling of multiscale atmospheric flows: From cloud microscale to climate

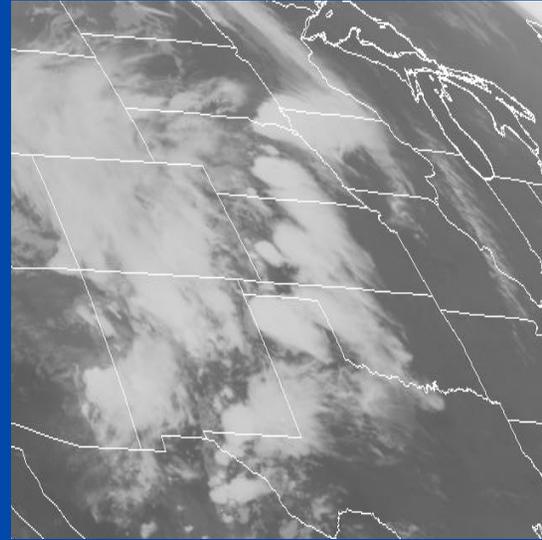
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## Mesoscale convective systems over US



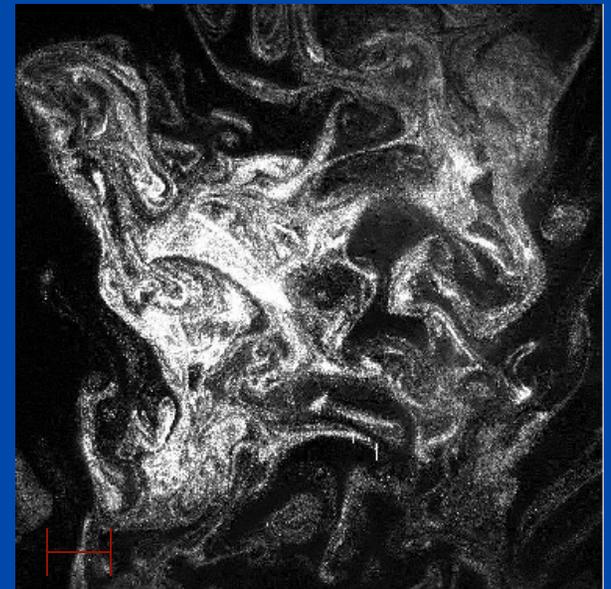
1,000 km



Mixing in laboratory cloud chamber

*Clouds and climate:  
the range of scales...*

Small cumulus clouds



10 cm

Resolving such a range of scales in numerical models will never be possible...

Resolving such a range of scales in numerical models will never be possible...

Even for processes near each of the scale illustrated above, there are multiscale interactions that cannot be resolved by the “direct numerical simulation” approach...

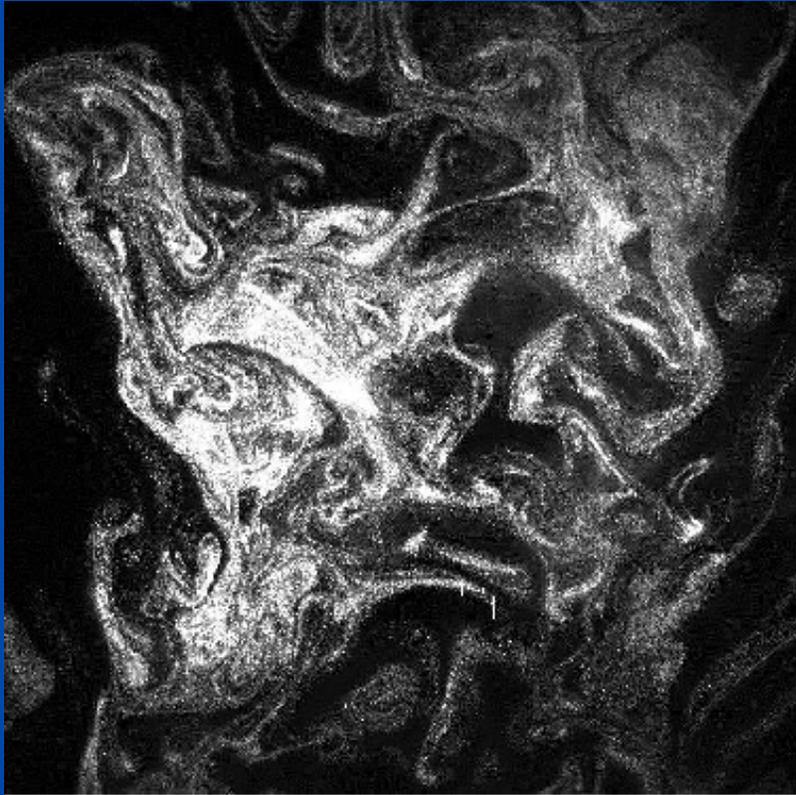
Resolving such a range of scales in numerical models will never be possible...

Even for processes near each of the scale illustrated above, there are multiscale interactions that cannot be resolved by the “direct numerical simulation” approach...

Significant progress may still be achieved using “multiscale” approaches.

NB. “Multiscale” is used here in a loose sense: extending the range of scales directly simulated by the model (e.g., sophisticated subgrid-scale parameterizations?)...

Modeling effects of turbulence on growth  
of cloud droplets by collision/coalescence

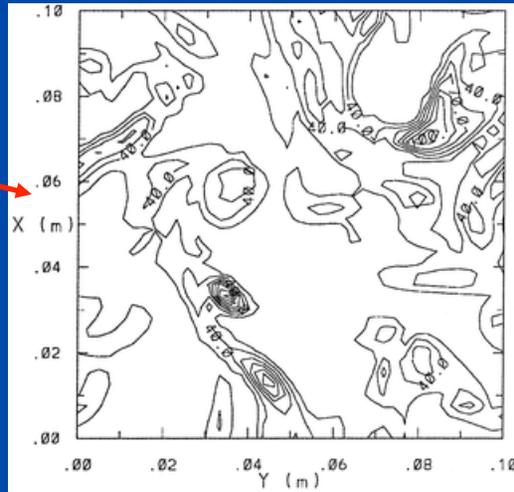


*with Prof. Lian-Ping Wang*

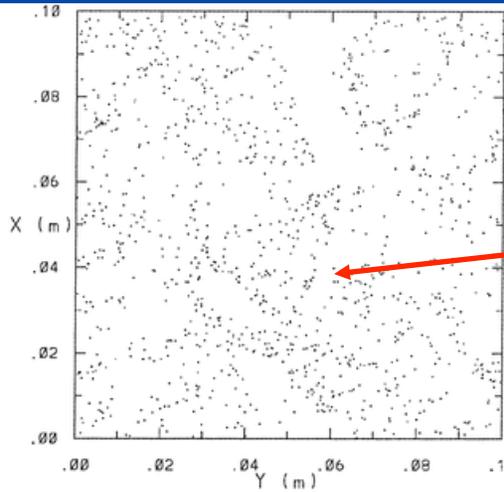
Department of Mechanical Engineering,  
University of Delaware,  
Newark, Delaware, USA

# DNS simulations with sedimenting droplets for conditions relevant to cloud physics ( $\epsilon=160 \text{ cm}^2\text{s}^{-3}$ )

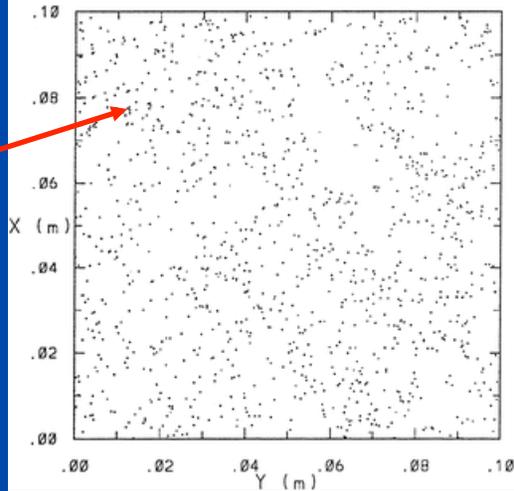
Vorticity  
(contour  $15 \text{ s}^{-1}$ )



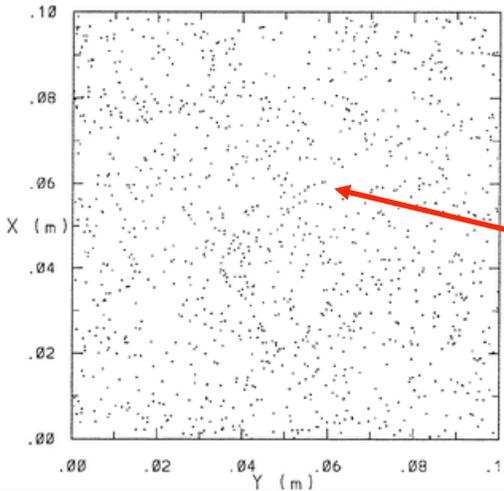
$r=20$  micron



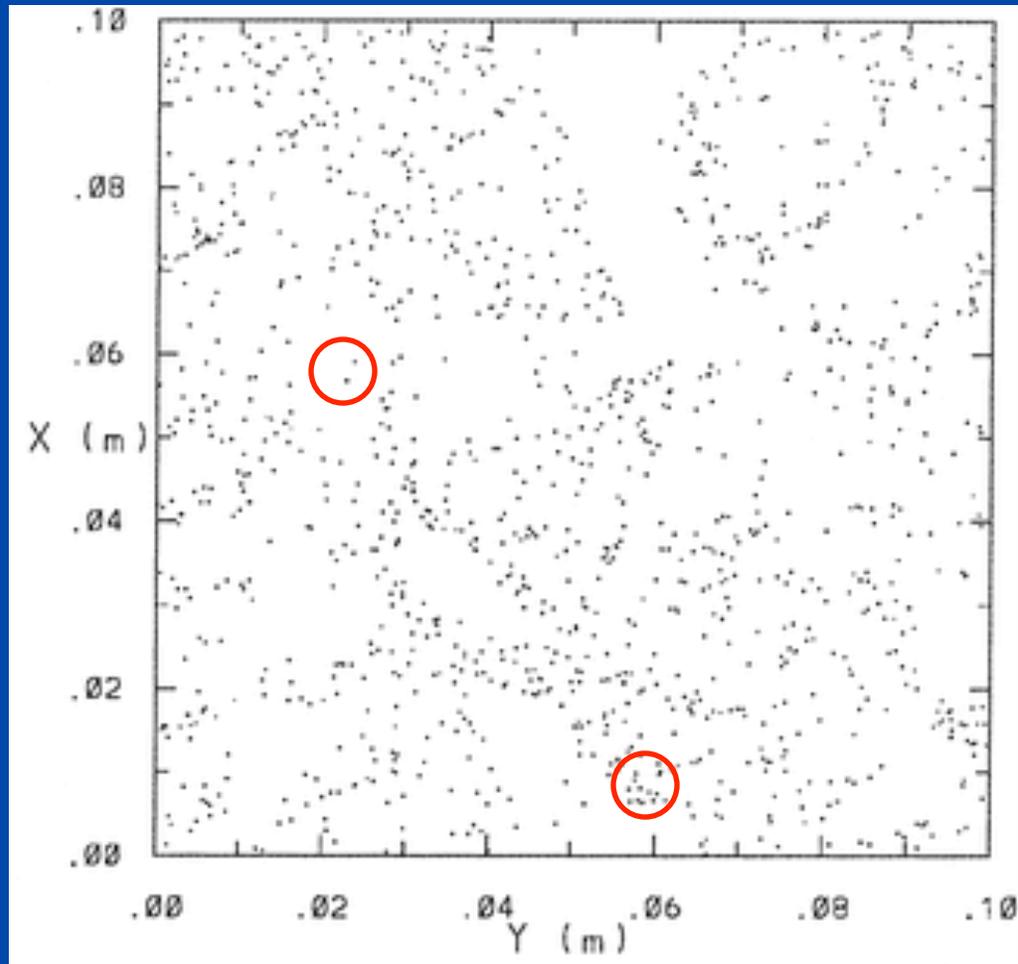
$r=15$  micron



$r=10$  micron



**Growth by collision/coalescence: nonuniform distribution of droplets in space affects droplet collisions...**



## Three basic mechanisms of turbulent enhancement of gravitational collision/coalescence:

*-Turbulence modifies local droplet concentration (preferential concentration effect)*

*-Turbulence modifies relative velocity between colliding droplets (e.g., small-scale shears, fluid accelerations)*

*- Turbulence modifies hydrodynamic interactions when two droplets approach each other*

**Three basic mechanisms of turbulent enhancement of gravitational collision/coalescence:**

geometric collisions  
(no hydrodynamic interactions)

*-Turbulence modifies local droplet concentration  
(preferential concentration effect)*

*-Turbulence modifies relative velocity between colliding droplets (e.g., small-scale shears, fluid accelerations)*

*- Turbulence modifies hydrodynamic interactions when two droplets approach each other*

## Three basic mechanisms of turbulent enhancement of gravitational collision/coalescence:

*-Turbulence modifies local droplet concentration (preferential concentration effect)*

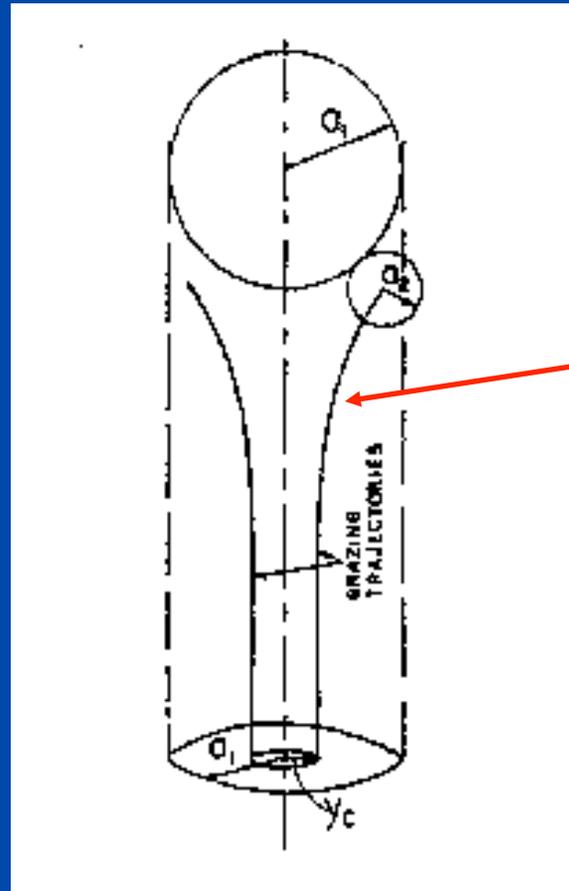
*-Turbulence modifies relative velocity between colliding droplets (e.g., small-scale shears, fluid accelerations)*

collision efficiency



*- Turbulence modifies hydrodynamic interactions when two droplets approach each other*

## Collision efficiency $E_c$ for the gravitational case:



Grazing  
trajectory

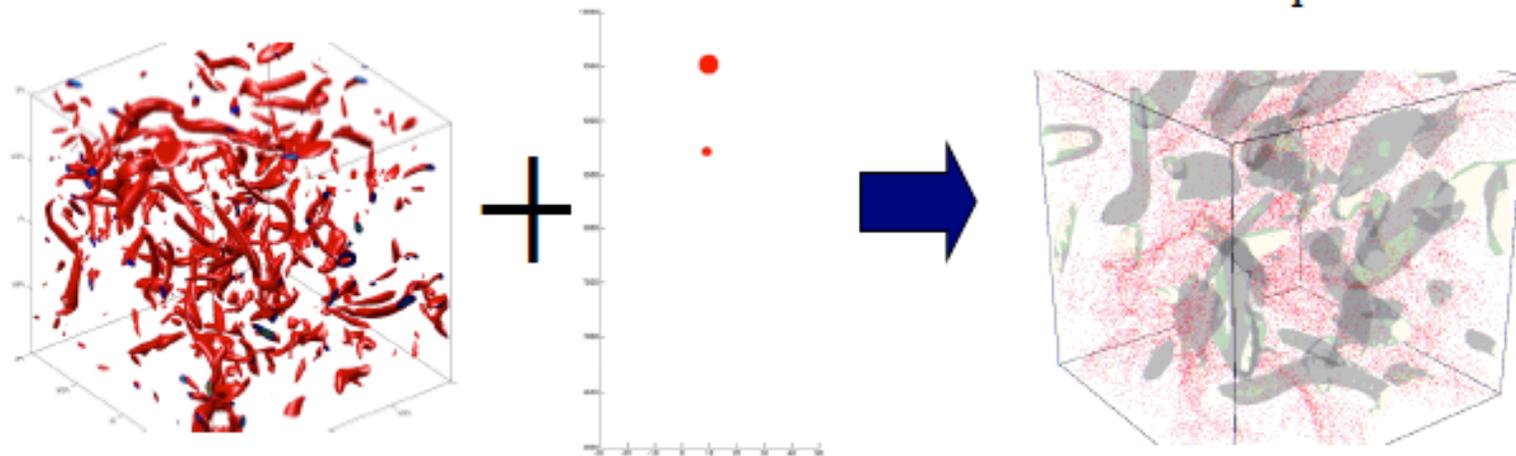
$$E_c = \frac{y_c^2}{(a_1 + a_2)^2}$$

The hybrid DNS approach: including disturbance flows due to droplets

$$\vec{U}(\vec{x}, t) + \sum_{k=1}^{N_p} \vec{u}_s(\vec{r}_k; a_k, \vec{V}_k - \vec{U}(\vec{Y}_k, t) - \vec{u}_k)$$

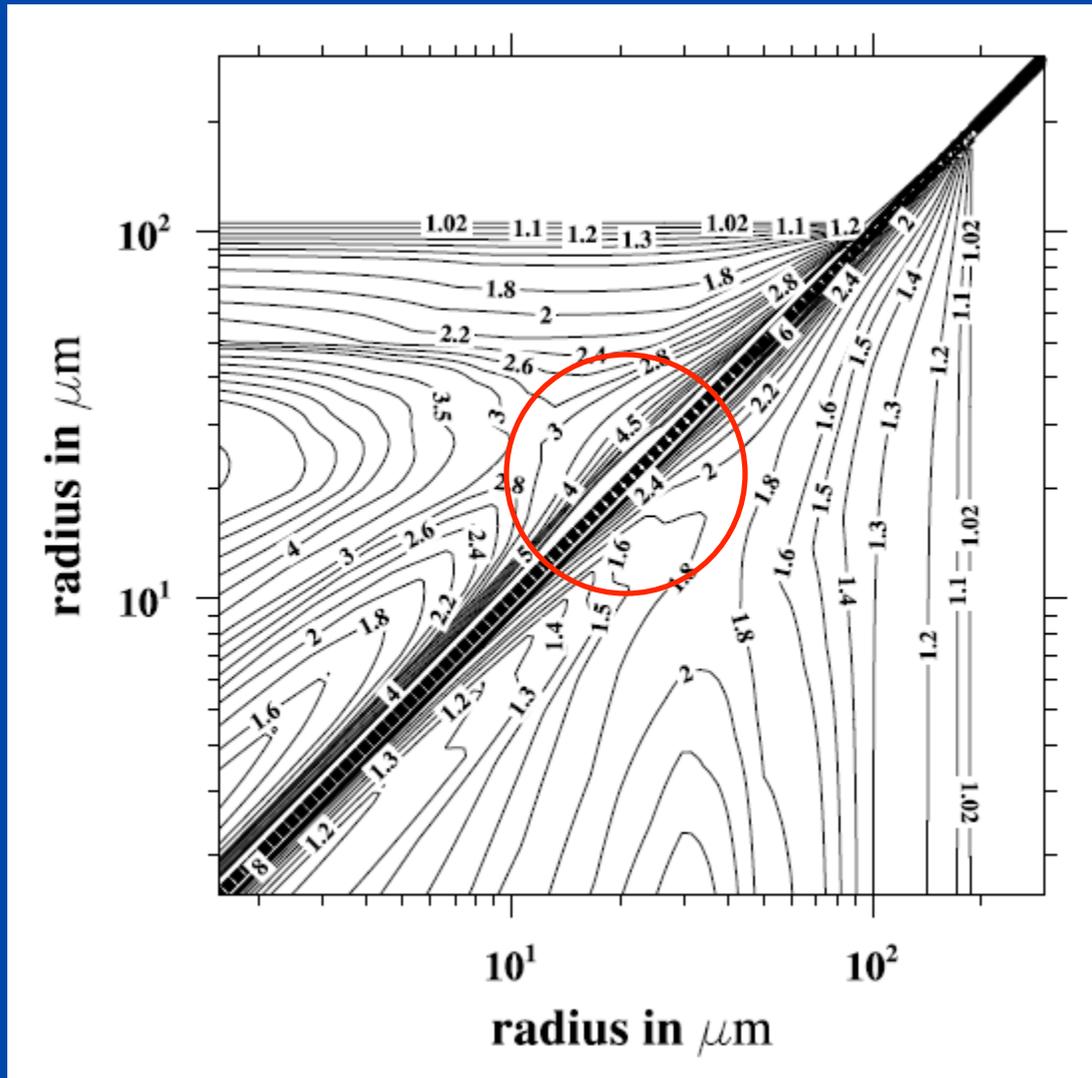
Background turbulent flow

Disturbance flows due to droplets



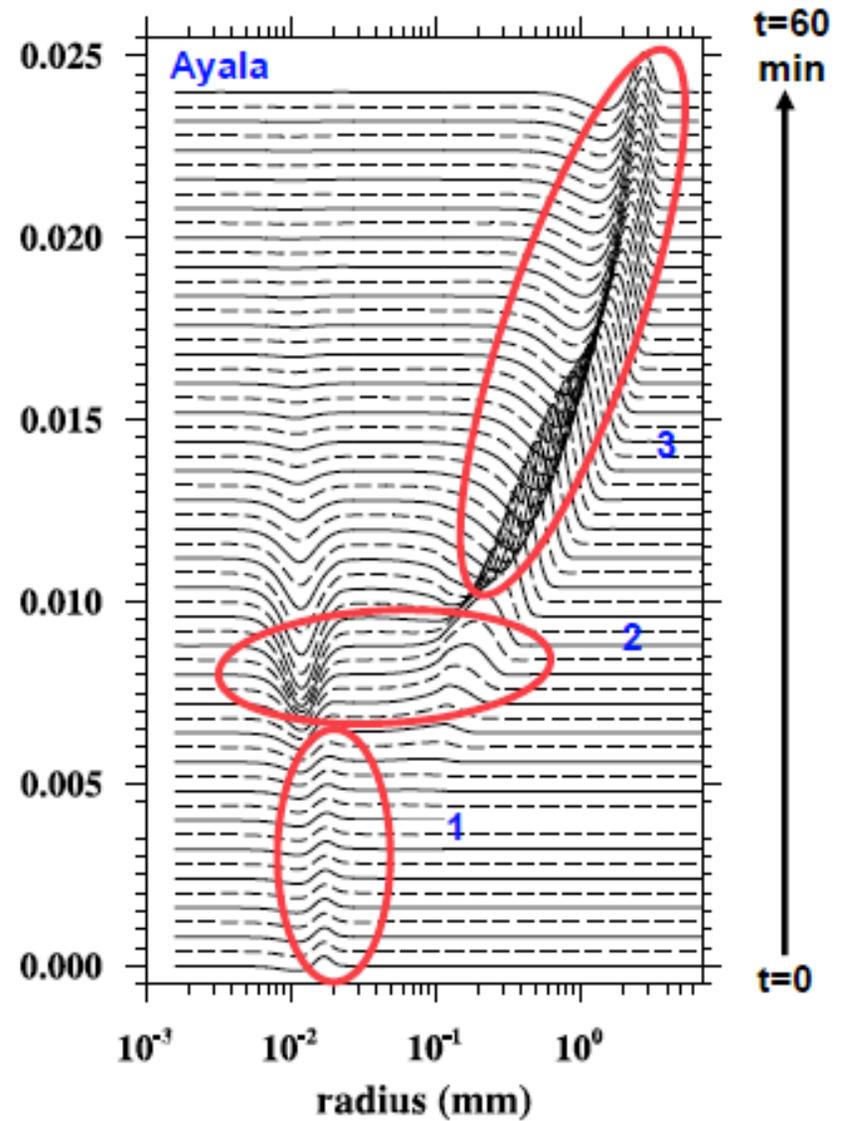
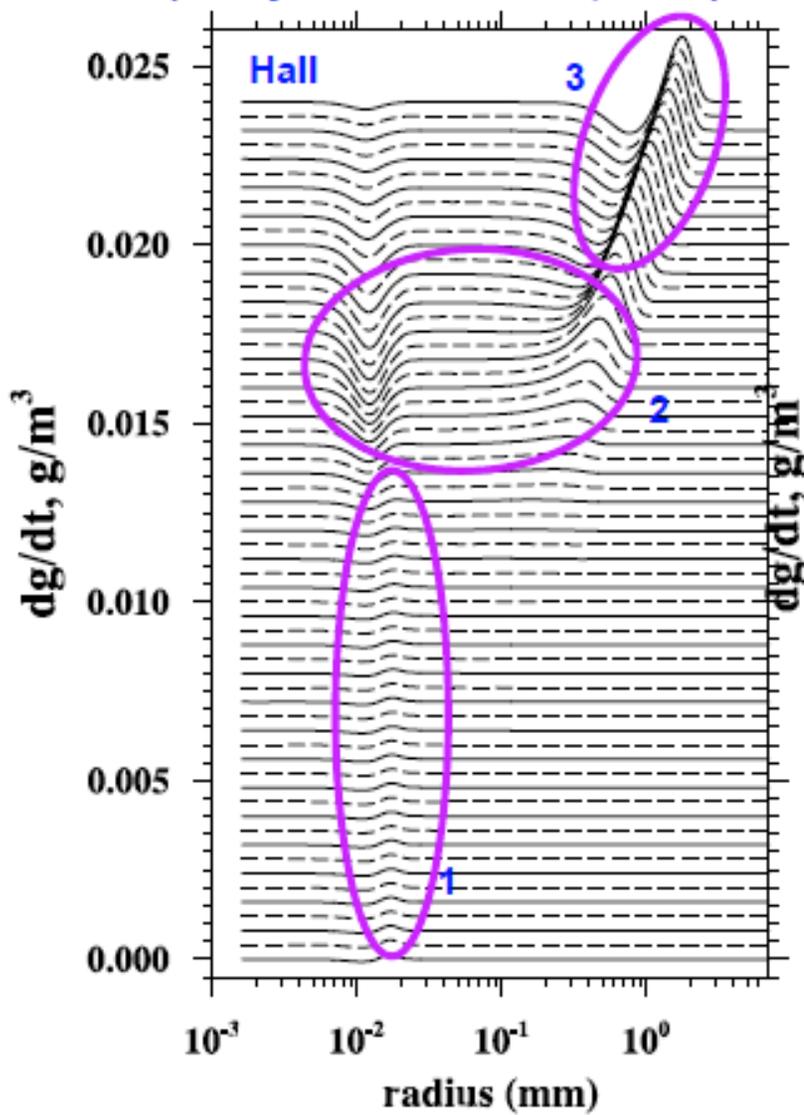
Features: Background turbulent flow can affect the disturbance flows;  
No-slip condition on the surface of each droplet is satisfied on average;  
Both near-field and far-field interactions are considered.

Wang, Ayala, and Grabowski, *J. Atmos. Sci.* **62**: 1255-1266 (2005).  
Ayala, Wang, and Grabowski, *J. Comp. Phys.* **225**: 51-73 (2007).



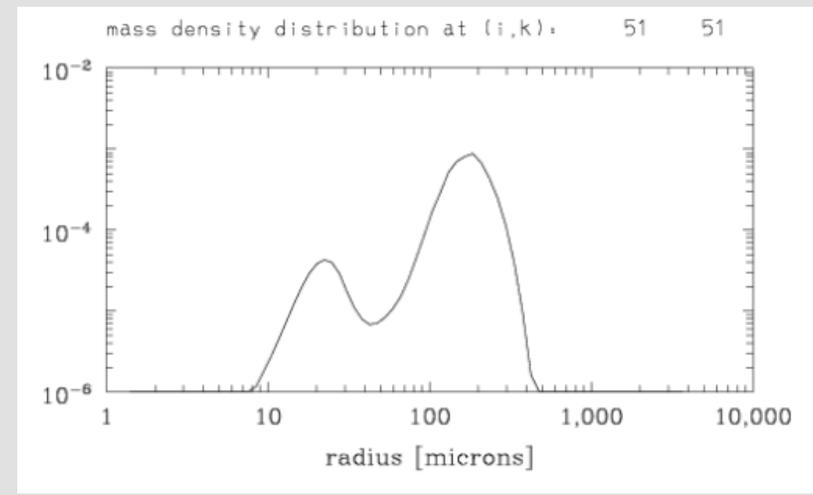
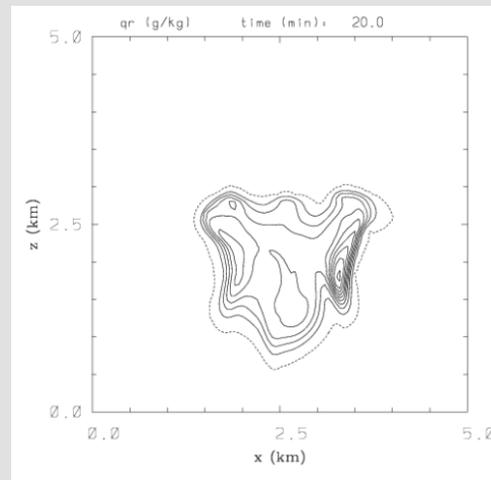
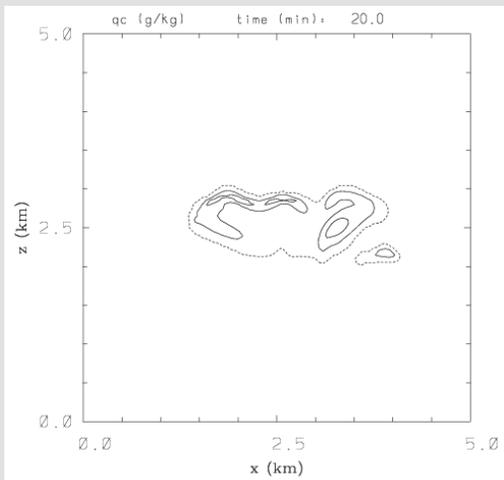
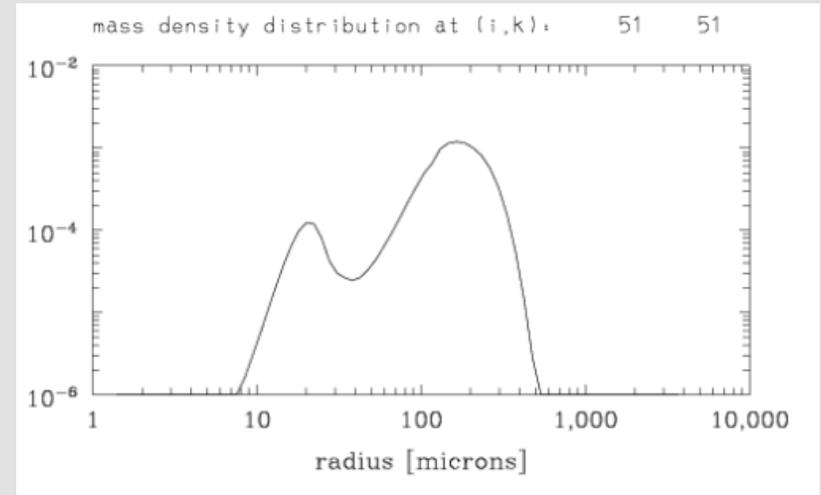
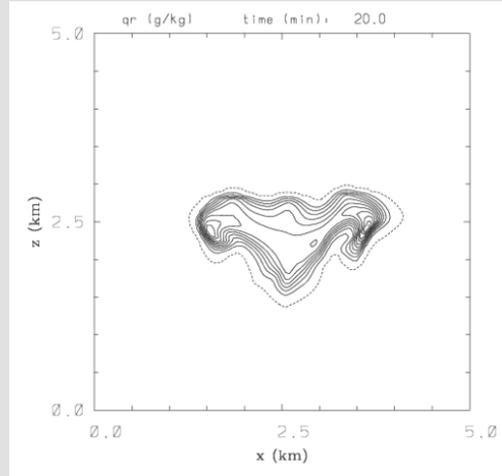
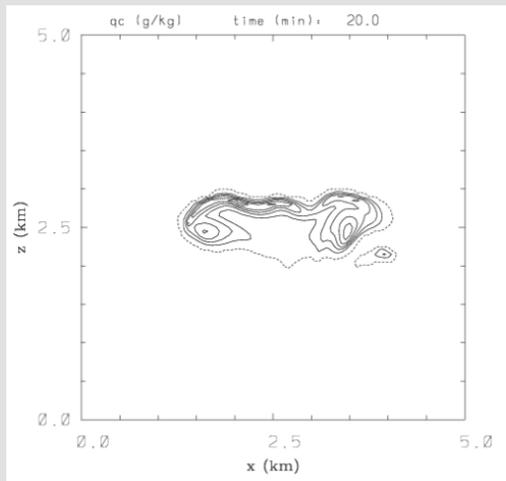
Enhancement factor for the collision kernel (the ratio between turbulent and gravitation collision kernel in still air) including turbulent collision efficiency;  $\varepsilon = 100$  and  $400 \text{ cm}^2 \text{ s}^{-3}$ .

1. Autoconversion; 2. Accretion; 3. Hydrometeor self-collection  
(Berry and Reinhardt, 1974)



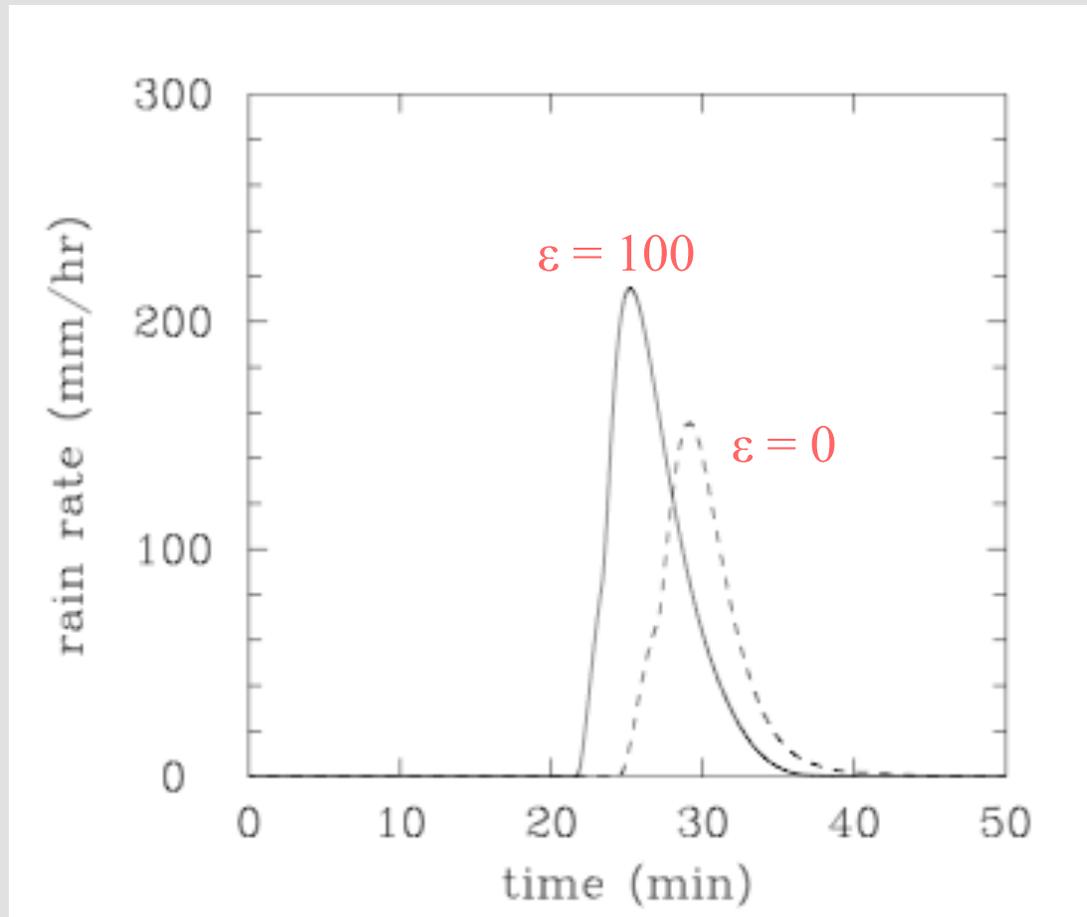
## 2D simulation of a small precipitating “cloud”: $t=20$ min

*no turbulence*

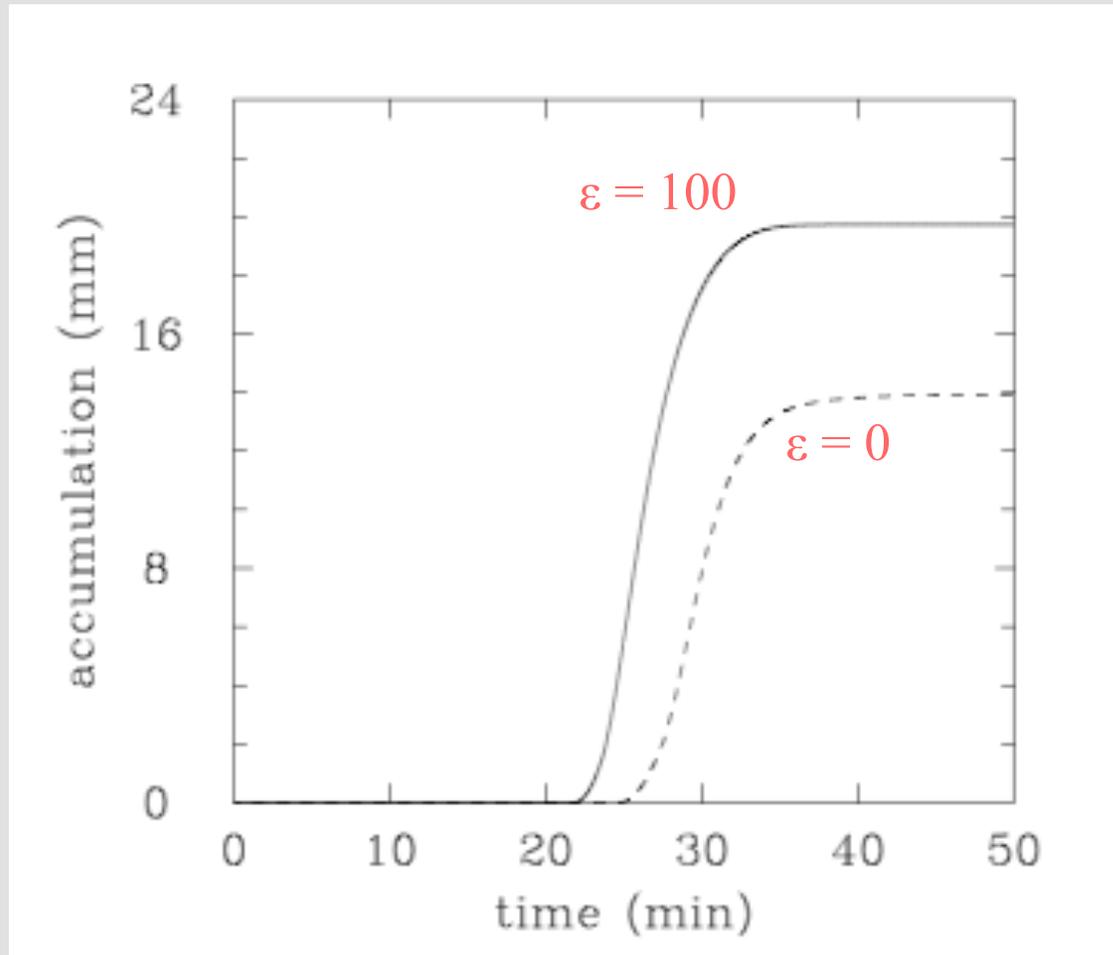


*with turbulence – Ayala kernel with  $100 \text{ cm}^2\text{s}^{-3}$*

Time evolution of the surface precipitation intensity:  
turbulent collisions lead to earlier rain at the ground and  
higher peak intensity...



...but also to more rain at the surface. This implies higher precipitation efficiency!



*Cloud turbulence seems to have **appreciable** effect on droplet growth by **collision/coalescence**. This is a combination of the impact on the number of geometric collisions and on the collision efficiency.*

*In a single cloud, not only **rain tends to form earlier**, but also a turbulent cloud seem **to rain more**. More realistic numerical studies are needed to quantify this aspect – work in progress.*

# Simulation of boundary layer clouds with double-moment microphysics and microphysics-oriented subgrid-scale modeling

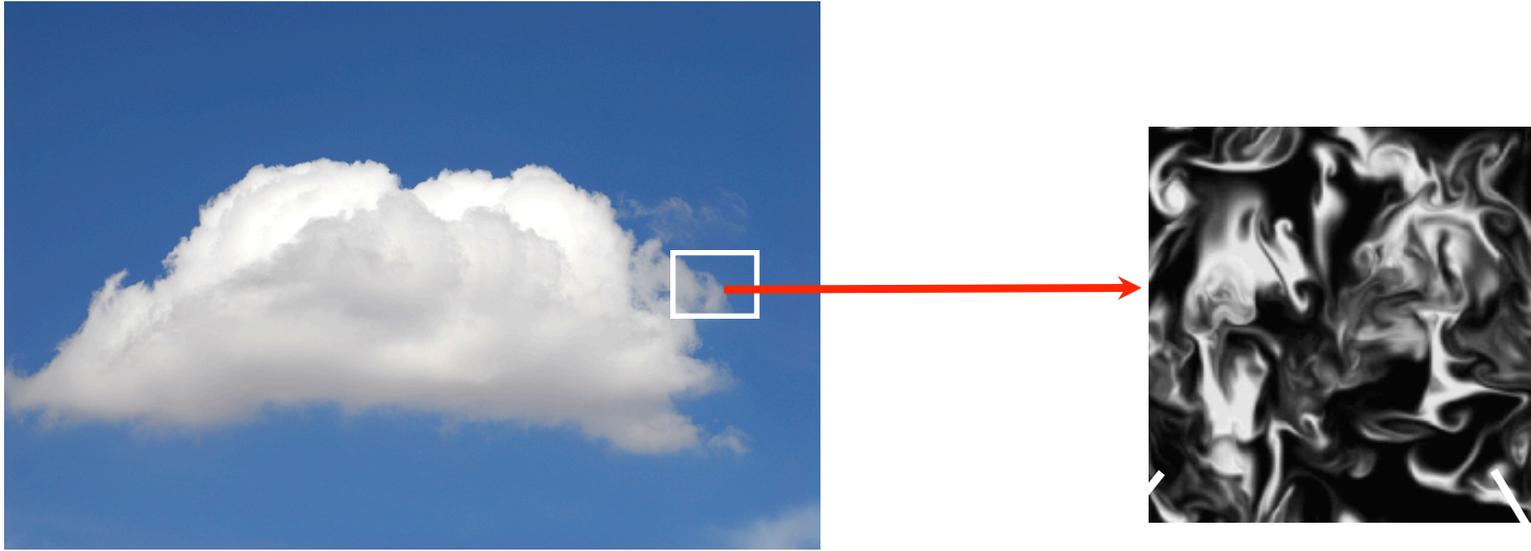


Dorota Jarecka<sup>1</sup>, W. W. Grabowski<sup>2</sup>,  
H. Morrison<sup>2</sup>, H. Pawlowska<sup>1</sup>

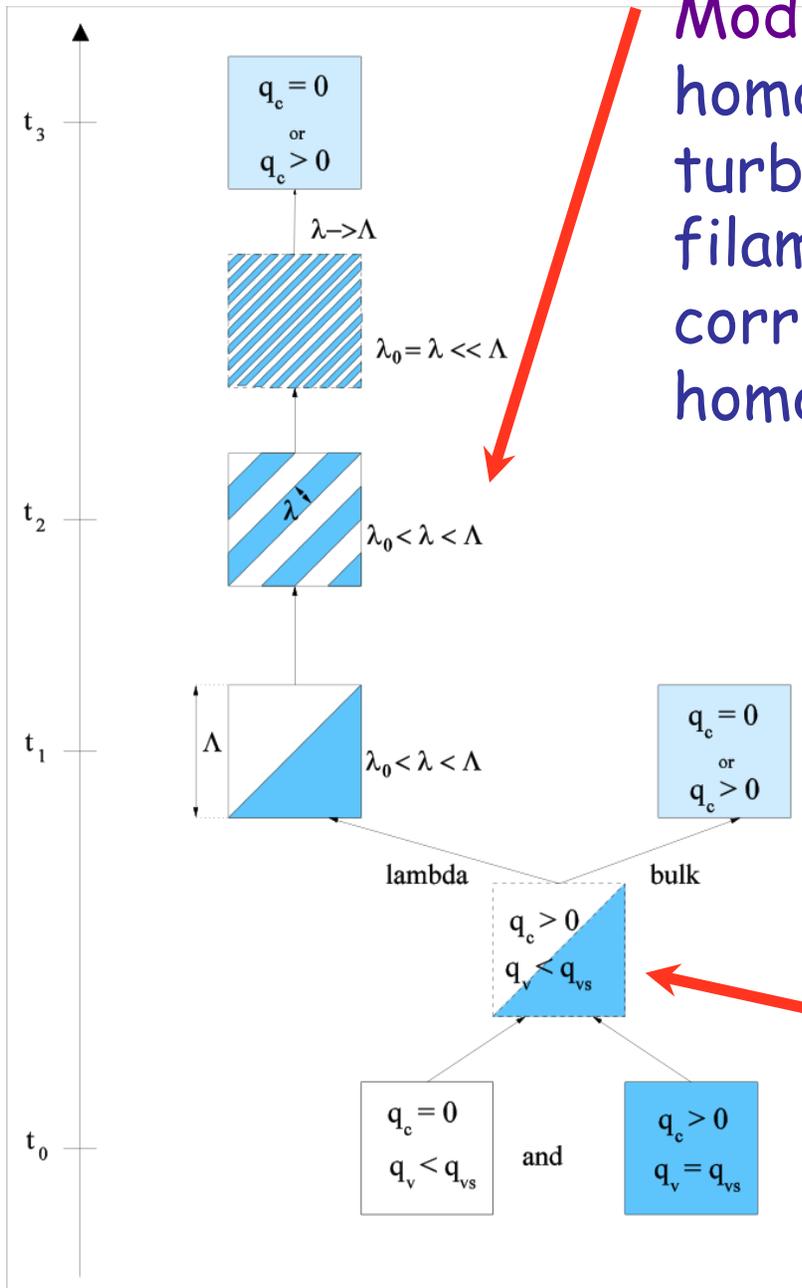
<sup>1</sup> Institute of Geophysics, Faculty of Physics,  
University of Warsaw, Poland

<sup>2</sup> National Center for Atmospheric Research, USA

# Turbulent cloud-environment mixing



Microphysical transformations due to subgrid-scale mixing are not instantaneous...



Modified model with  $\lambda$  approach:  
 homogenization delayed until  
 turbulent stirring reduces the  
 filament width  $\lambda$  to the value  
 corresponding to the microscale  
 homogenization scale  $\lambda_0$

Bulk model:  
 immediate  
 homogenization

*mixing event*

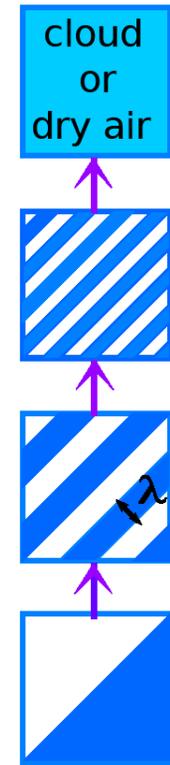
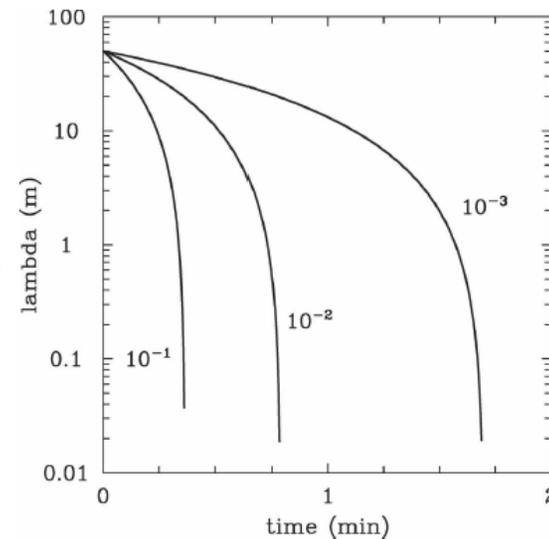
$\lambda$  - spatial scale of the cloudy filaments during turbulent mixing

$$\frac{d\lambda}{dt} = -\gamma \epsilon^{\frac{1}{3}} \lambda^{\frac{1}{3}}$$

$$\lambda_0 \leq \lambda \leq \Lambda$$

$\Lambda$  - the model gridlength;  
 $\lambda_0$  - the homogenization scale ( $\sim 1$  mm).

$\gamma \sim 1$   
 $\epsilon$  - the dissipation rate of TKE



Broadwell and Breidenthal (1982); Grabowski (2007)

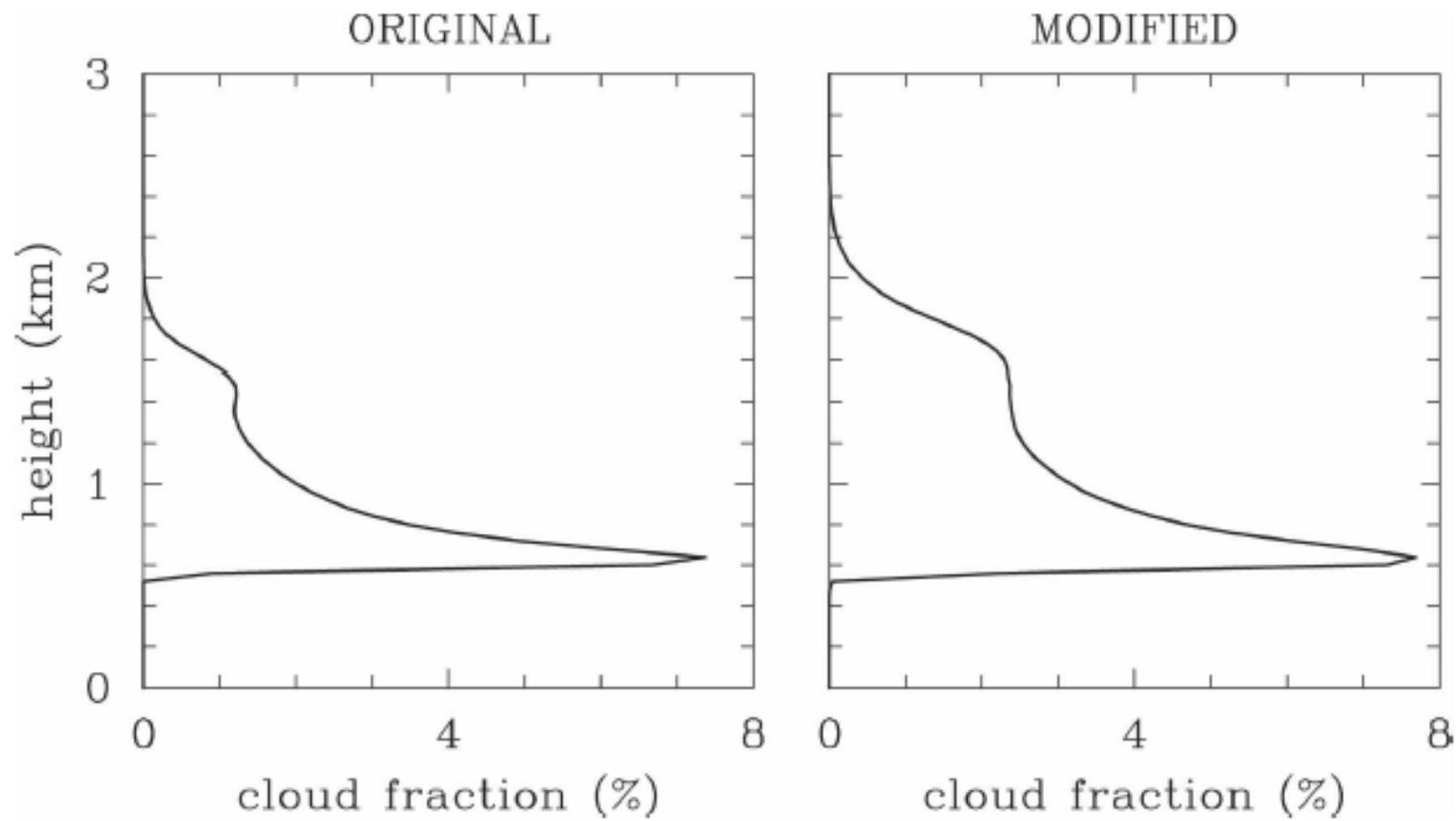
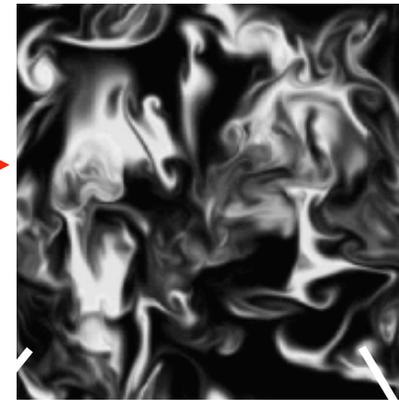
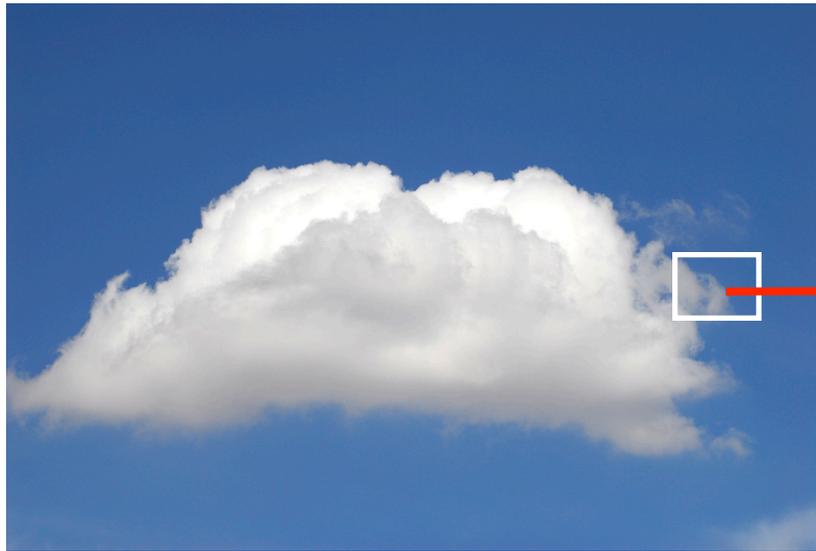


FIG. 9. Profiles of the cloud fractions (4-h averages) in BOMEX simulations using either the (left) original or (right) modified approaches.

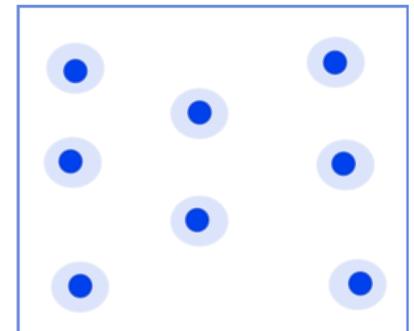
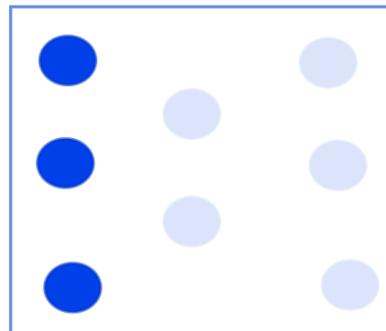
# Turbulent cloud-environment mixing



extremely  
inhomogeneous  
mixing

homogeneous  
mixing

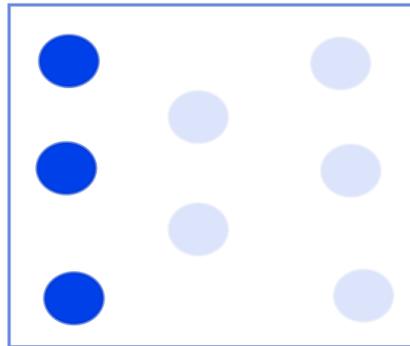
Microphysical  
transformations due to  
subgrid-scale mixing  
cover a wide range of  
mixing scenarios.



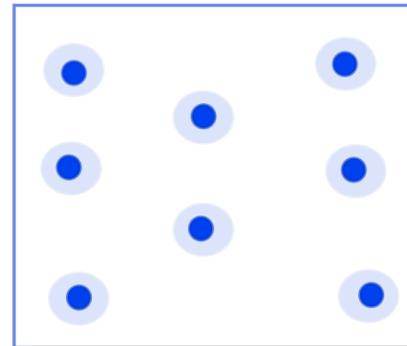
## 2-moment microphysics - mixing scenarios

$$N_f = N_i \left( \frac{q_f}{q_i} \right)^\alpha$$

$\alpha = 1$   
extremely  
inhomogeneous  
mixing



$\alpha = 0$   
homogeneous  
mixing



Previous studies (Slawinska et al. 2010):  $\alpha = \text{const}$  for entire simulation to contrast results with different mixing scenarios.

# Using DNS results for predicting $\alpha$

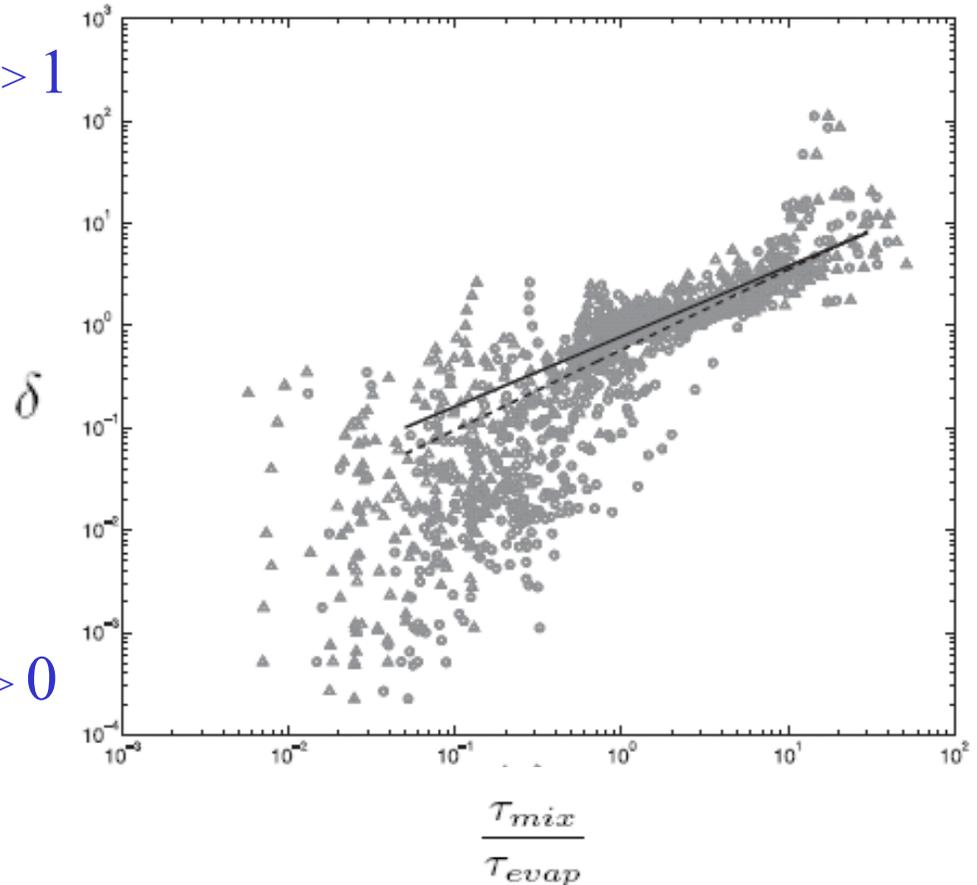
$$\tau_{mix} = \frac{\lambda}{u(\lambda)} = \frac{\lambda^{\frac{2}{3}}}{TKE^{\frac{1}{2}} * \Lambda^{\frac{1}{3}}}$$

$$\tau_{evap} = \frac{r^2}{A * (1 - RH_d)}$$

$\alpha \rightarrow 1$

$\alpha \rightarrow 0$

$$\alpha = f(\lambda, TKE, RH_d, r)$$



We can calculate  $\alpha$  locally as a function of these parameters !!

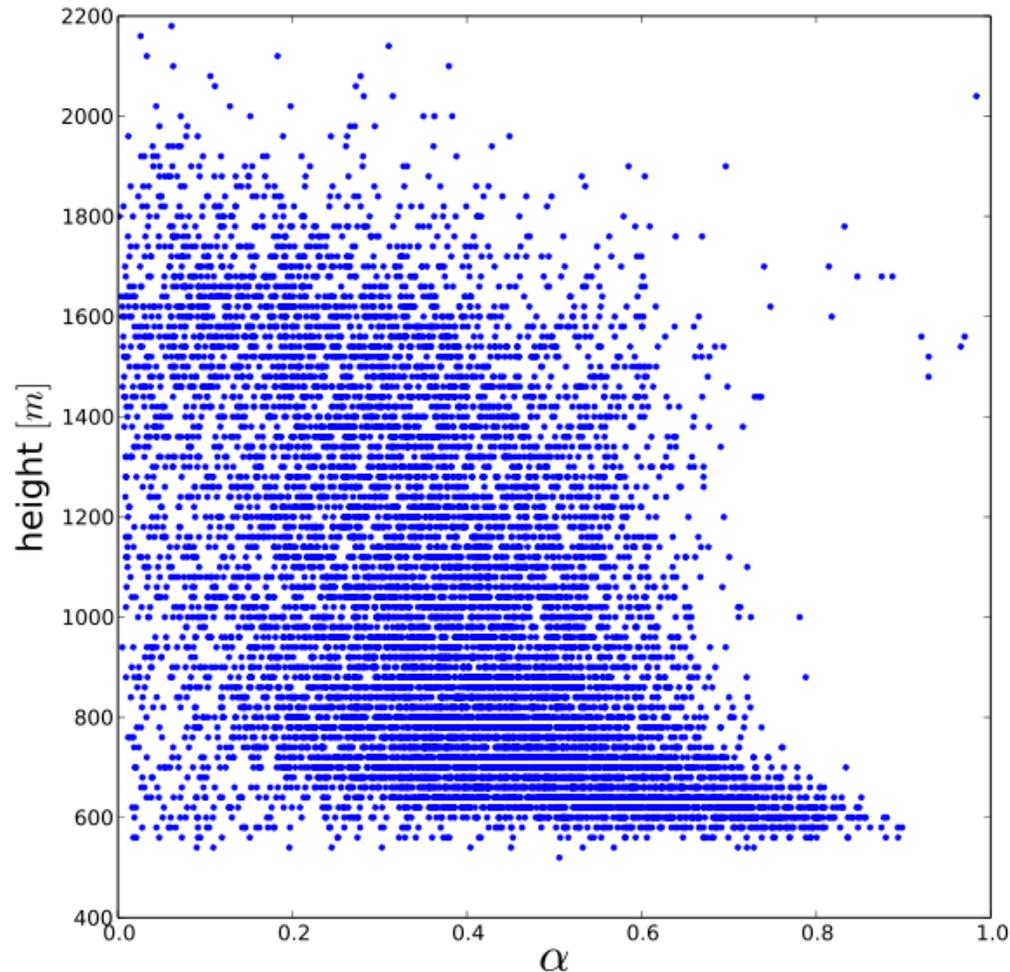
# Model and model setup

3D numerical model EULAG [www.mmm.ucar.edu/eulag/](http://www.mmm.ucar.edu/eulag/)  
with the 2-moment warm-rain microphysics scheme

## Simulation setup - BOMEX (Siebesma et al. 2003)

- Domain: 6.4km, 6.4km, 3km
- Grid size: 50m, 50m, 20m
- Time step: 1s
- Initial profiles from Siebesma et al. 2003

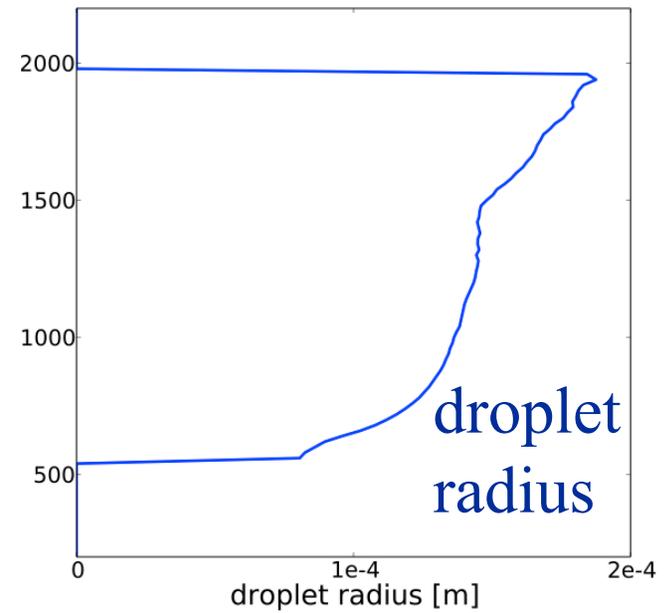
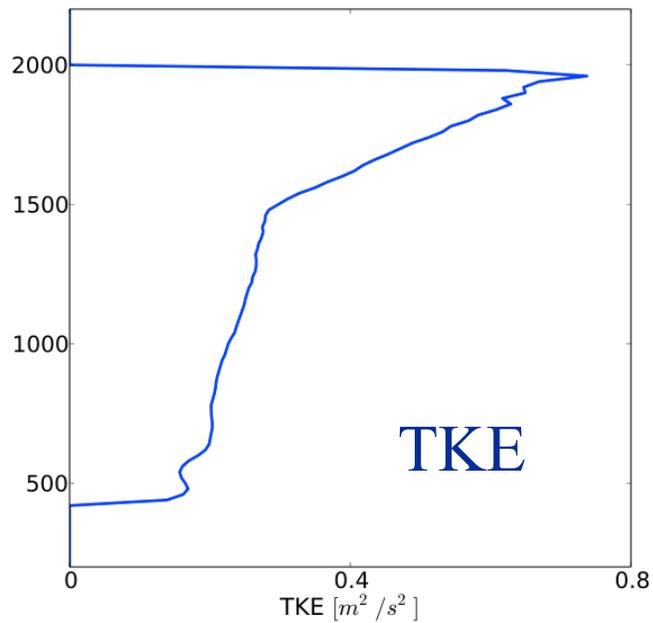
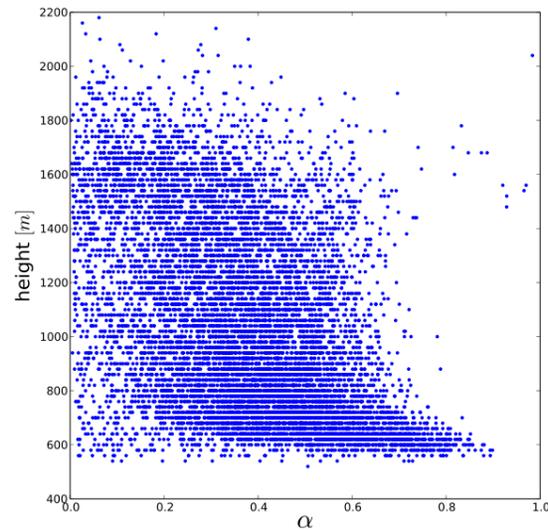
# Changes of the parameter $\alpha$ with height



homogeneous  
mixing

extremely  
inhomogeneous mixing

# Vertical profiles of $\alpha$ , droplet radius and TKE



Predicting scale of cloudy filaments  $\lambda$  allows representing in a simple way progress of the turbulent mixing between cloudy air and entrained dry environmental air.

Parameter  $\alpha$  (and thus the mixing scenario) can be predicted as a function of  $\lambda$ , TKE, RH, and droplet radius  $r$ .

In BOMEX simulations,  $\alpha$  decreases with height on average, i.e., the mixing becomes more homogeneous. This is consistent with both TKE and droplet radius increasing with height.

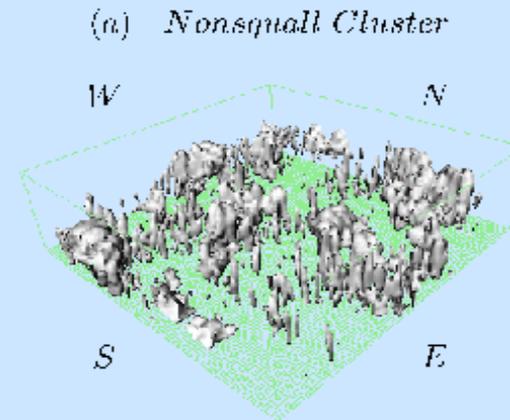


# Cloud-resolving modeling of GATE cloud systems (Grabowski et al. JAS 1996)

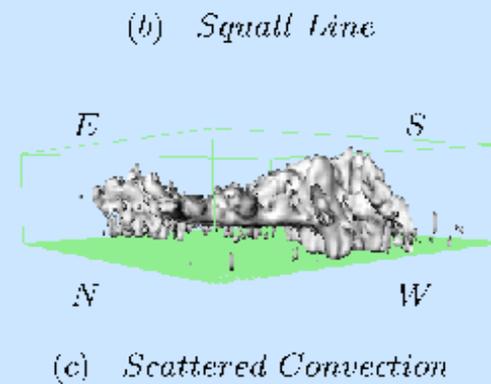
400 x 400 km  
horizontal domain,  
doubly-periodic,  
2 km horizontal grid  
length

Driven by observed  
large-scale conditions

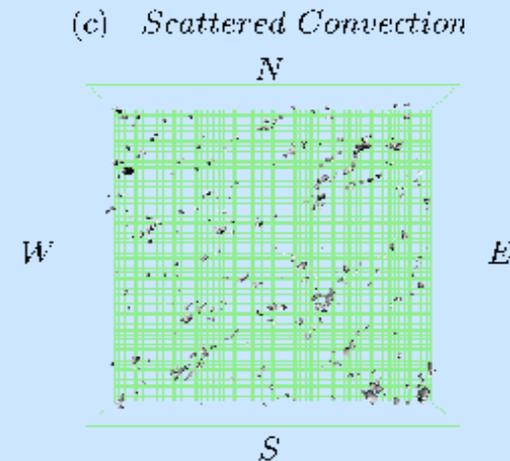
2 Sept, 1800 Z



4 Sept, 1800 Z



7 Sept, 1800 Z



Grabowski et al. JAS 1998:

“...low resolution two-dimensional simulations can be used as realizations of tropical cloud systems in the climate problem and for improving and/or testing cloud parameterizations for large-scale models...”

- *Can we use 2D cloud-resolving model (CRM) in all columns of a climate model to represent deep convection?*
- *Can we move other parameterizations (radiative transfer, land surface model, etc) into 2D CRM to couple physical processes at their native scales?*

# Cloud-Resolving Convection Parameterization (CRCP) (super-parameterization, SP)

Grabowski and Smolarkiewicz, *Physica D* 1999

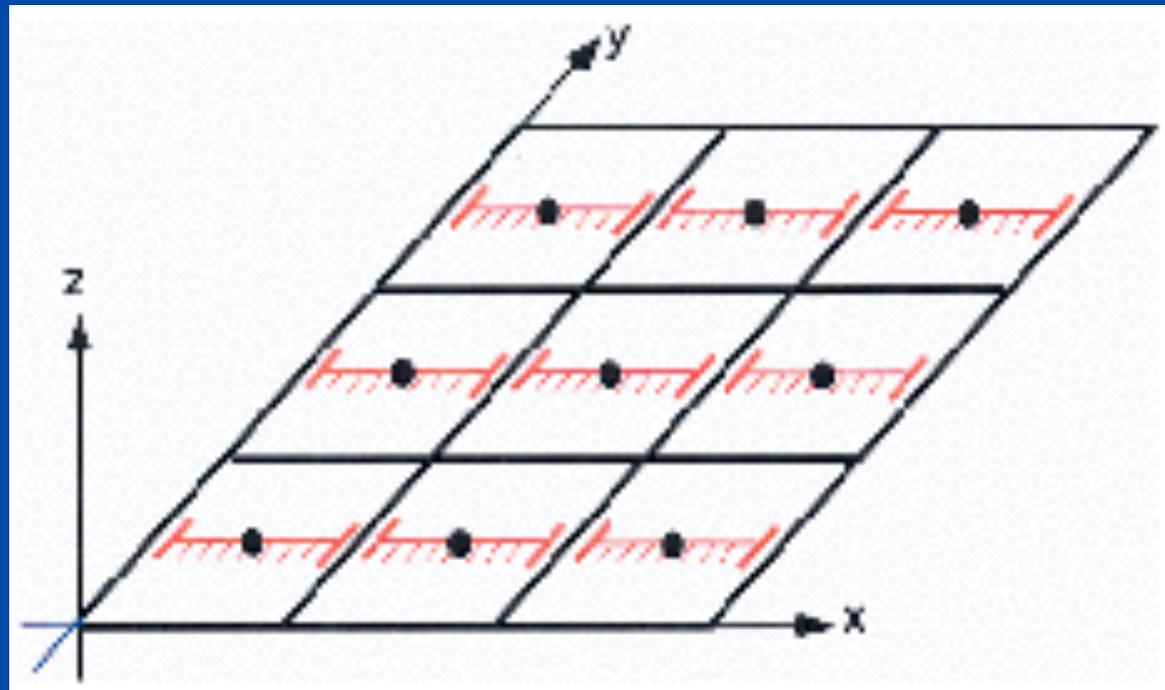
Grabowski, *JAS* 2001; Khairoutdinov and Randall *GRL* 2001;

Randall et al., *BAMS* 2003

The idea is to represent subgrid scales of the 3D large-scale model (horizontal resolution of 100s km) by embedding periodic-domain 2D CRM (horizontal resolution around 1 km) in each column of the large-scale model

*Another (better?) way to think about CRCP: CRCP involves hundreds or thousands of 2D CRMs interacting in a manner consistent with the large-scale dynamics*

# Original CRCP proposal



- CRCP is a “parameterization” because scale separation between large-scale dynamics and cloud-scale processes is assumed; cloud models have periodic horizontal domains and they communicate only through large scales.
- CRCP is “embarrassingly parallel”: a climate model with CRCP can run efficiently on 1000s of processors.
- CRCP is a physics coupler: most (if not all) of physical (and chemical, biological, etc.) processes that are parameterized in the climate model can be included into CRCP framework.

# The effects of anthropogenic aerosols as simulated by the SP-CAM with two-moment microphysics

**Marat Khairoutdinov**

State University of New York @ Stony Brook  
Long Island, New York

**Wojciech Grabowski**  
**Hugh Morrison**

National Center for Atmospheric Research  
Boulder, Colorado



Center for Multiscale Modeling of Atmospheric Processes  
**CMMAP**

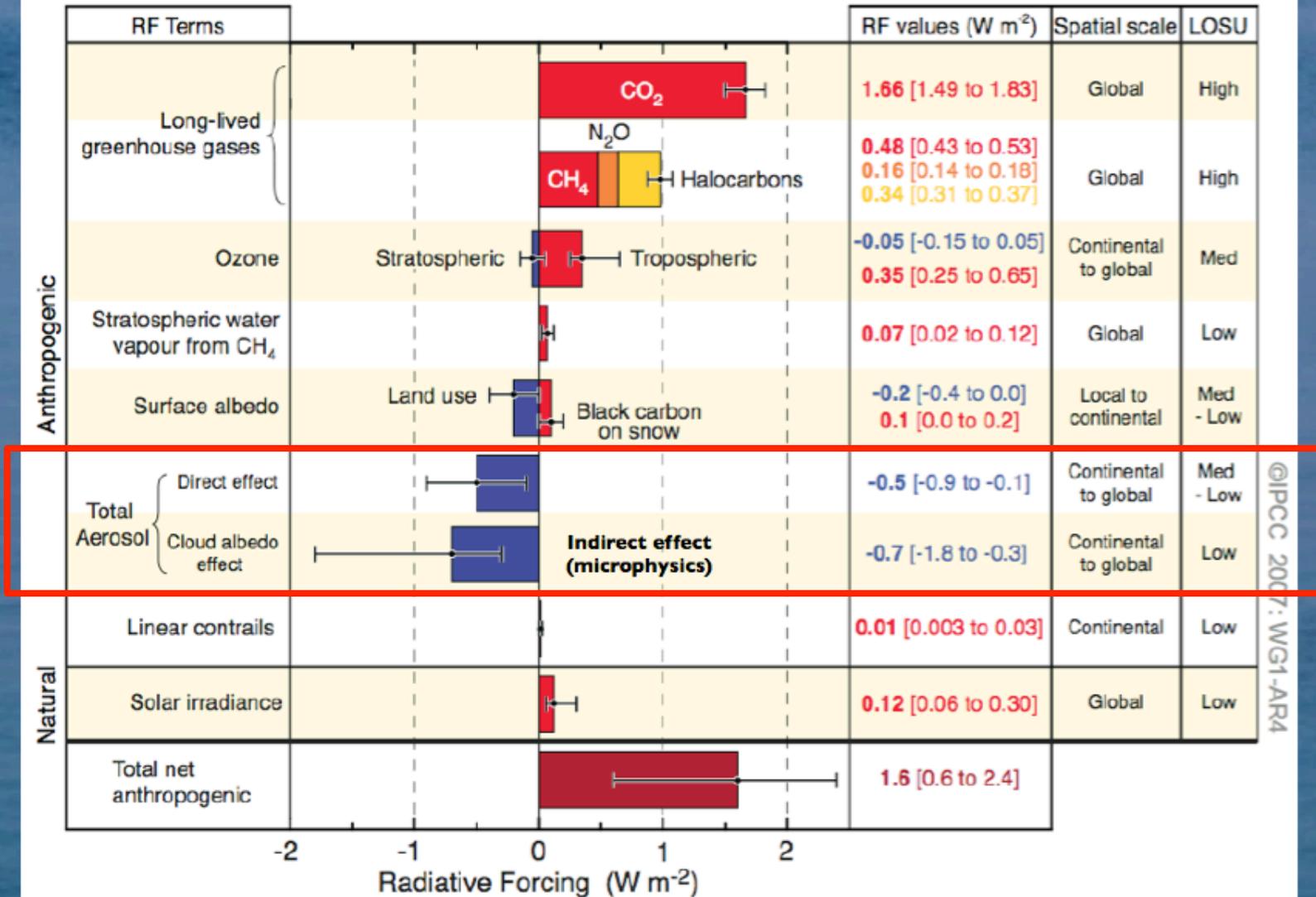
*Reach for the sky.*



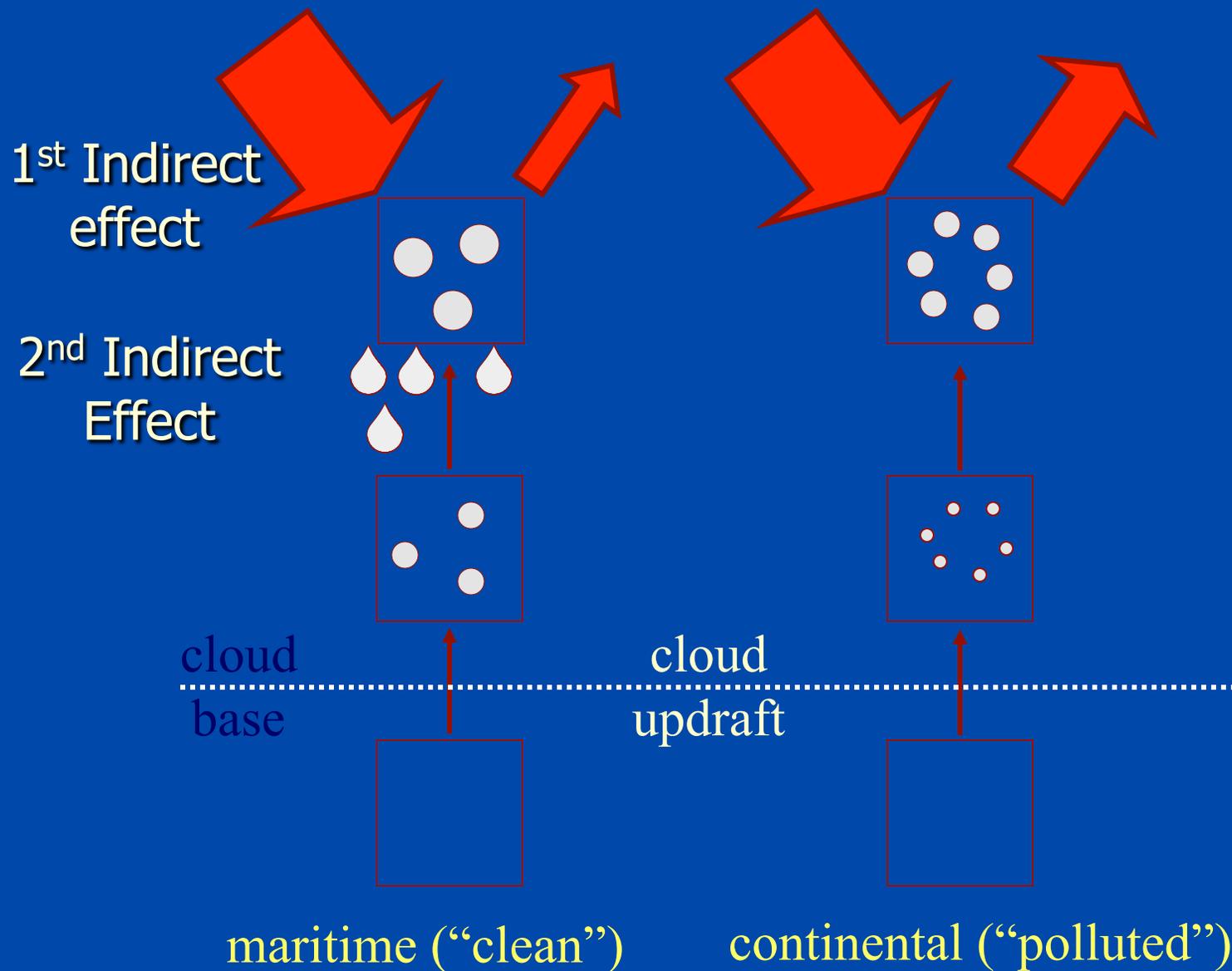
# Industrial Era Climate Change

Source: IPCC 4th Assessment Report (AR4)

## Radiative Forcing Components



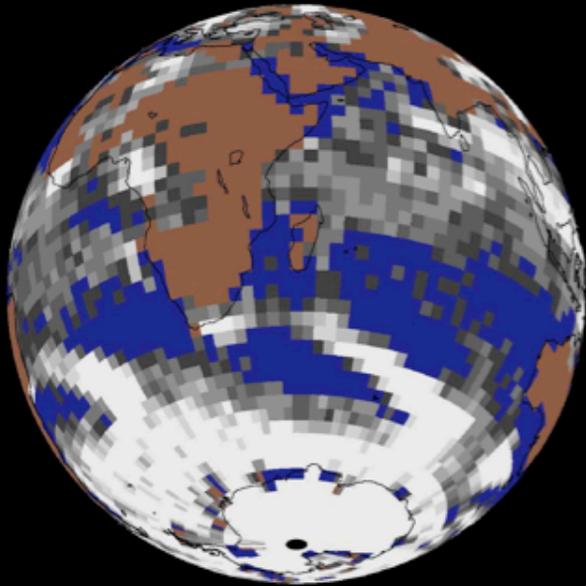
# Indirect aerosol effects (warm rain only)



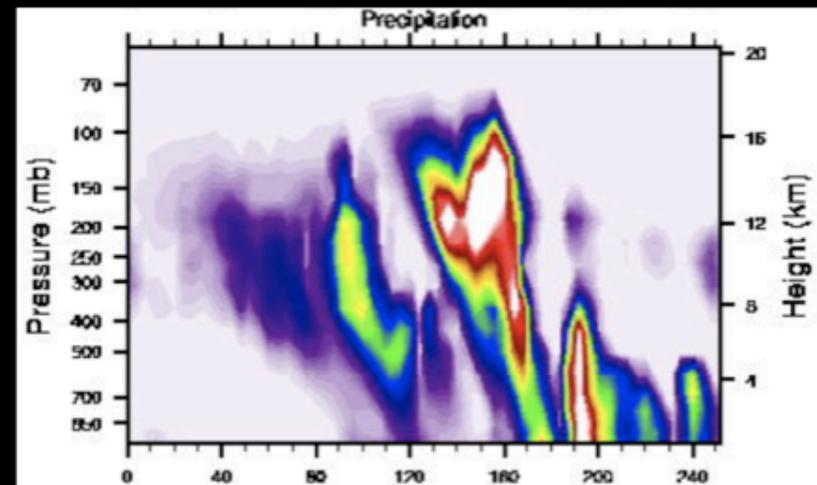
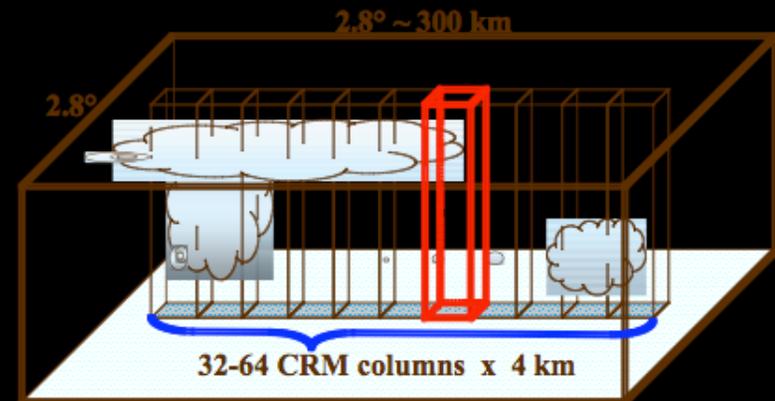
# Super-parameterized CAM: SP-CAM

## Multiscale Modeling Framework (MMF)

A copy of a CRM (a.k.a. “super-parameterization”) is run in each column of CAM GCM.



Each column of this has this



# Bulk Microphysics Schemes in System for Atmospheric Modeling - SAM CRM used as super-parameterization in SP-CAM

## Original One-Moment (Khairoutdinov and Randall 2003)

- 2 prognostic microphysics variables: total non-precipitating and precipitating water mixing ratios;
- Cloud liquid and ice water, rain, graupel and snow are diagnosed as  $f(T)$ ;
- Autoconversion to rain by simple Kessler formula;
- Cloud drop effective radius is prescribed
- **Indirect aerosol effect is not included.**

## Two-Moment (Morrison et al. 2005) Thanks to Peter Blossey for implementing it in SAM

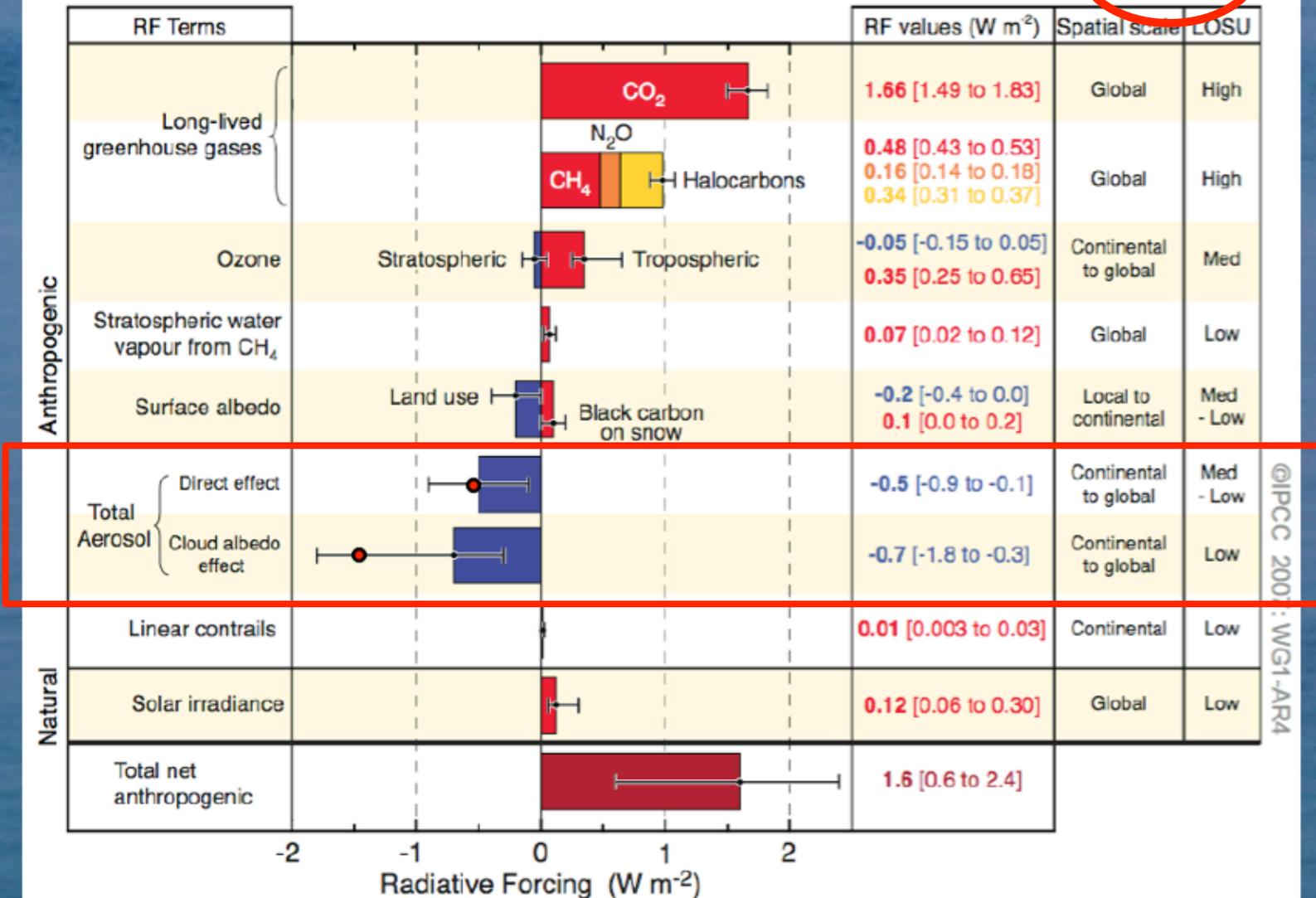
- 10 prognostic microphysics variables;
- Prognostic mixing ratio and concentration for 5 categories of water;
- Autoconversion depends on water content and concentration (KK 2000);
- Cloud Condensation nuclei (CCN) spectrum is prescribed;
- Cloud droplet effective radius is computed;
- **Indirect aerosol effects are included.**

# IPCC 4th Assessment Report (AR4)

## Industrial Era Climate Change

### Radiative Forcing Components

● SPCAM



## SUMMARY:

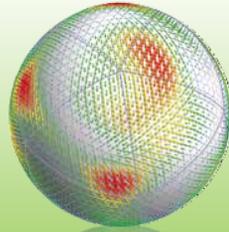
Resolving the entire range of spatial scales - from cloud microscale to climate - will never be possible in numerical models.

For processes near each of the scale discussed here, there are multiscale interactions that still cannot be resolved by the “direct numerical simulation” approach.

## SUMMARY, cont:

Knowledge developed at one scale can be subsequently used in modeling larger scales. For instance, the impact of small-scale turbulence on droplet growth can be parameterized in LES models, where small-scale turbulent motions are not resolved. LES studies can guide development of subgrid-scale parameterizations that need to be included in lower-spatial-resolution models.

This is the concept of “hierarchical” approach, the only hope to cover the entire range of scales relevant to climate.



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