

The background of the slide is an aerial photograph. In the upper left, the wing and tail of a white aircraft are visible against a blue sky with scattered white clouds. Below the sky, a wide river flows through a city. The city features a mix of green spaces, buildings, and industrial areas. In the lower right, several large white storage tanks are visible. The overall scene is a high-angle view of a coastal or riverine urban area.

# Physically-Based Parameterization of Cloud Droplet Formation

**Athanasios Nenes**

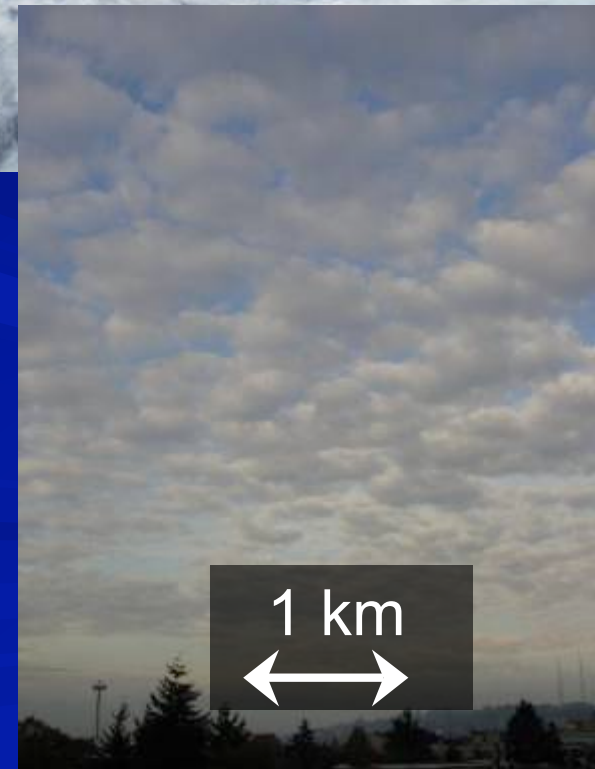
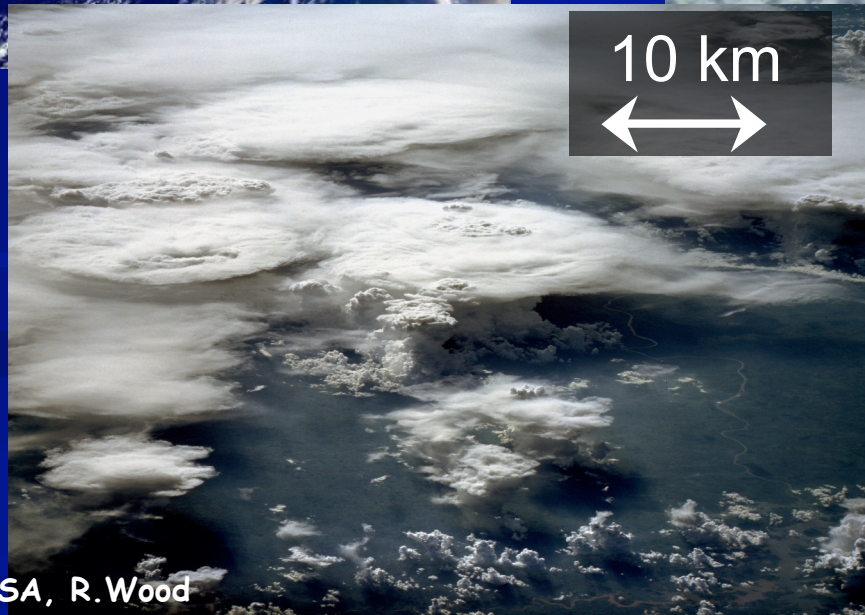
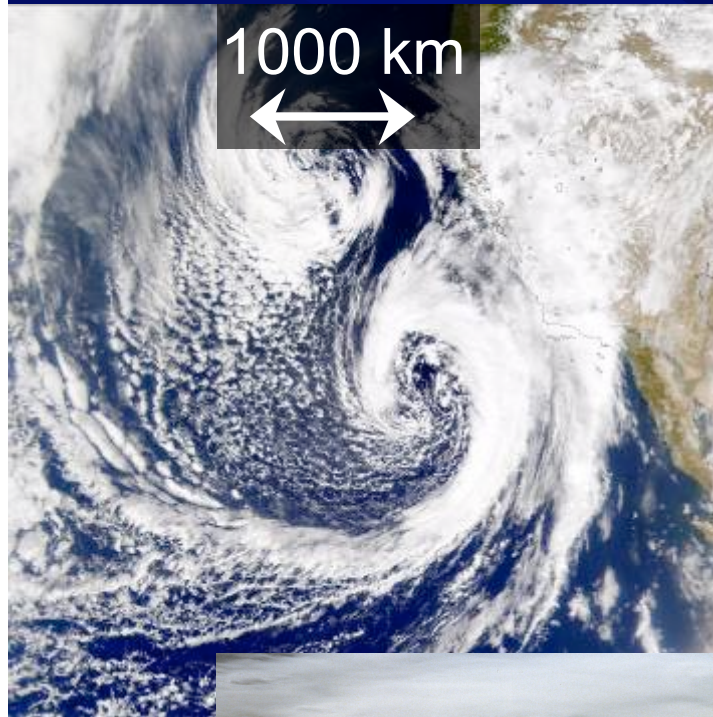
School of Earth & Atmospheric Sciences  
School of Chemical & Biomolecular Engineering  
Georgia Institute of Technology

Workshop on Aerosol-Climate Interactions  
Hurghada, Egypt, February 11, 2008

Acknowledgments: NASA, NSF, NOAA, ONR  
Nenes Group, Seinfeld/Flagan Group, Adams Group, CIRPAS

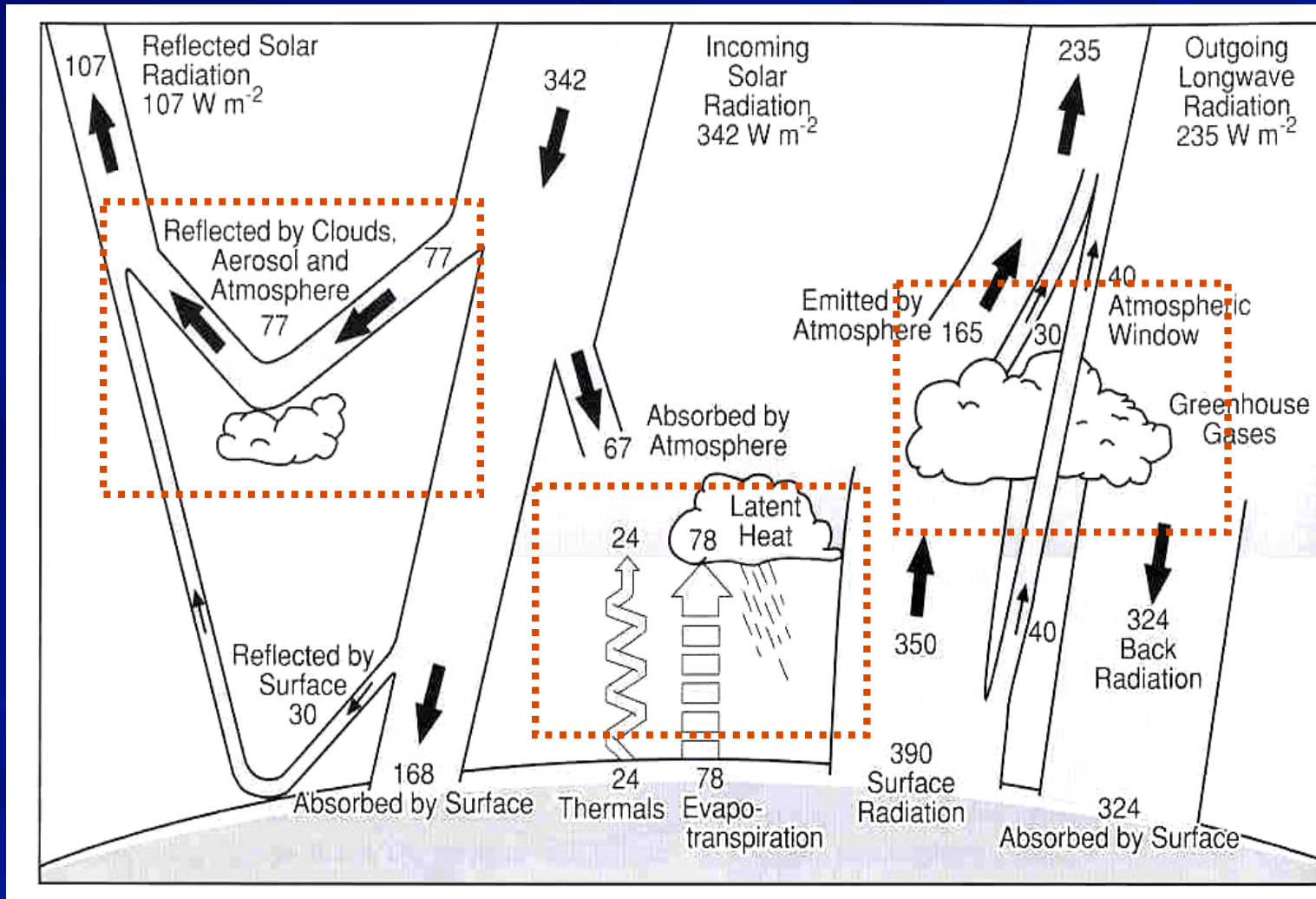


# Clouds are everywhere and found at all scales...



Photos: NASA, R. Wood

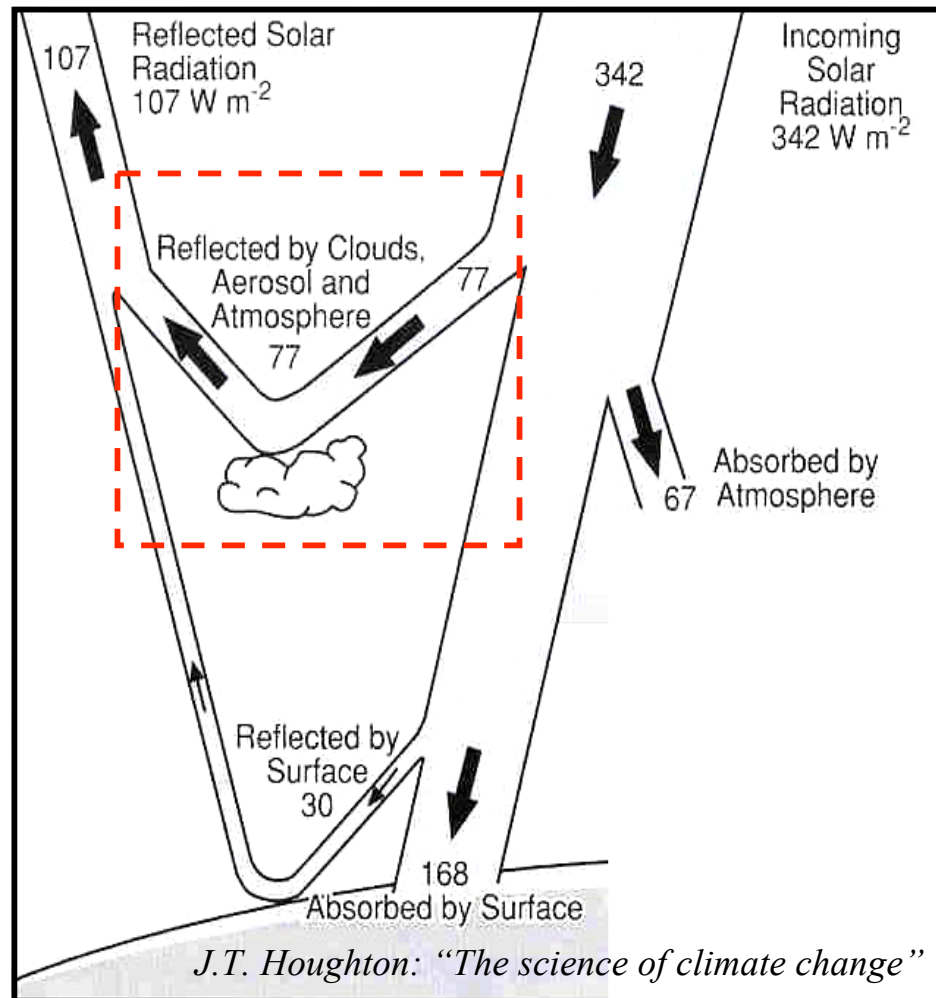
# Clouds play a central role in the climate system



*J.T. Houghton: "The science of climate change"*



# Clouds: major contributor to SW global albedo



## *Facts:*

- Clouds account for ~50% of planetary reflectivity (albedo).
- Small changes in clouds yield large changes in global energy balance.
- 1% increase in global cloud cover can counteract warming from greenhouse gases.

## *Consequence:*

**Understanding cloud formation is required for assessments of climate change.**

*Clouds are VERY dynamic (difficult to simulate).*



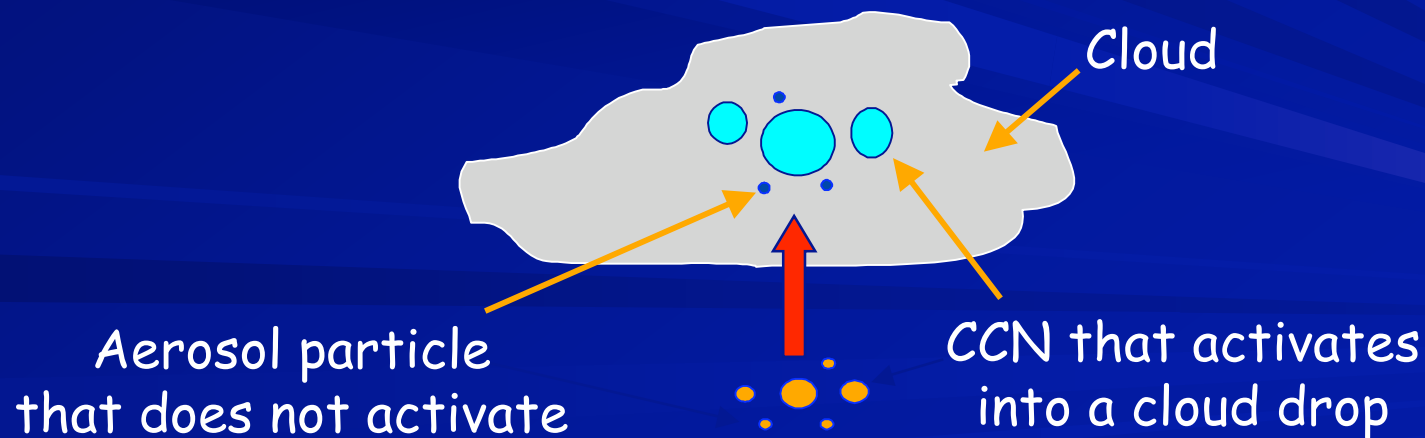
# How do (liquid water) clouds form?

Clouds form in regions of the atmosphere where there is too much water vapor (it is "supersaturated").

This happens when air is cooled (primarily through expansion in updraft regions and radiative cooling).

Cloud droplets nucleate on pre-existing particles found in the atmosphere (aerosols). This process is known as activation.

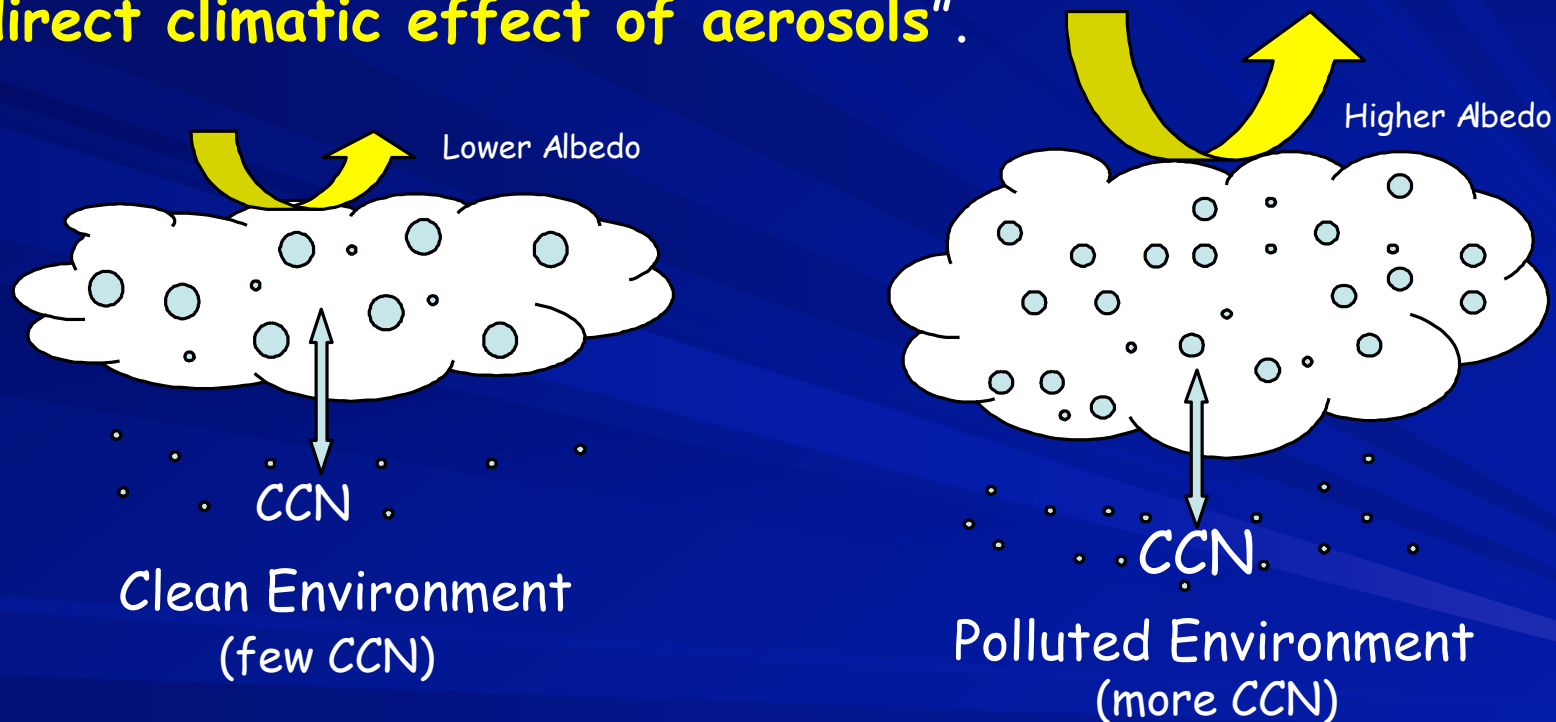
Aerosols that can become droplets are called cloud condensation nuclei (CCN).



# Can humans affect clouds and the hydrological cycle?

Yes! By changing global CCN concentrations.

**Result:** Clouds that are "whiter", precipitate less (persist longer) and potentially cover larger areas of the globe. This is thought to yield a net cooling on climate and is termed as the "**indirect climatic effect of aerosols**".



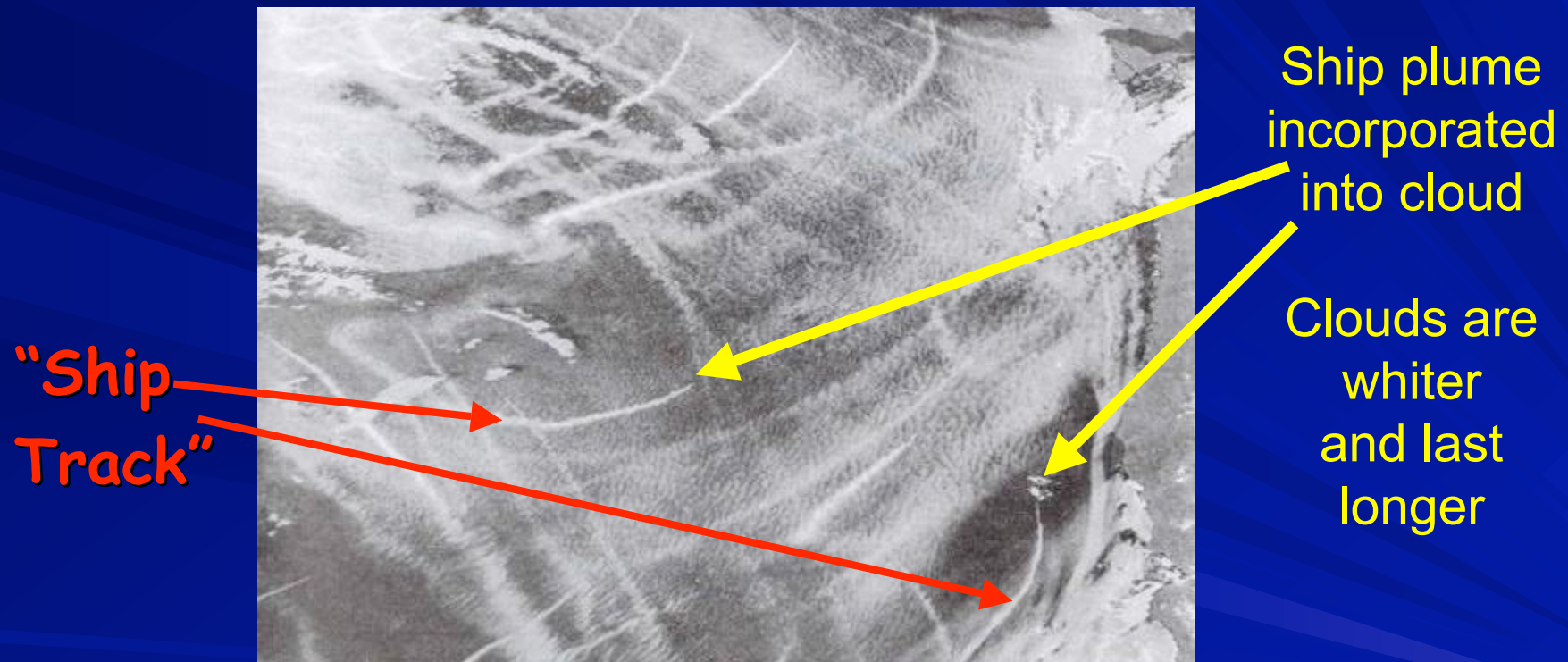
Increasing particles tends to cool climate (potentially alot).

Quantitative assessments done with climate models.



# Observational evidence of indirect effect

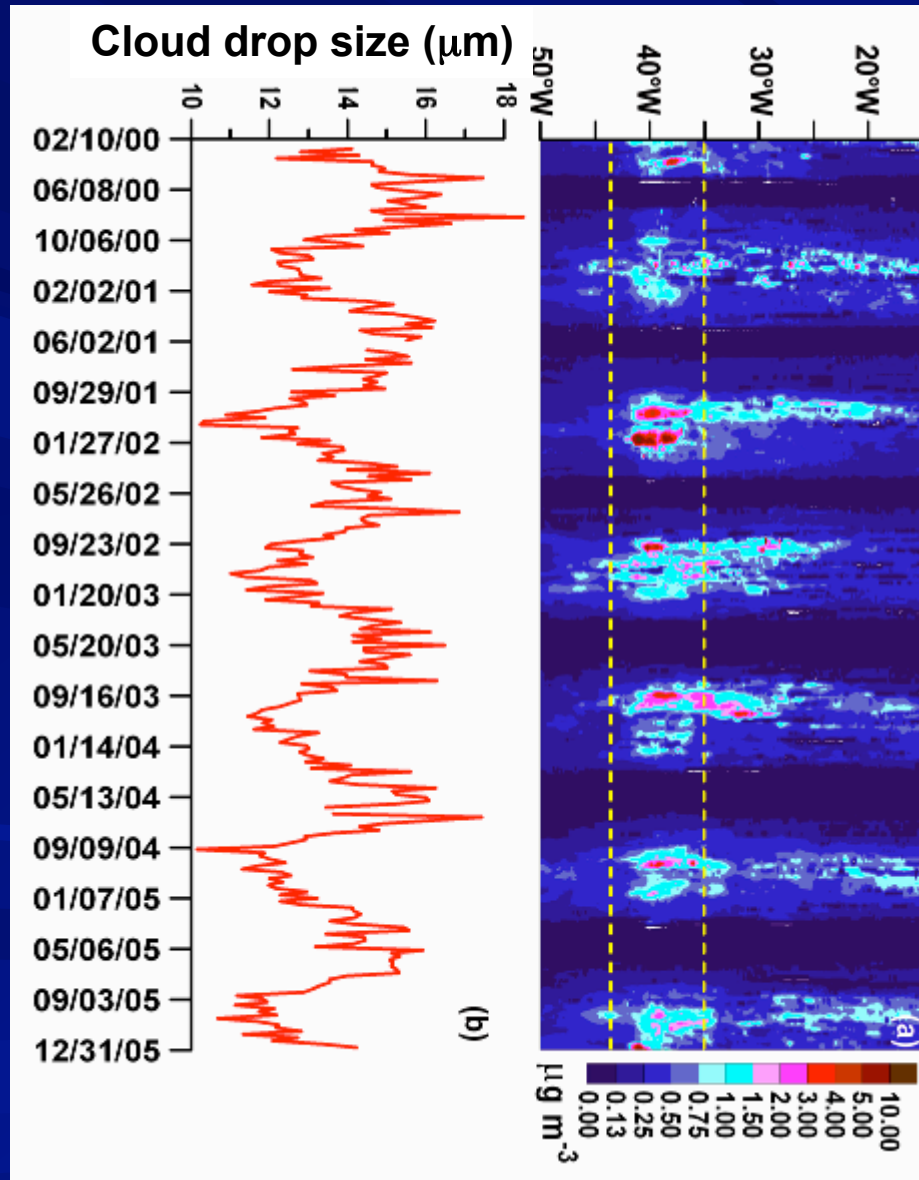
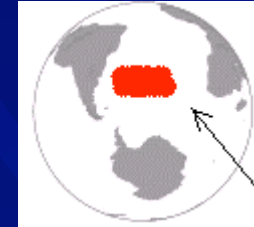
"Ship tracks": features of high cloud reflectivity embedded in marine stratus. A result of ship plumes affecting clouds above.



Pollution  $\uparrow$   $\Rightarrow$  Droplet number  $\uparrow$   $\Rightarrow$  Droplet size  $\downarrow$   
Droplet size  $\downarrow$   $\Rightarrow$  Cloud reflectivity  $\downarrow$  **AND** Precip  $\downarrow$

# Phytoplankton affect clouds too...

Location: East of Patagonia (South America)



← Low chlorophyll,  
cloud have large drops

← High Chlorophyll,  
Clouds have small drops

Phytoplankton increase CCN.

Their activity strongly impact clouds.

The changes are comparable to contrasts between polluted and clean environments (forcing  $\sim -15 \text{ W m}^{-2}$ ).

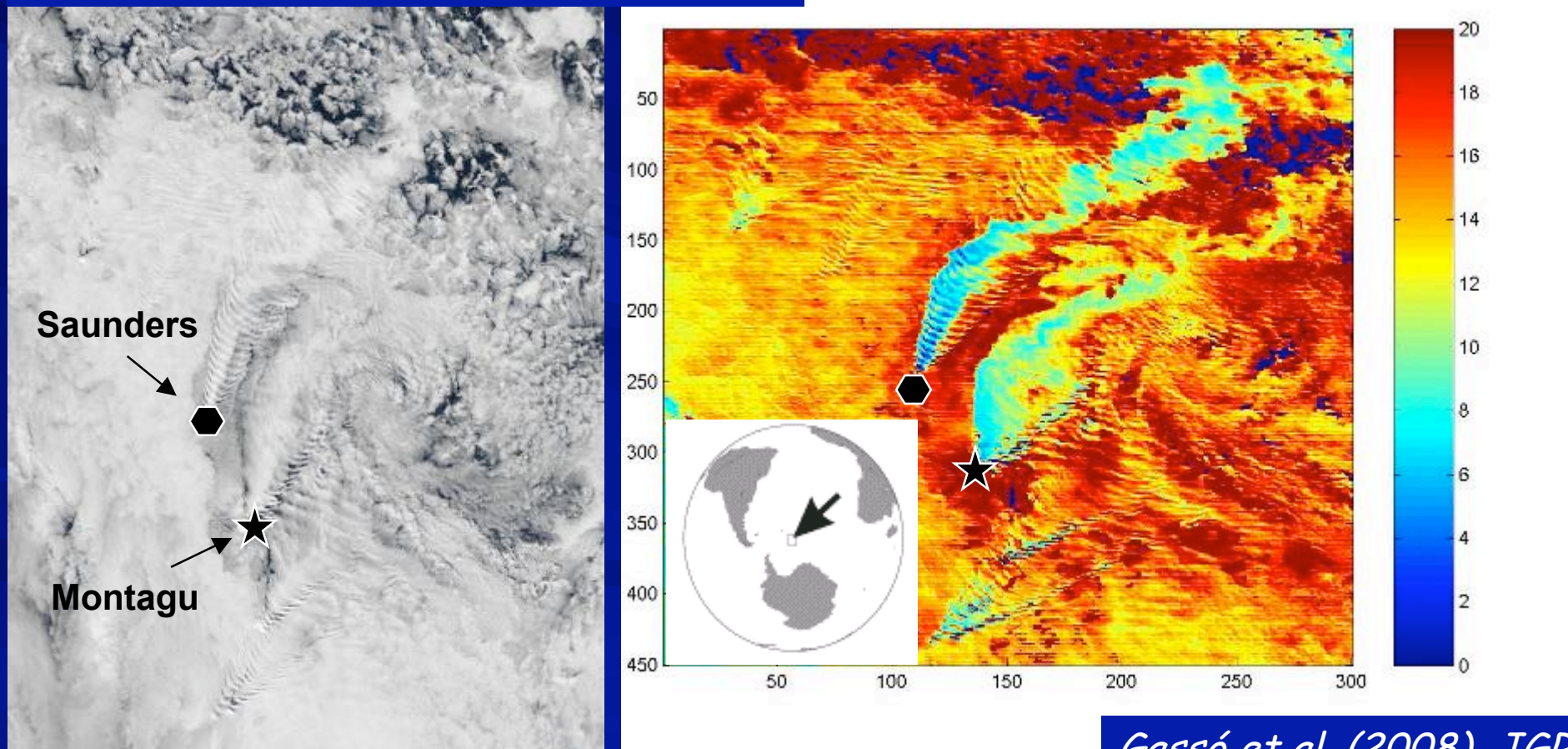
*Meskhidze and Nenes, Science, 2006*



## So do volcanoes (even when “sleeping”) ...

Volcanoes continuously emit  $\text{SO}_2$  which becomes sulfate aerosol. The aerosol can substantially increase CCN in volcanic plumes. Cloud in the plume are much more reflective than outside.

*Location: Sandwich Islands , ~55S,~30W*



*Gassó et al. (2008), JGR*

## Anthropogenic Indirect Effect: How do we estimate its global impact?

We use a global climate model (GCM)

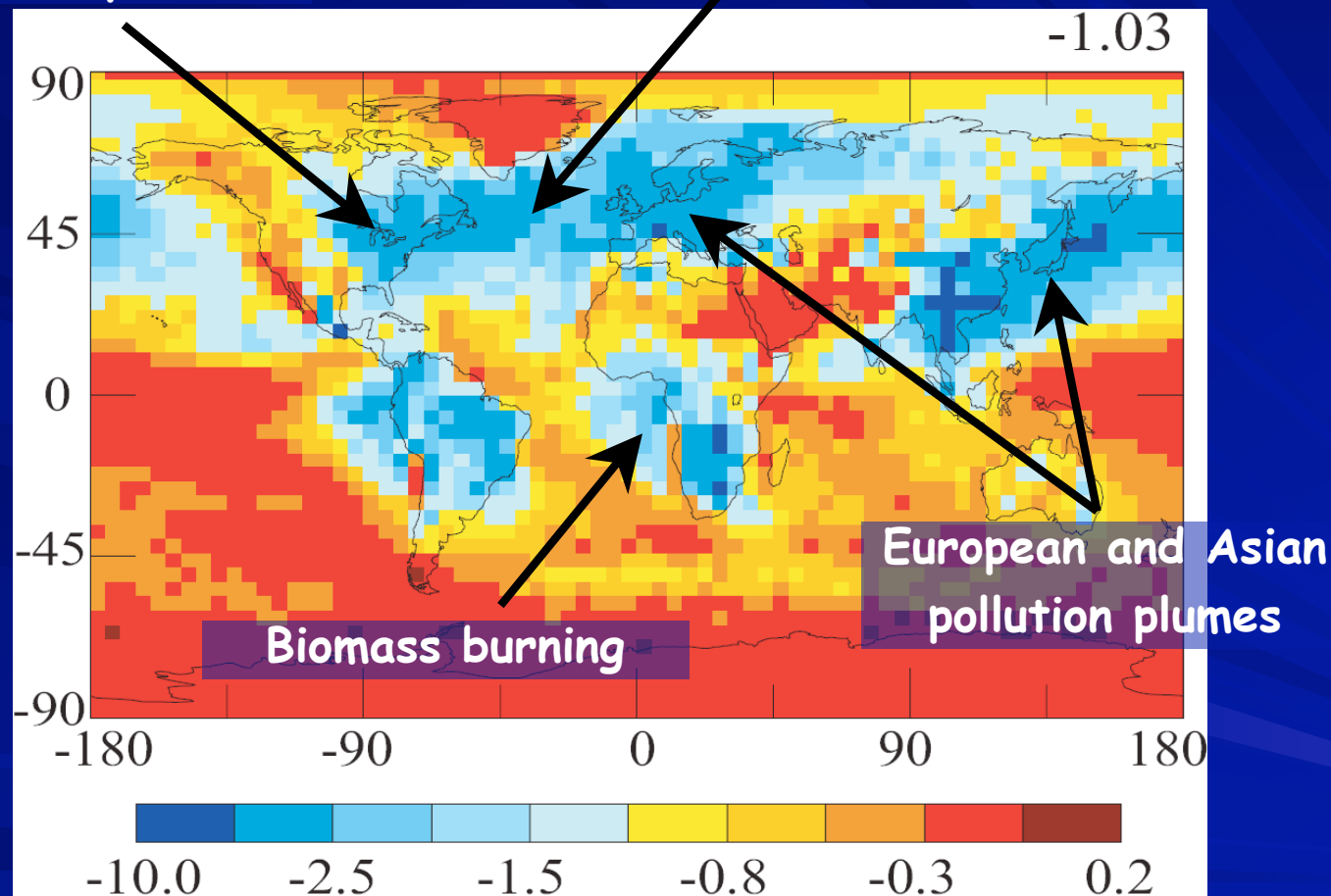
- simulation with "current day" emissions
- simulation without anthropogenic emissions ("preindustrial" emissions)
- compute the change in energy (radiation) between two simulations ("indirect forcing")
- compare annual average forcing to greenhouse gas warming ( $\sim 2.5 \text{ W m}^{-2}$ )
- Net forcing (greenhouse + indirect) can be used as an index for climate change.



# Indirect Forcing calculation ( $\text{W m}^{-2}$ )

North America  
pollution plumes

Long-range transport

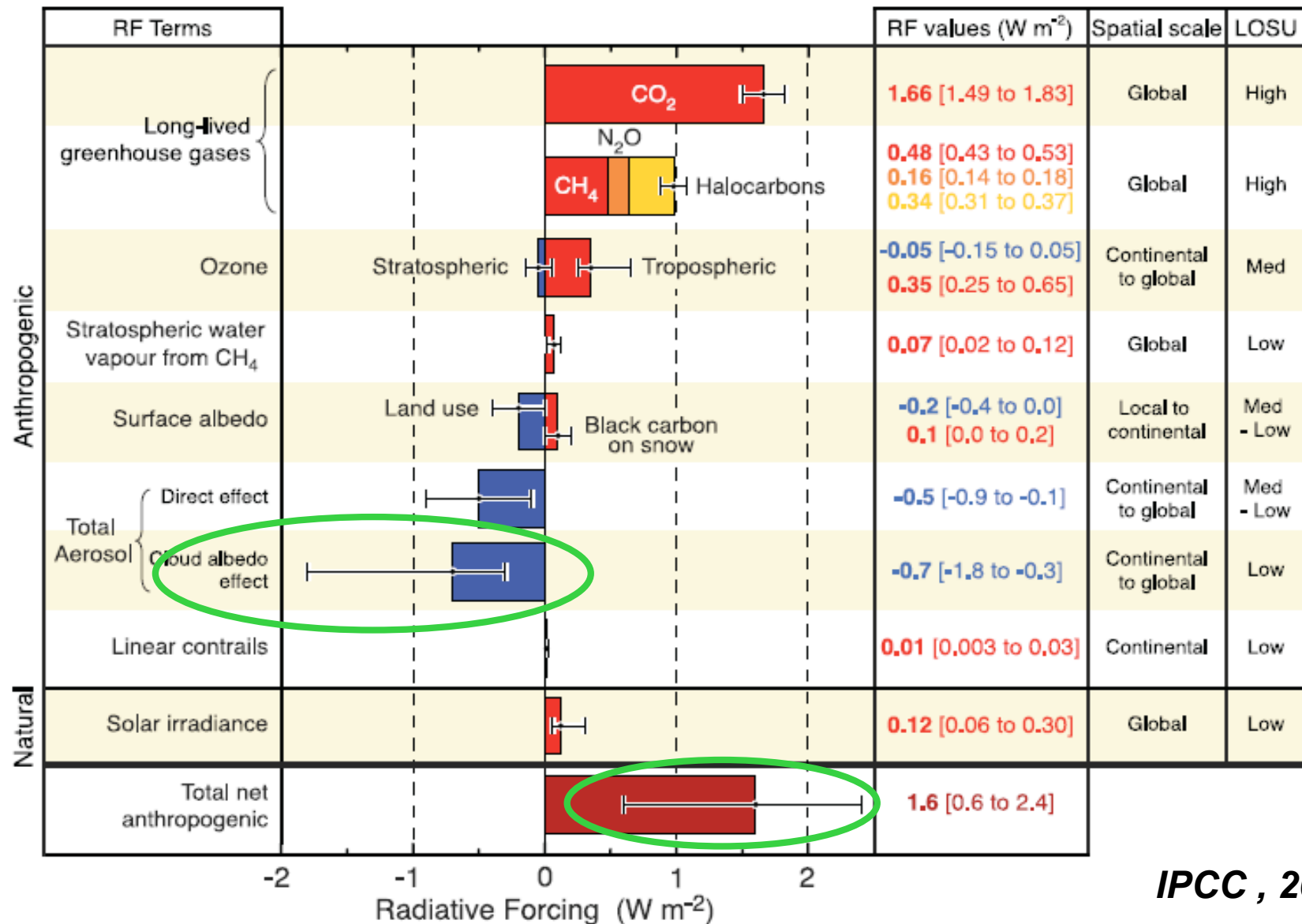


Sotiropoulou et al., in preparation

Spatial pattern of IF follows that of aerosol variations

# Anthropogenic Climate Forcing

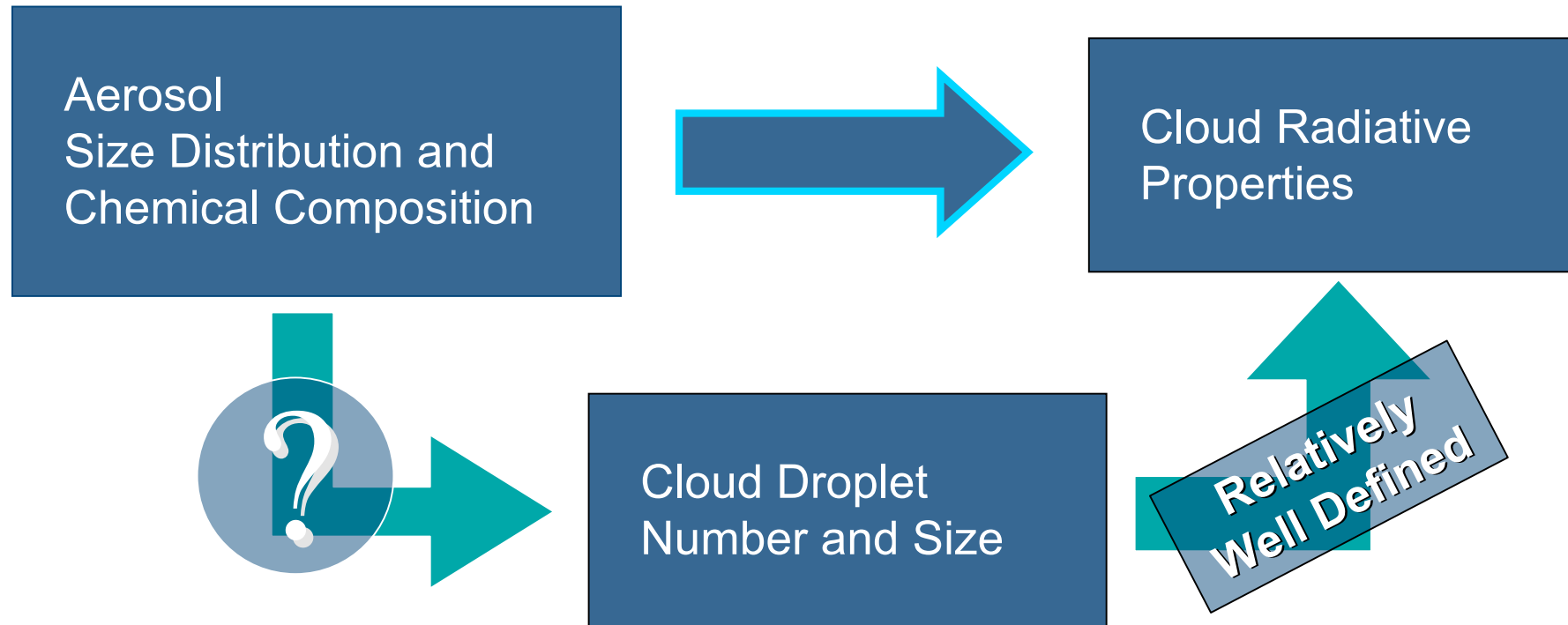
## RADIATIVE FORCING COMPONENTS





# Quantification of the Indirect Effect in Global Models

---

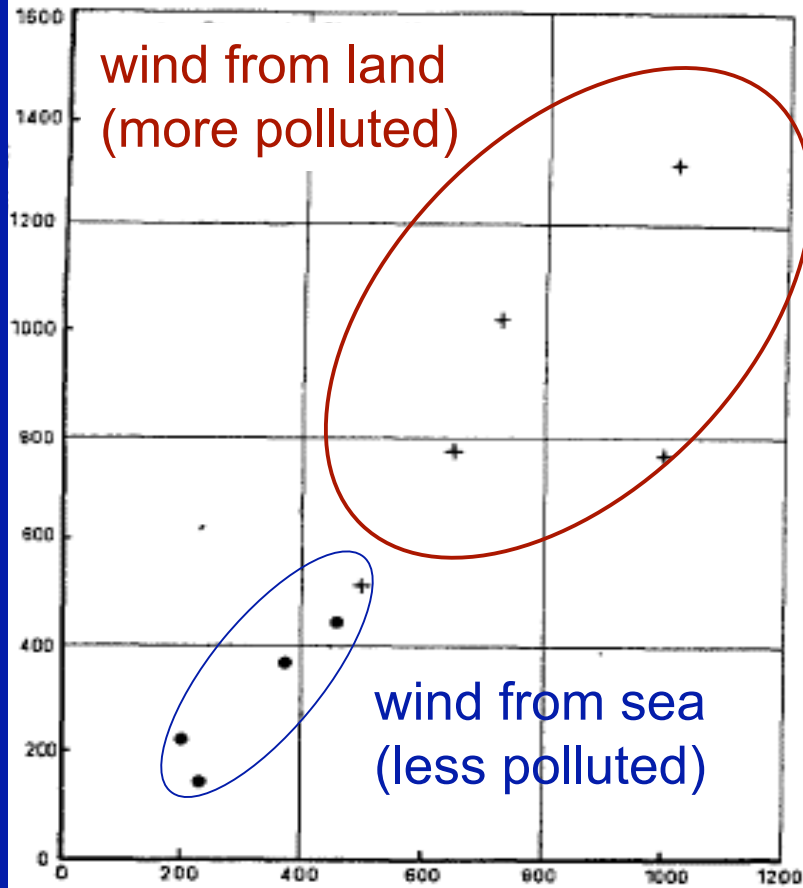


This problem has historically been reduced to finding the relationship between aerosol number concentration and cloud droplet number concentration. **Empirical** relationships are often used.

# Aerosol-cloud microphysical observations

....first measurements at one site (1967)

Observed cloud droplet concentration [ $\text{cm}^{-3}$ ]

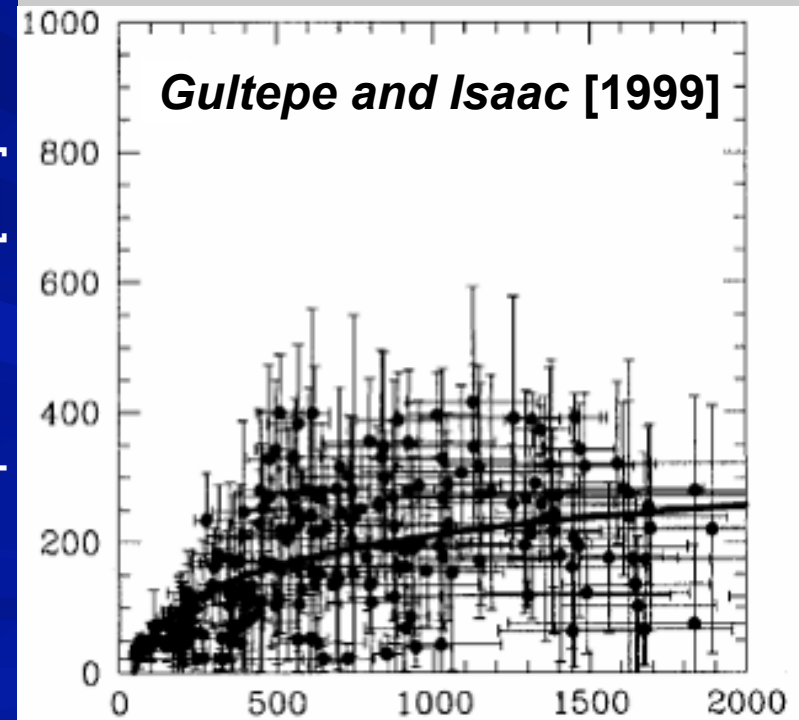


Predicted droplet concentration from aerosol spectrum [ $\text{cm}^{-3}$ ]

Twomey and Warner (1967)

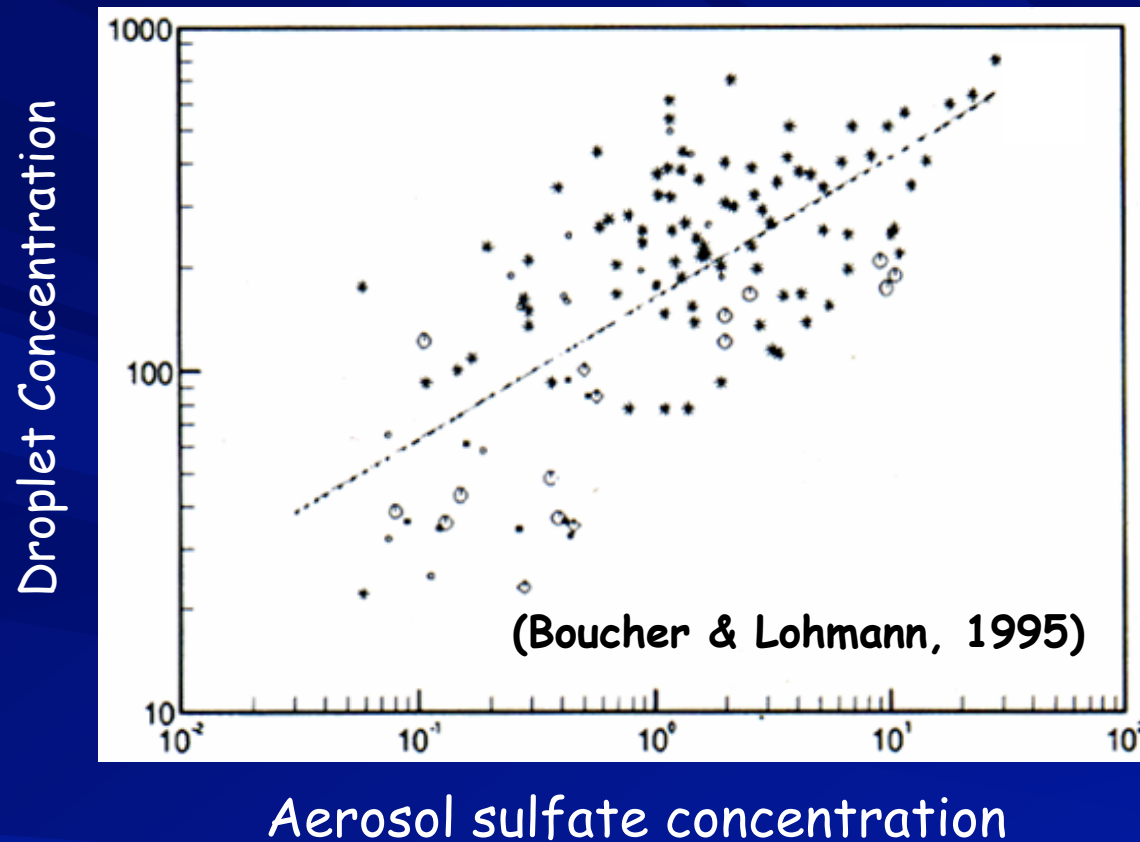
....recent measurements (1999)

Droplet Number [ $\text{cm}^{-3}$ ]



Aerosol Concentration [ $\text{cm}^{-3}$ ]

# Approach for aerosol- $N_d$ : empirical



Large variability.

Why?

Unaccounted:

- Meteorology
- Cloud microphysics
- Composition
- etc...

Many studies still utilize this type of approach.

Large predictive uncertainty, without "chances" of improving.



# Current Direction: Use simplified but physically based approach for important processes

## Dynamics

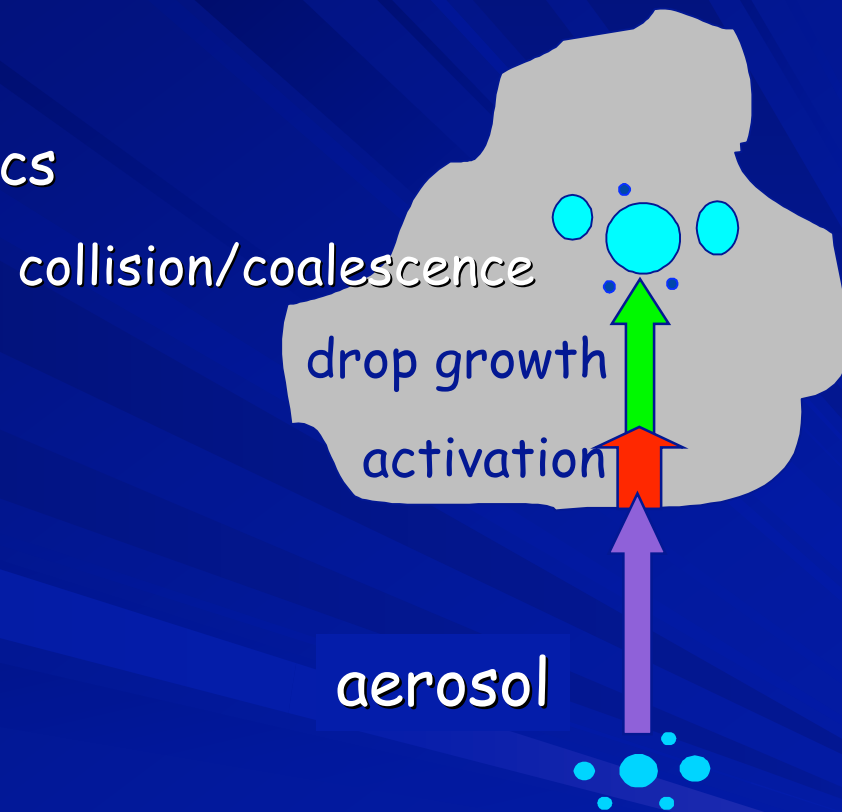
- Updraft Velocity
- Large Scale Thermodynamics

## Particle characteristics

- Size
- Concentration
- Chemical Composition

## Cloud Processes

- Cloud droplet formation
- Drizzle formation
- Rainwater formation
- Chemistry inside cloud droplets



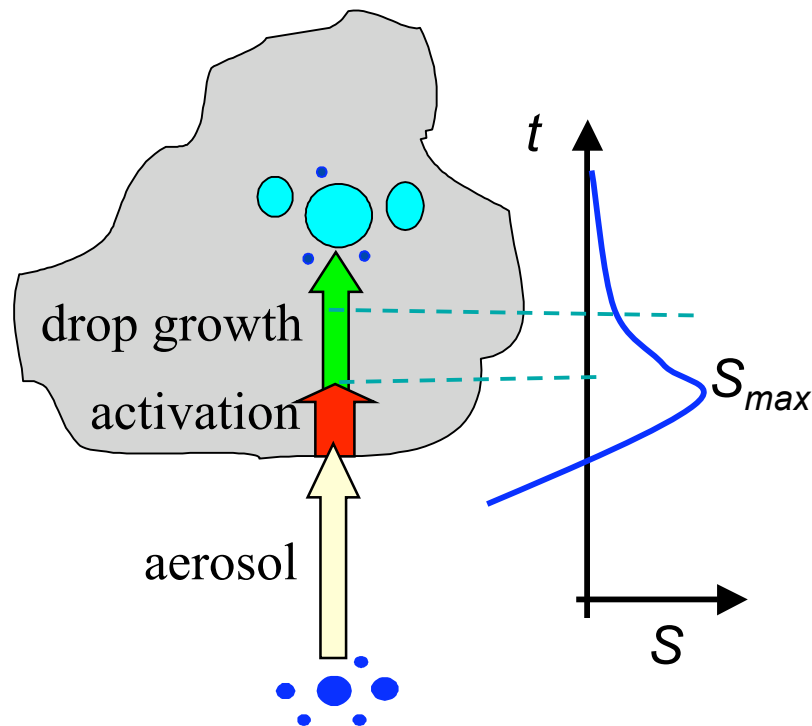
All the links need to be incorporated in global models  
The links need to be **COMPUTATIONALLY** feasible.

# Including explicit physics in GCMs is possible...

---

**Tempting:** use the “simple story of droplet formation”

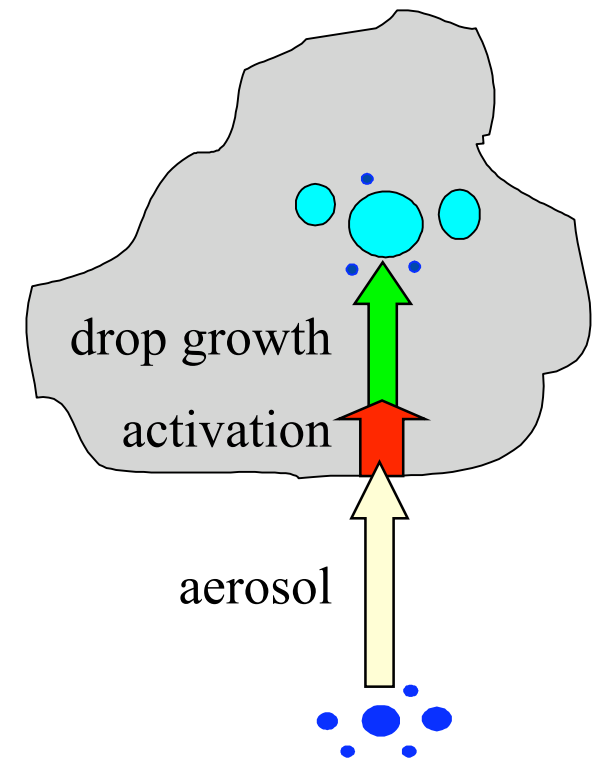
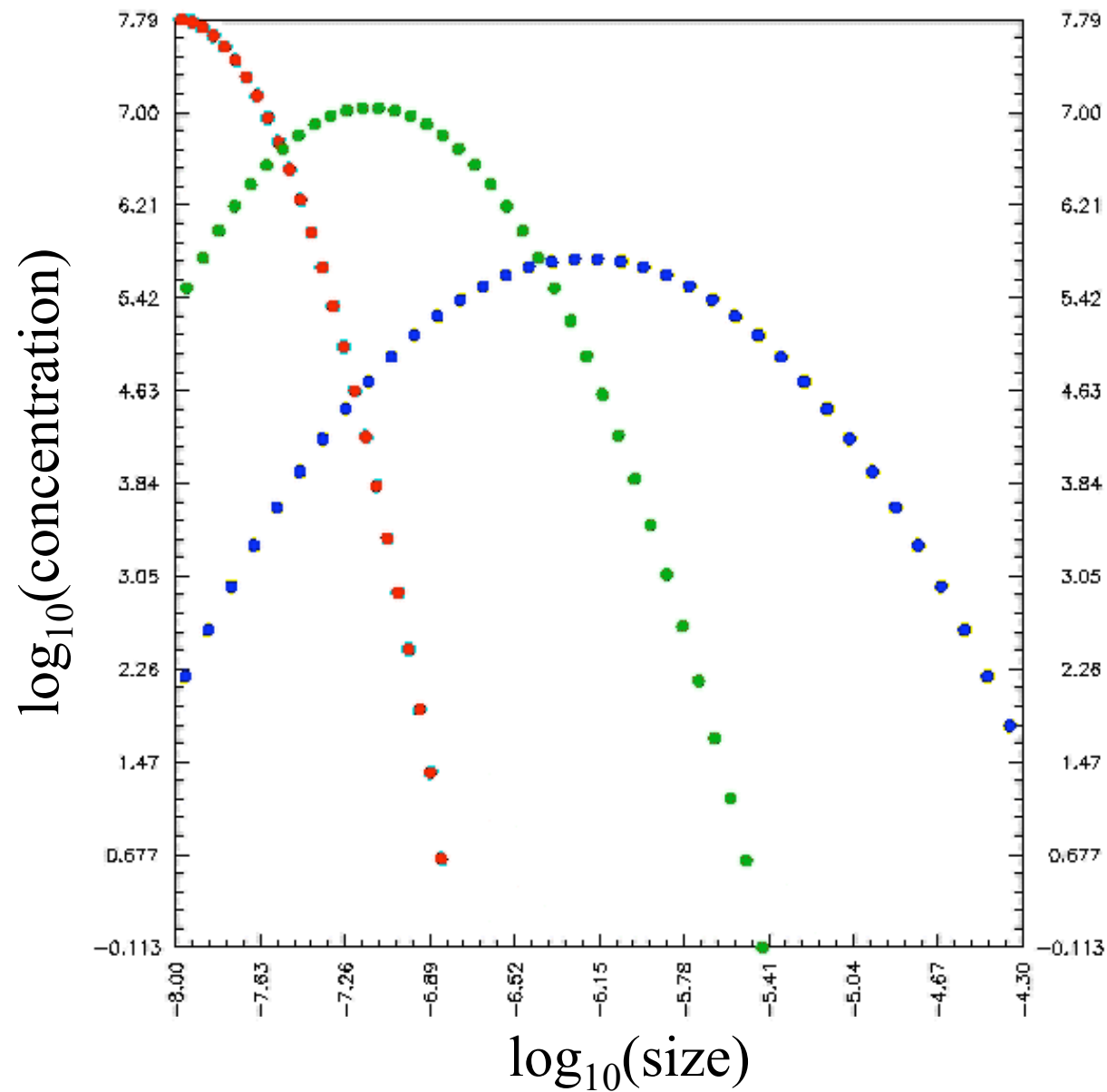
**Basic ideas:** Solve conservation laws for energy and the water vapor condensing on the aerosol particles contained in the parcel.



**Steps are:**

- Parcel cools as it rises
- Exceed the dew point at LCL
- Generate supersaturation
- Droplets start activating as  $S$  exceeds their  $S_c$
- Condensation of water becomes intense.
- $S$  reaches a maximum
- No more droplets form

# Cloud droplet formation in updrafts





## Cloud droplet formation in updrafts

The "good" news:

The theory is established

The "bad" news:

It is (very, very) SLOW

Fortunately, there is a solution:

"Mechanistic" parameterizations.

They don't solve the "full problem" but only what's important for calculating  $N_d$ :

$s_{max}$  and the  $CCN(s_{max})$

$\log_{10}(\text{concentration})$

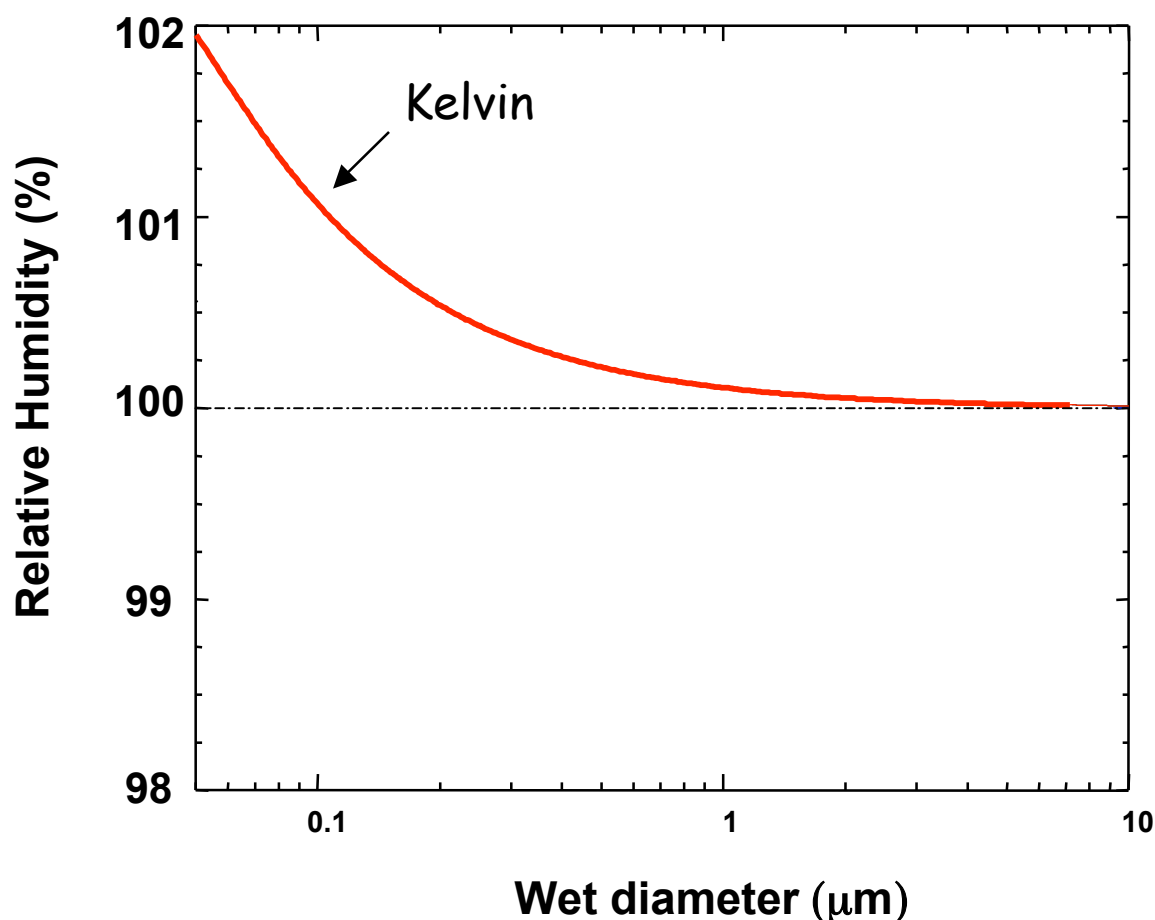
-8.0  
-7.6  
-7.2  
-6.8  
-6.4  
-6.1  
-5.7  
-5.4  
-5.0  
-4.6  
-4.3

$\log_{10}(\text{size})$

## So... when does an aerosol particle act as a CCN ?

---

A particle acts as a CCN when it cannot be in *stable* equilibrium with water vapor.



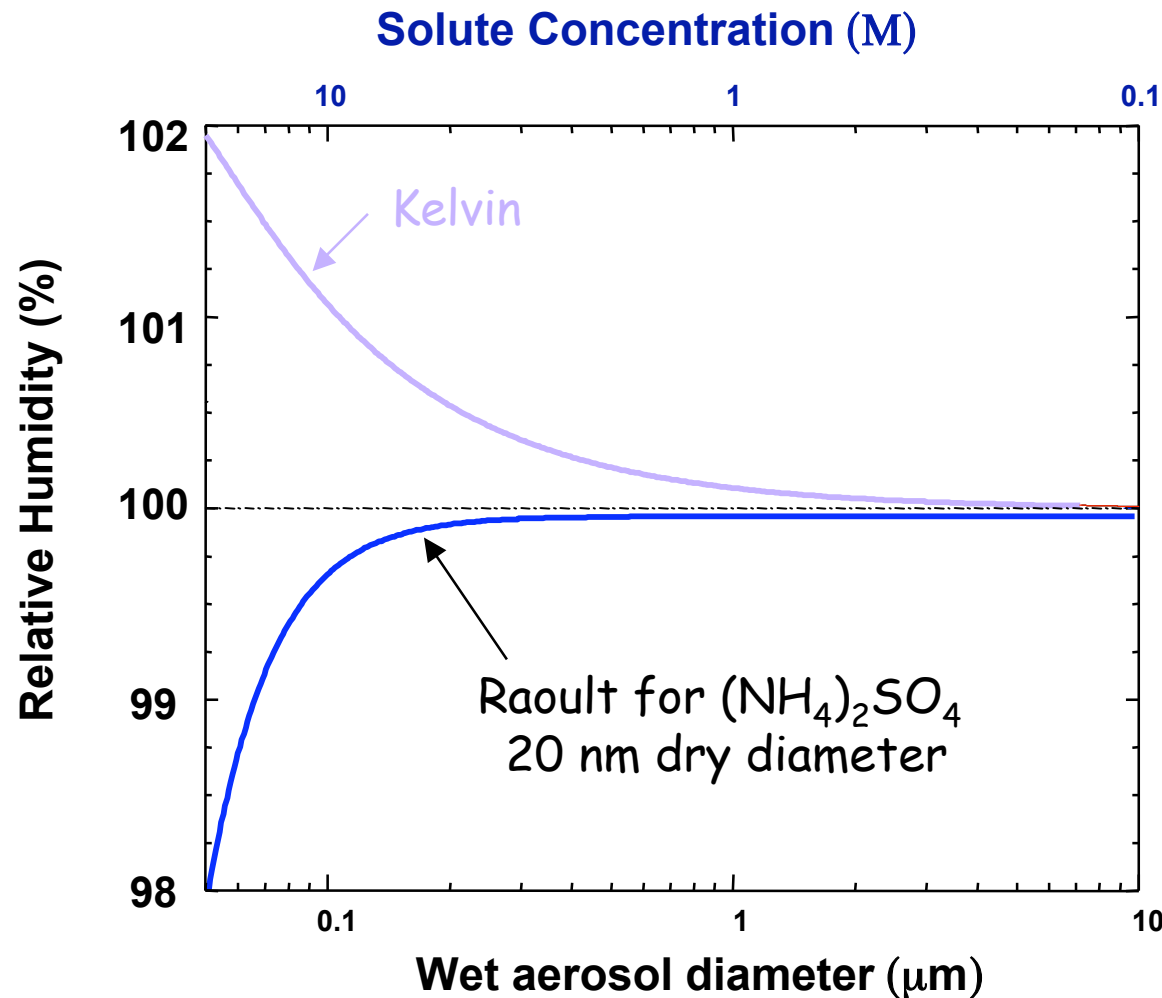
Take a pure H<sub>2</sub>O drop

Droplet curvature enhances vapor pressure (Kelvin effect).

Drop is always in unstable equilibrium with water vapor (they either evaporate or grow uncontrollably).

# When does an aerosol particle act as a CCN ?

A particle acts as a CCN when it cannot be in *stable* equilibrium with water vapor.



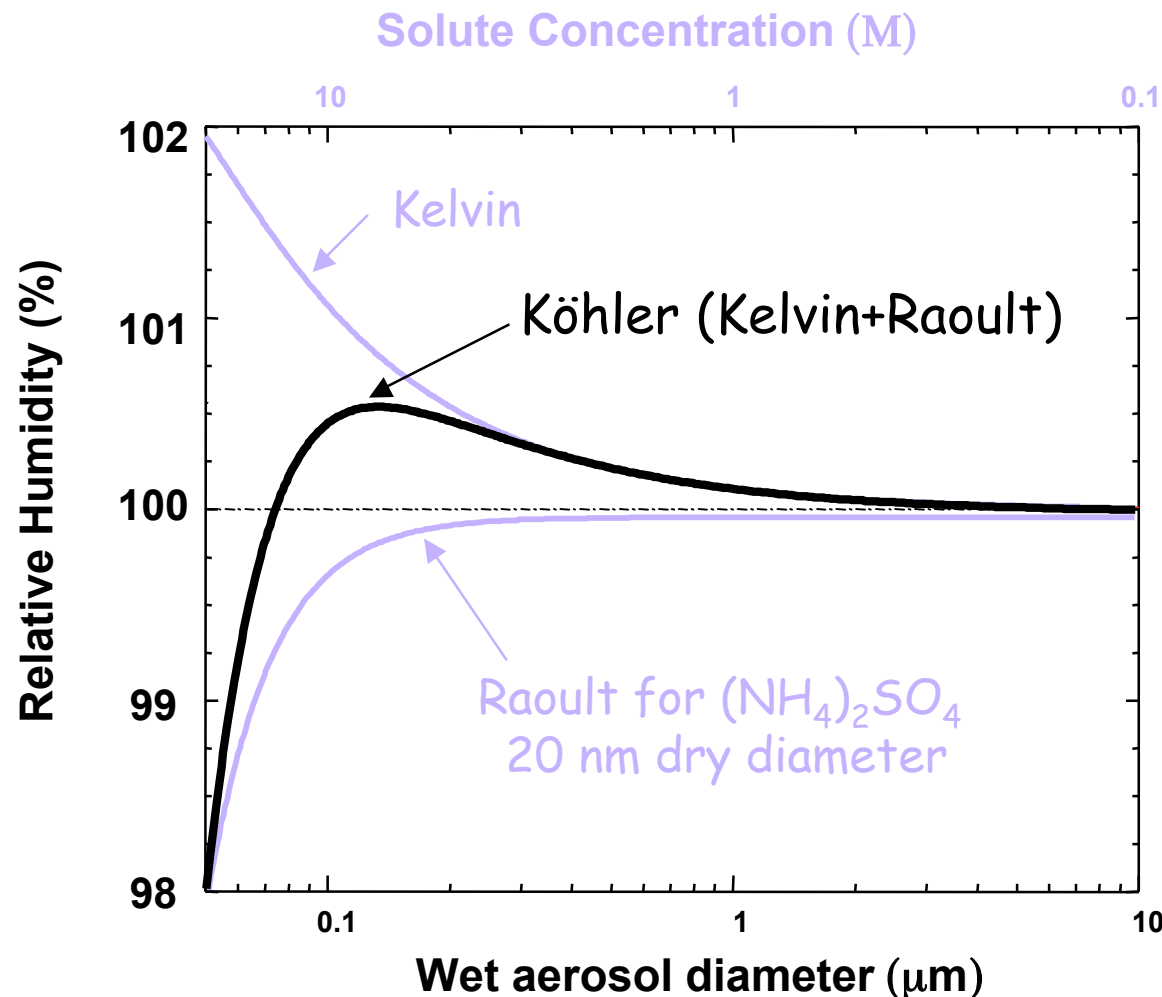
Now add some  
solute; e.g.,  
 $(\text{NH}_4)_2\text{SO}_4$

Dissolved material in the droplet tends to decrease the vapor pressure (Raoult effect).



# When does an aerosol particle act as a CCN ?

A particle acts as a CCN when it cannot be in *stable* equilibrium with water vapor.



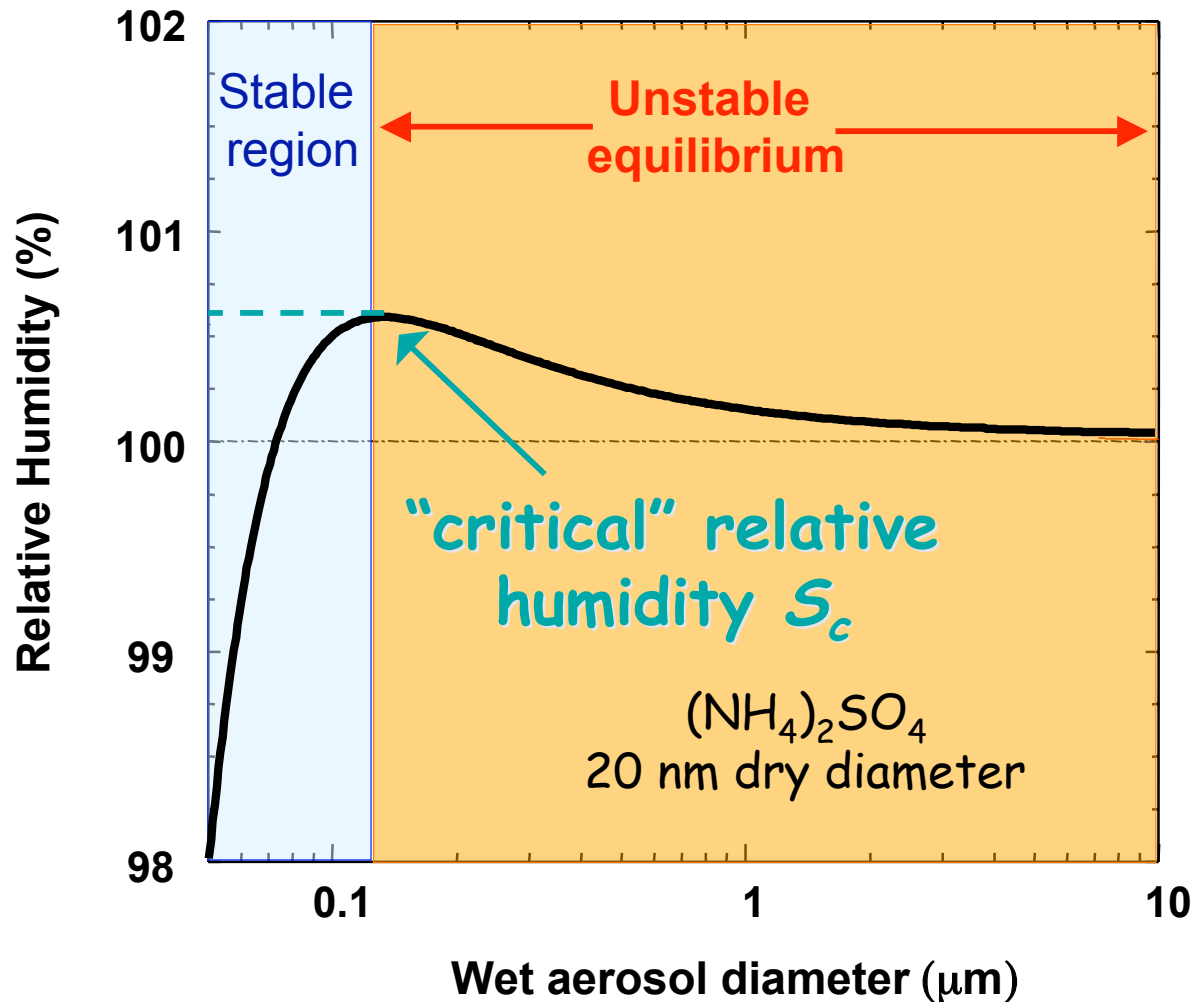
Now add some  
solute; e.g.,  
 $(\text{NH}_4)_2\text{SO}_4$

Dissolved material in  
the droplet tends to  
decrease the vapor  
pressure  
(Raoult effect).

The combined Kelvin  
and Raoult effects is  
known as the **Köhler**  
equation.

## When does an aerosol particle act as a CCN ?

Aerosol can be in stable equilibrium with supersaturated water. If in "unstable" region, it acts as a CCN and nucleates a drop.

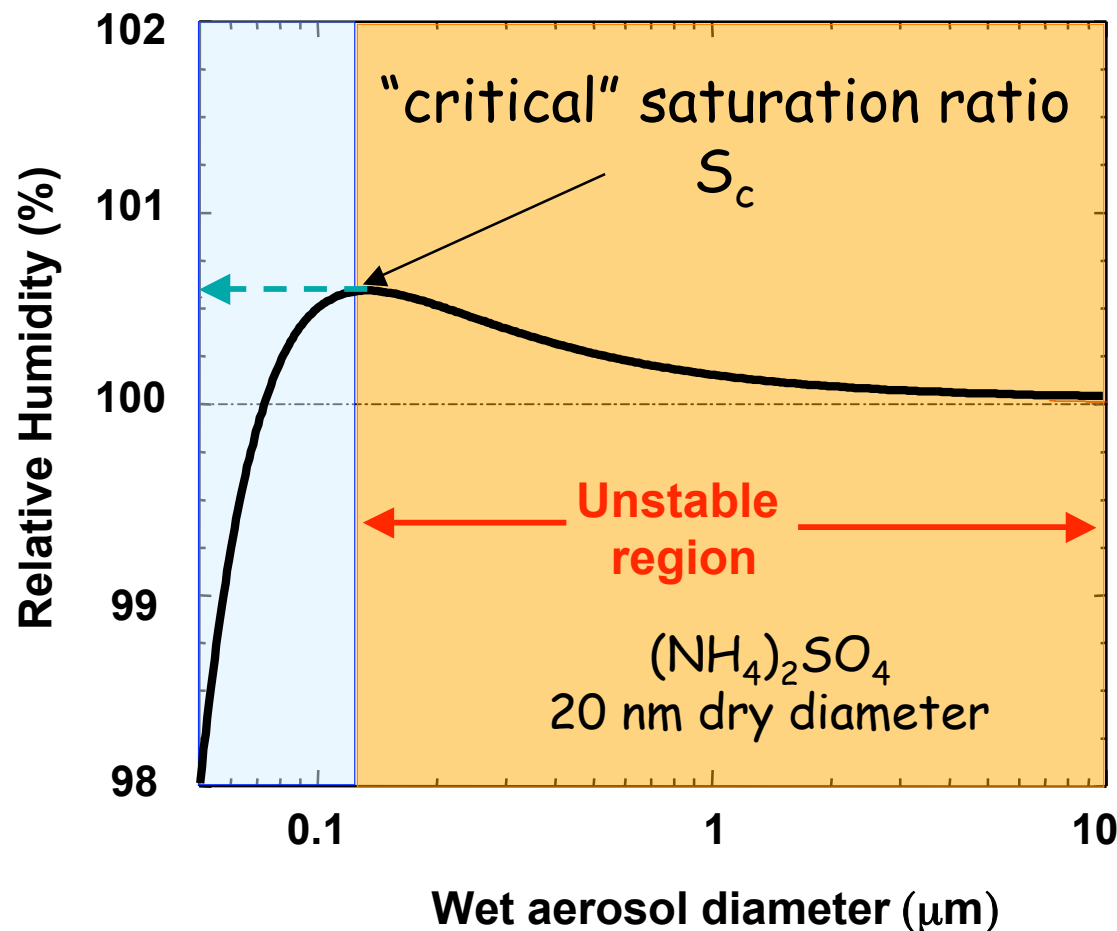


Every particle has a characteristic  $S_c$

$S_c$  depends on dry size, chemical composition and surface tension.

# When does an aerosol particle act as a CCN ?

When ambient saturation is above  $S_c$  the particle becomes **unstable** and forms a droplet. Only then it can be a CCN.



$S_c$  depends on dry size, chemical composition and surface tension.

$$\frac{S_c - 100}{100} = \left( \frac{4A^3}{27B} \right)^{1/2}$$

$S_c$ , critical supersaturation

$A$ : "surface tension" parameter

$B$ : "solute" parameter



# Steps for building a “mechanistic” parameterization

**Input:**  $P, T$ , vertical velocity, particle characteristics.

**Output:** Cloud droplet number

**How:**

## Determine CCN ( $s$ )

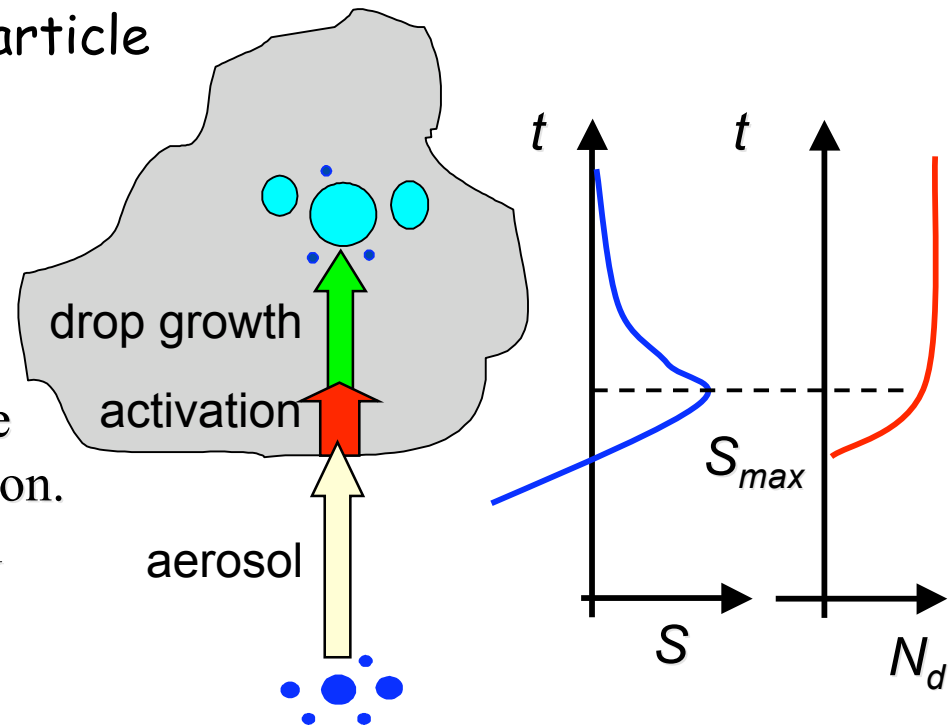
- Use an aerosol model to predict size distribution and chemical composition.
- Köhler theory for computing CCN properties.

## Determine $s_{max}$

- Derive expression for the condensational growth of CCN; include within the supersaturation balance for the parcel, and solve for the maximum.

*Challenge:* to derive an expression of the condensation rate at  $s_{max}$ .

*Our solution:* “Population splitting” (Nenes and Seinfeld, JGR, 2003)



$$N_d = \text{CCN}(s_{max})$$

# Adiabatic Cloud Formation Parameterization: Nenes and Seinfeld, 2003 (and later work).

**Input:** P, T, vertical wind, particle characteristics.

**Output:** Cloud properties.

**How:** Solve an algebraic equation (instead of ODE's).

*Water vapor condensation from  
kinetically “limited” CCN*

$$\frac{\pi}{2} \frac{\gamma \rho_w G S_{\max}}{a V} \left\{ C_1 \int_0^{S_{\text{part}}} f_1(s) ds + C_2 \int_{S_{\text{part}}}^{S_{\max}} f_2(s) ds \right\} - 1 = 0$$

*Water vapor condensation from  
CCN that “instantaneously” activate*

**Features:**

- $10^3$ - $10^4$  times *faster* than numerical cloud model.
- can treat very complex chemical composition.
- FAST formulations for lognormal and sectional aerosol is available

# "Mechanistic" Cloud Parameterizations efficiently solve the drop formation problem

Input: P, T, vertical wind, **particle characteristics**.

Output: Cloud properties (droplet number, size distribution).

How: Solve an algebraic equation (instead of ODE's).

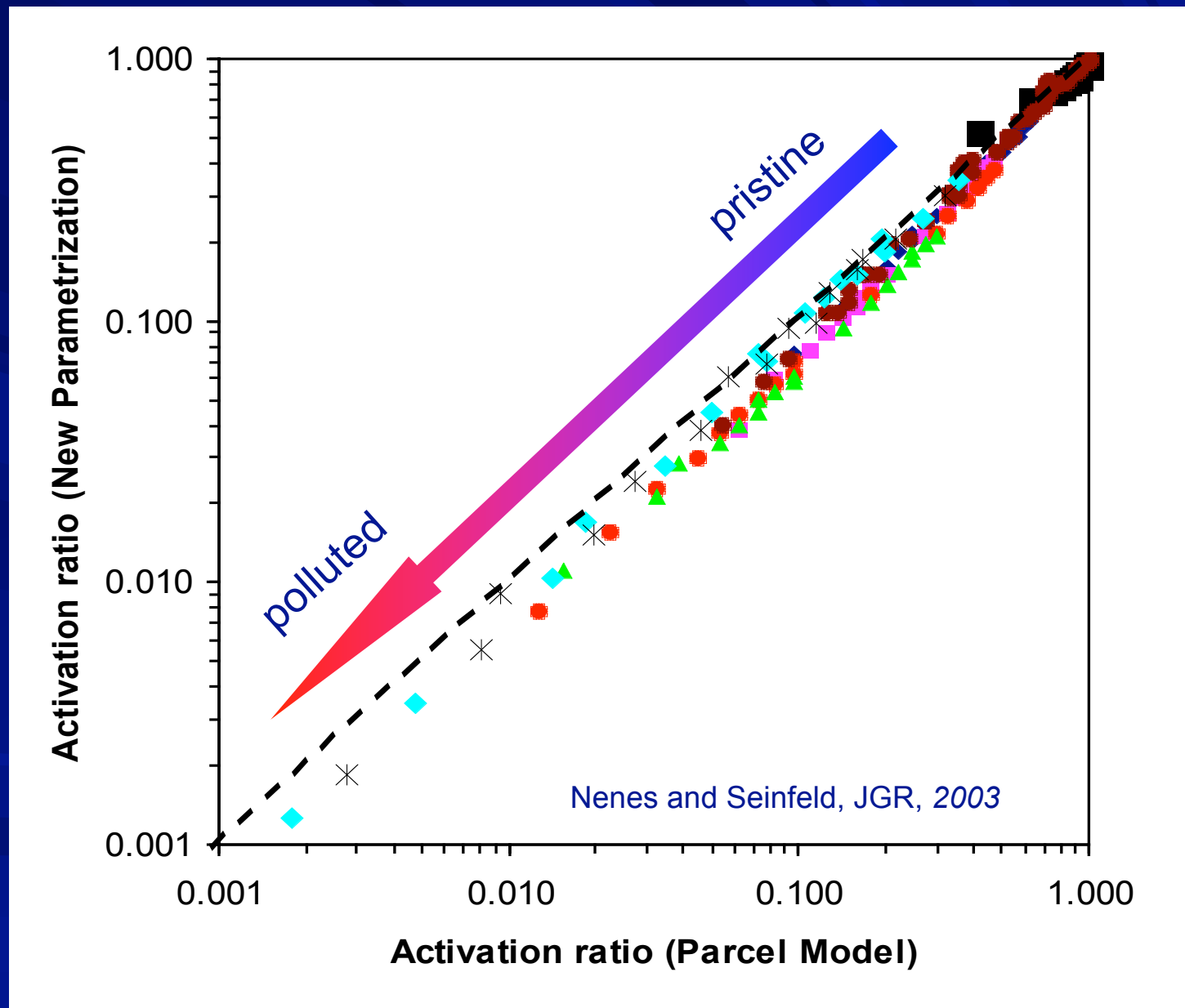
## Examples:

Abdul-Razzak et al., (1998); Abdul-Razzak et al., (2000);  
Nenes and Seinfeld (2003), Fountoukis and Nenes (2005),  
Ming et al., (2007); Barahona and Nenes (2007)

## Characteristics:

- $10^3$ - $10^4$  times *faster* than numerical parcel models.
- some can treat very complex chemical composition.
- have been evaluated using in-situ data with large success (e.g., Meskhidze et al., 2006; Fountoukis et al., 2007)

# Evaluation against detailed cloud model





# In-situ data evaluation : the "real" test

Airborne platforms are a major "workhorse" for producing the aerosol-cloud datasets we need for parameterization evaluation and development.



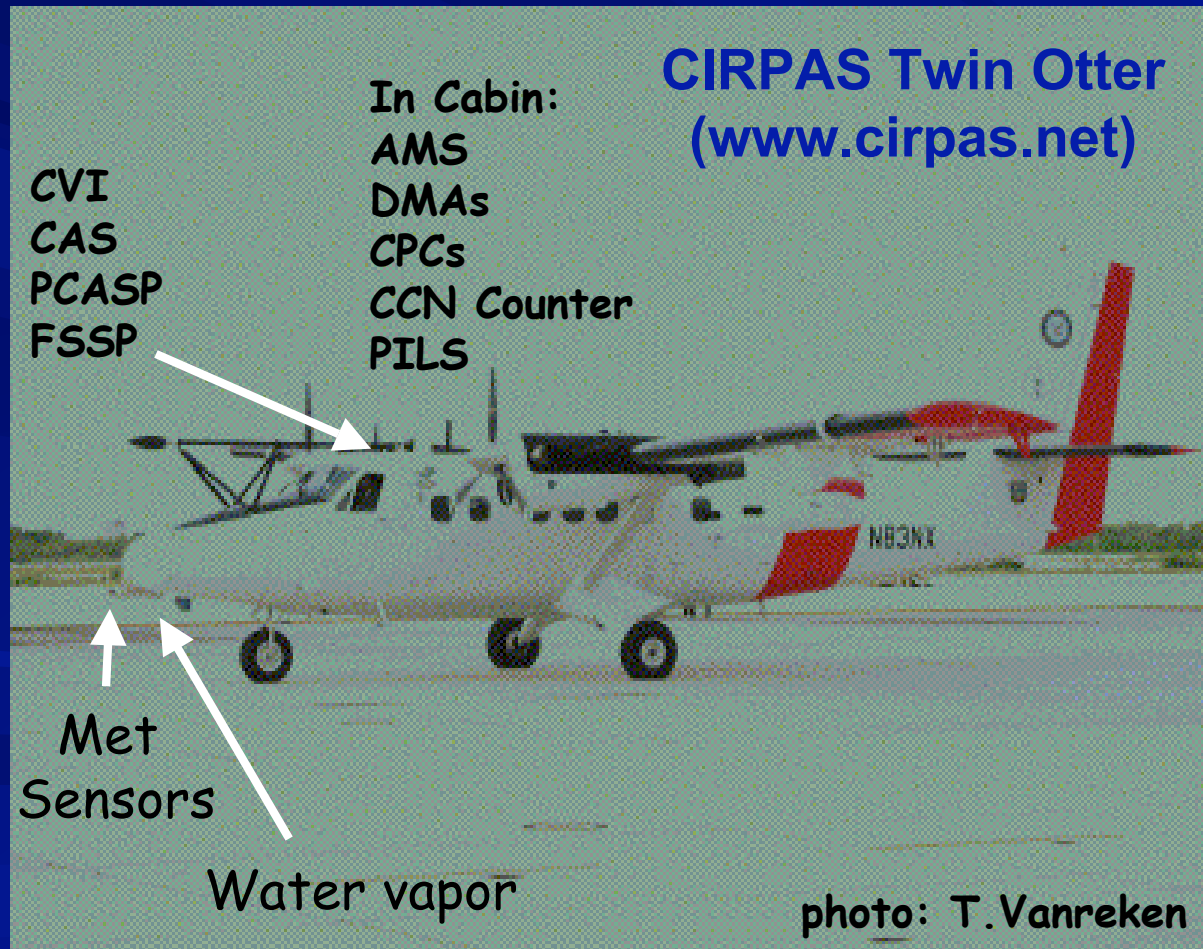
CIRPAS Twin Otter



NOAA P3

# Evaluate parameterizations with in-situ aerosol/cloud microphysical measurements.

(Are they "good enough" for real clouds?)



Cloud droplet concentration

FSSP, CAS

Aerosol number concentration

CPC

Aerosol size distribution

DMA, PCASP, APS

Aerosol composition

AMS, PILS

Updraft velocity

# Parameterization Evaluation

## CDNC "closure"

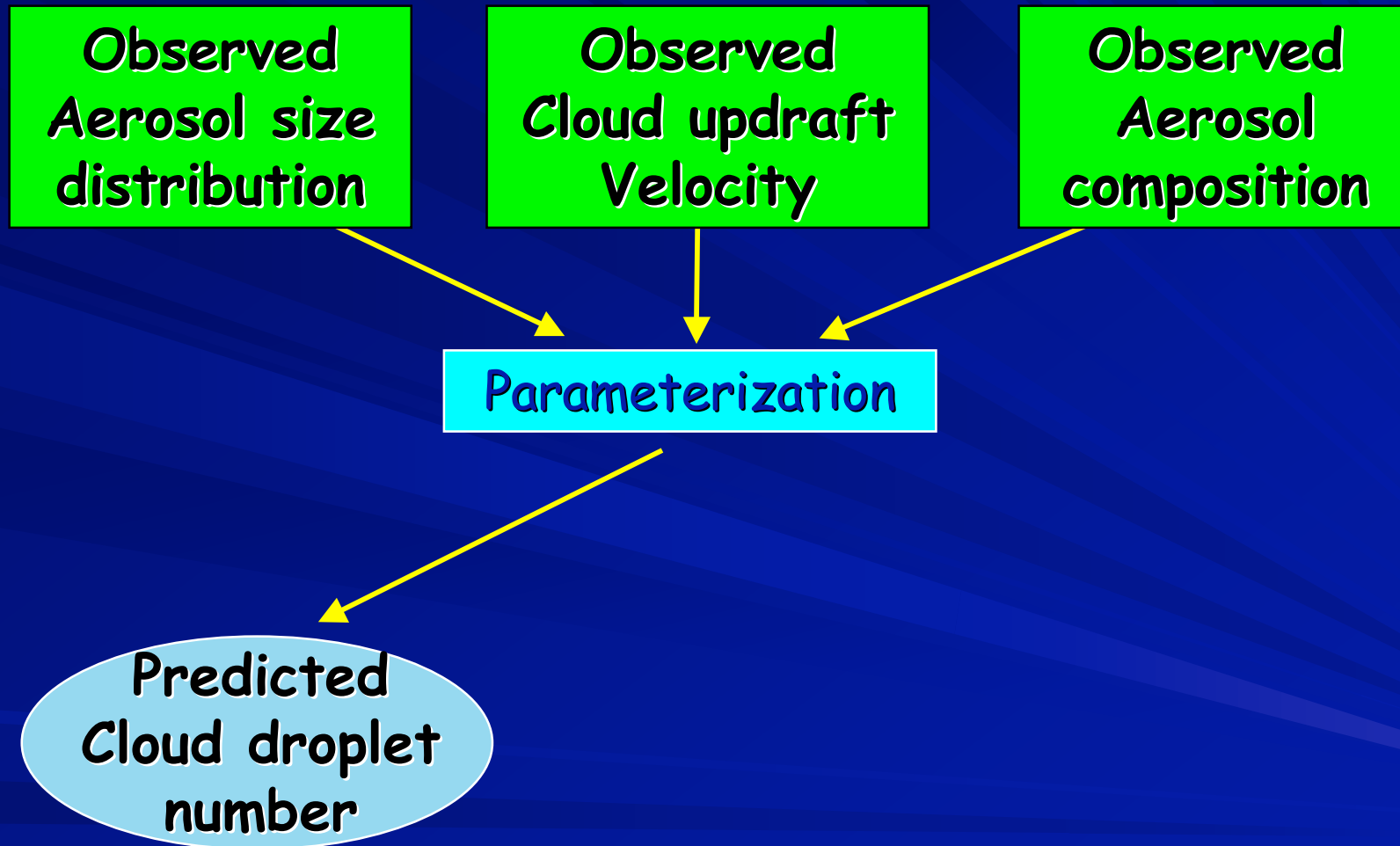
Observed  
Aerosol size  
distribution

Observed  
Cloud updraft  
Velocity

Observed  
Aerosol  
composition

# Parameterization Evaluation

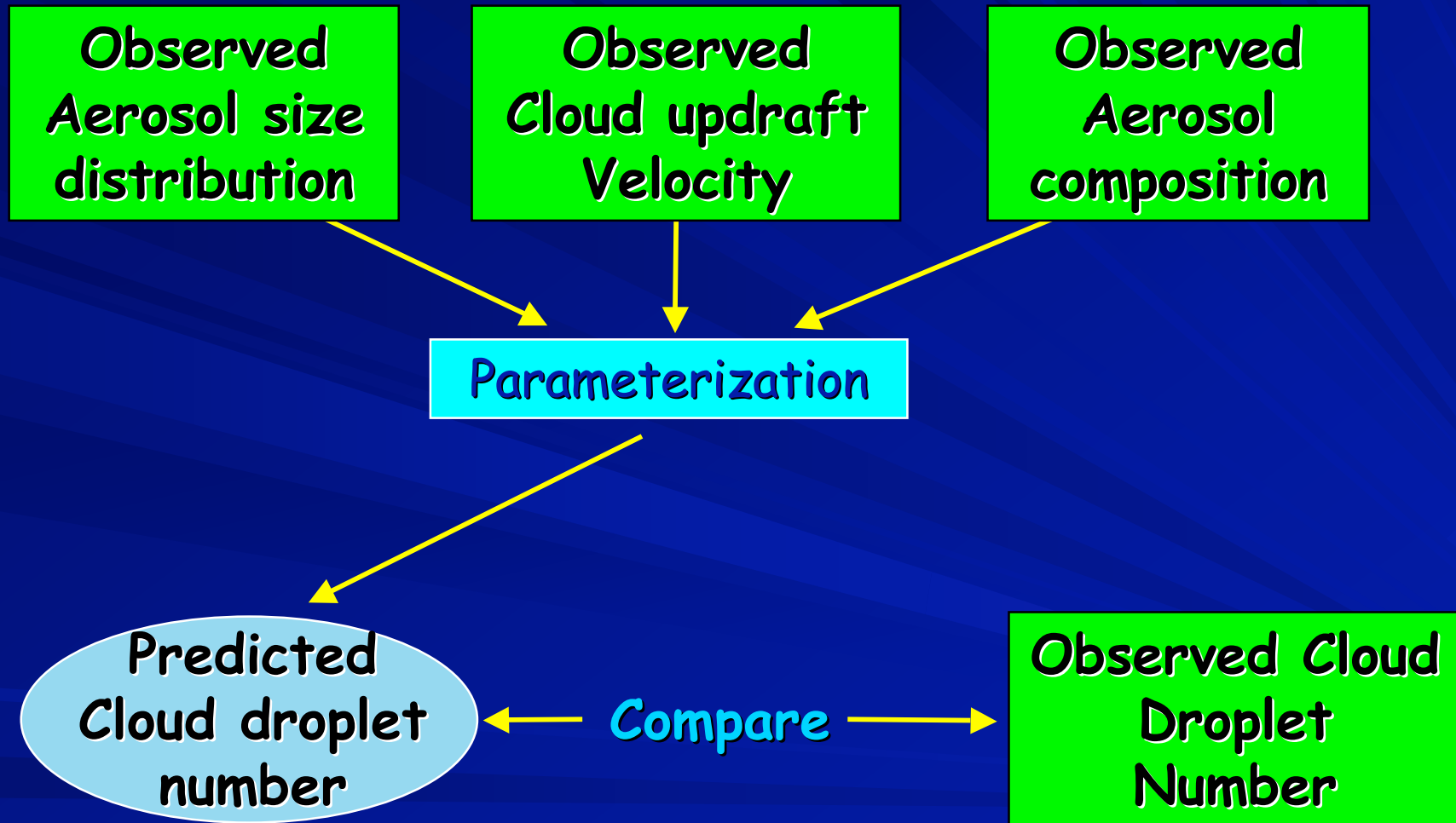
## CDNC "closure"



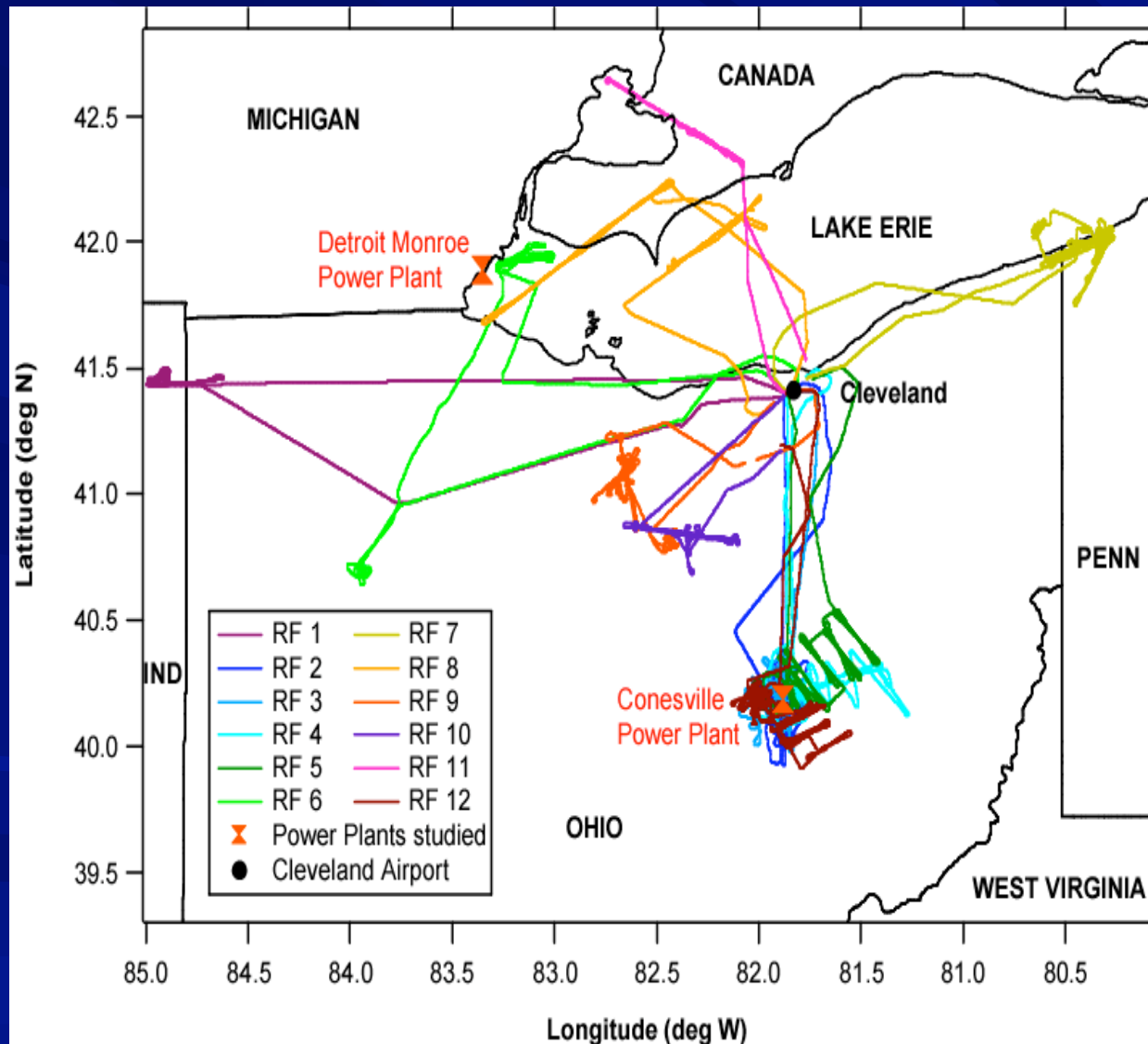


# Parameterization Evaluation

## CDNC "closure"

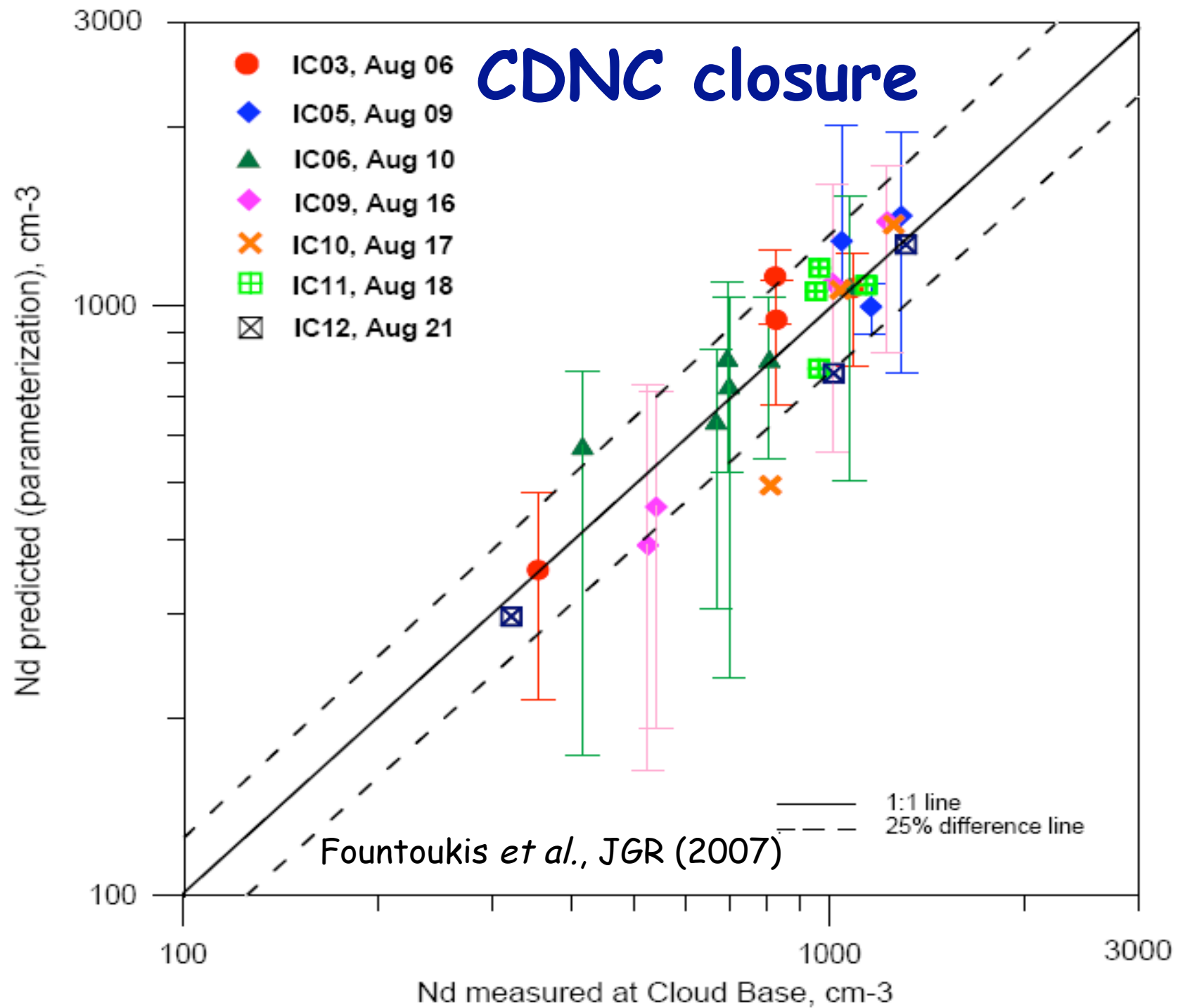


# CDNC closure during ICARTT (Aug. 2004)



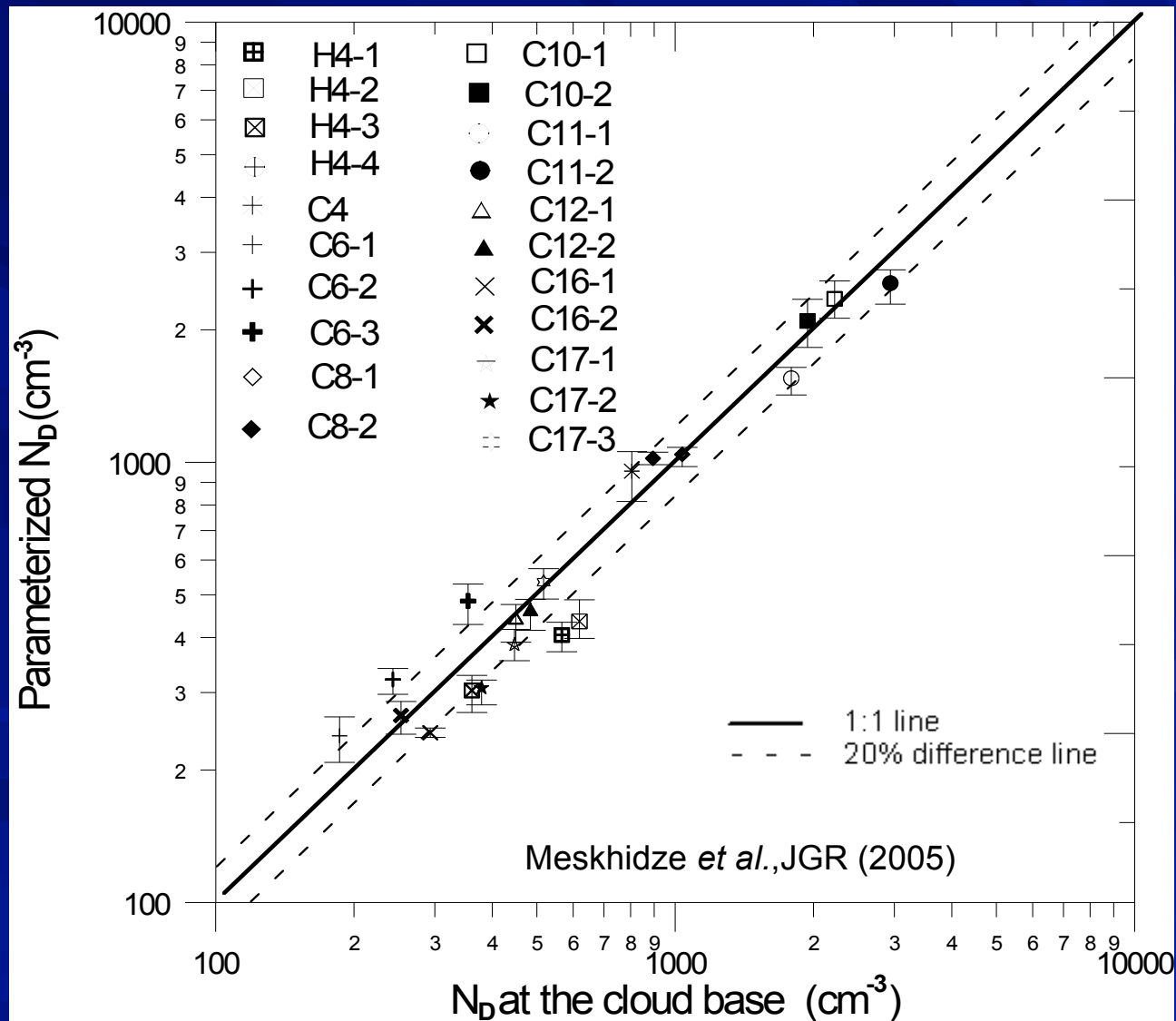
- Cumuliform and Stratiform clouds sampled
- Investigate the effect of power plant plumes on clouds





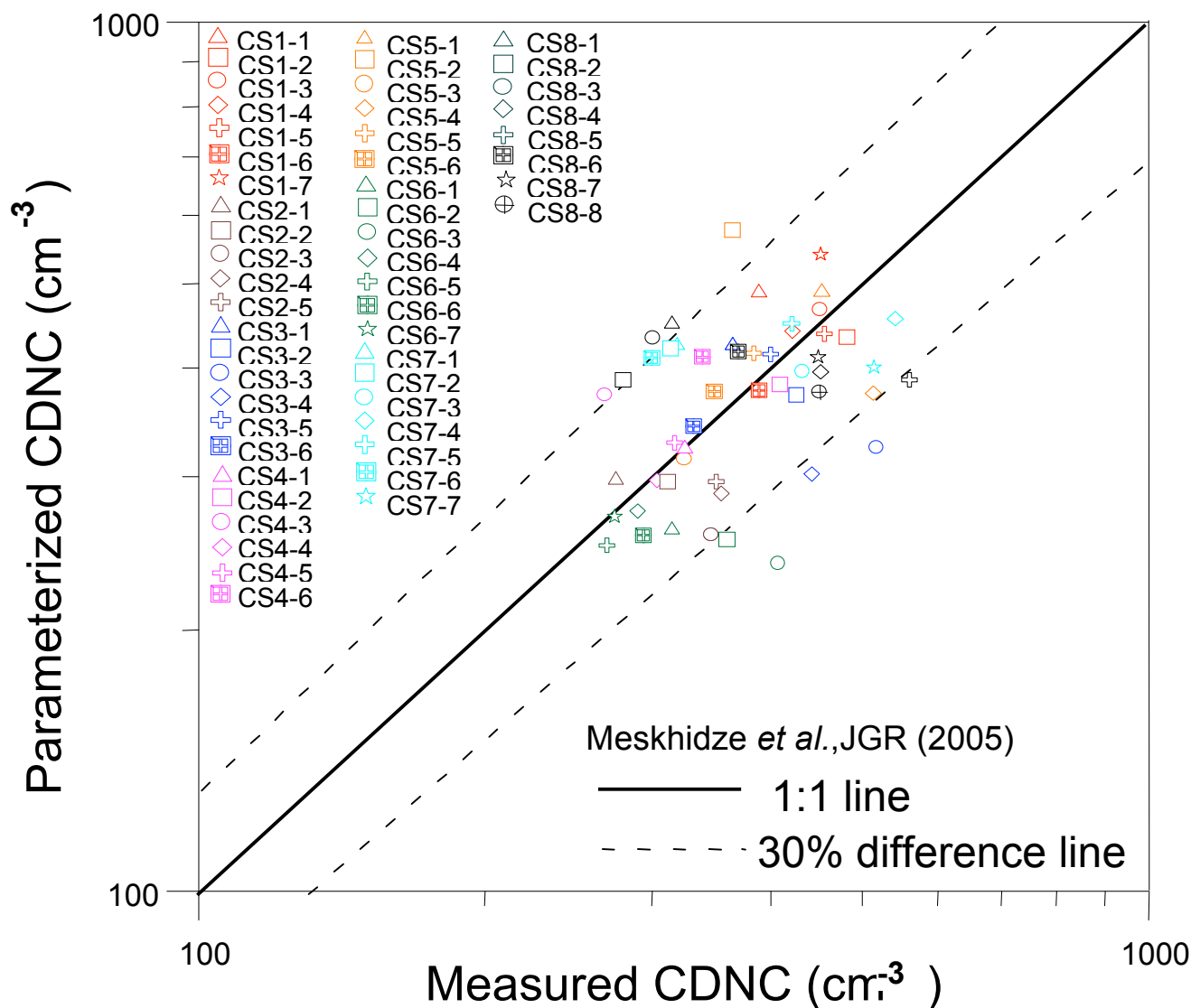


# CRYSTAL-FACE (2002) Cumulus clouds





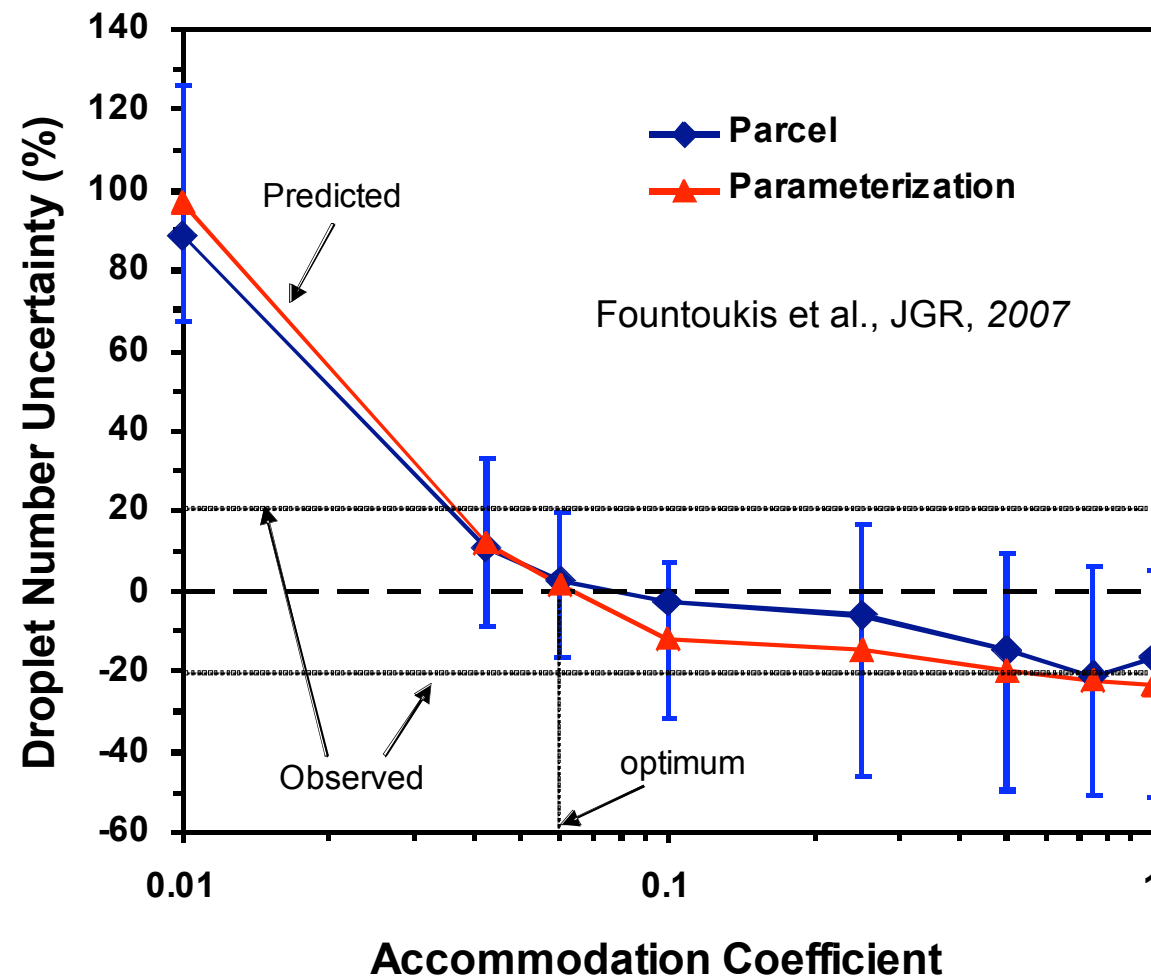
# CSTRIPE (2003) Coastal Stratocumulus



# What we have learned from CDNC closure studies

- ✓ “Mechanistic” parameterizations do a good job of capturing droplet number for nearly adiabatic clouds and... when you know the input (they capture the physics).
- ✓ Gaussian PDF of updraft velocity is sufficient to capture average CDNC.
- ✓ In fact, the average updraft velocity does *equally well* (and is much faster) in predicting CDNC, compared to integrating over a PDF.
- ✓ CDNC closure studies also can be used to infer a range of droplet growth kinetic parameters (“water vapor mass uptake coefficient”).

# Sensitivity of droplet closure to kinetic parameters (a)



ICARTT (2004)

Optimum closure  
obtained for  $\alpha$   
between  
0.03 - 1.0

Same range found  
in CSTRIFE,  
CRYSTAL-FACE  
and MASE studies

Parameterization  
and parcel model  
exhibit the same  
sensitivity.

# Issues of Parameterizations

- ✓ Highly idealized description of clouds. Most often they are adiabatic (few feedbacks)...
- ✓ They require information not currently found in most GCMs (cloud-base updraft velocity, aerosol chemical composition, etc.).
- ✓ Few processes are represented and are largely decoupled from other processes or interact at the "wrong scale" (e.g., dynamics, entrainment and autoconversion/drizzle)
- ✓ Very difficult to address... but not impossible.

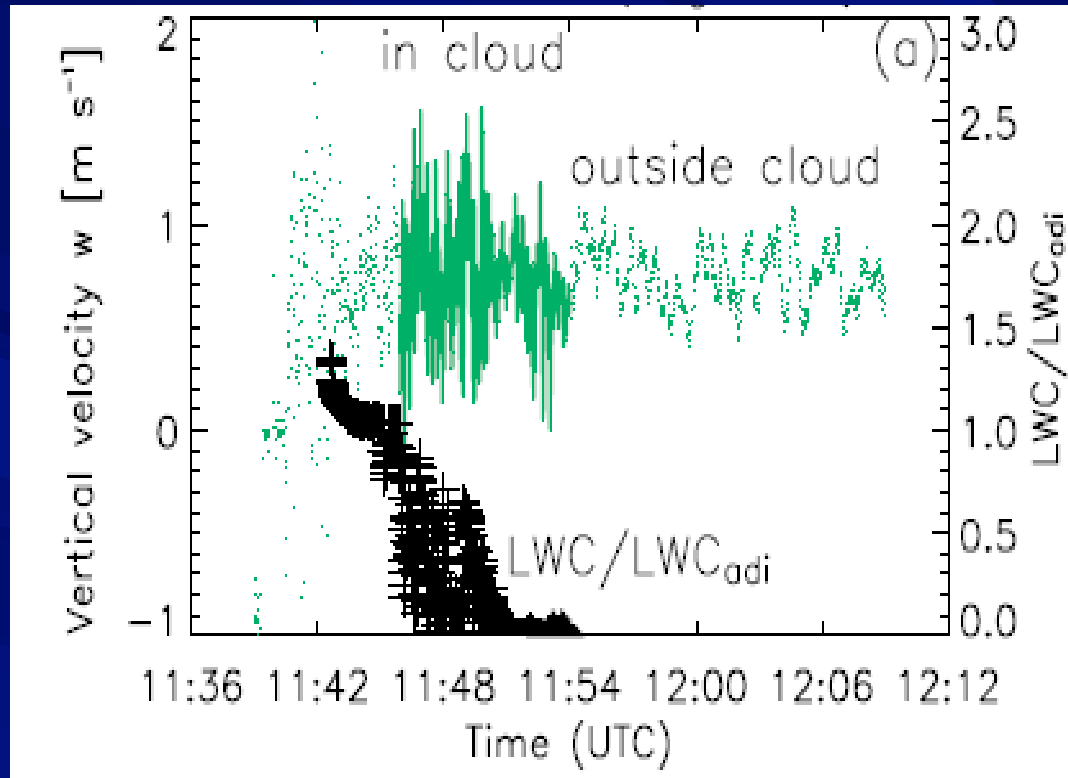


# Issues of Parameterizations

- ✓ Highly idealized description of clouds. Most often they are **adiabatic** (few feedbacks)...
- ✓ They require information not currently found in most GCMs (cloud-base updraft velocity, aerosol chemical composition, etc.).
- ✓ Few processes are represented and are largely decoupled from other processes or interact at the "wrong scale" (e.g., dynamics, entrainment and autoconversion/drizzle)
- ✓ Very difficult to address... but not impossible.



# Real Clouds are not Adiabatic



Peng, Y. et al. (2005). *J. Geophys. Res.*, 110, D21213

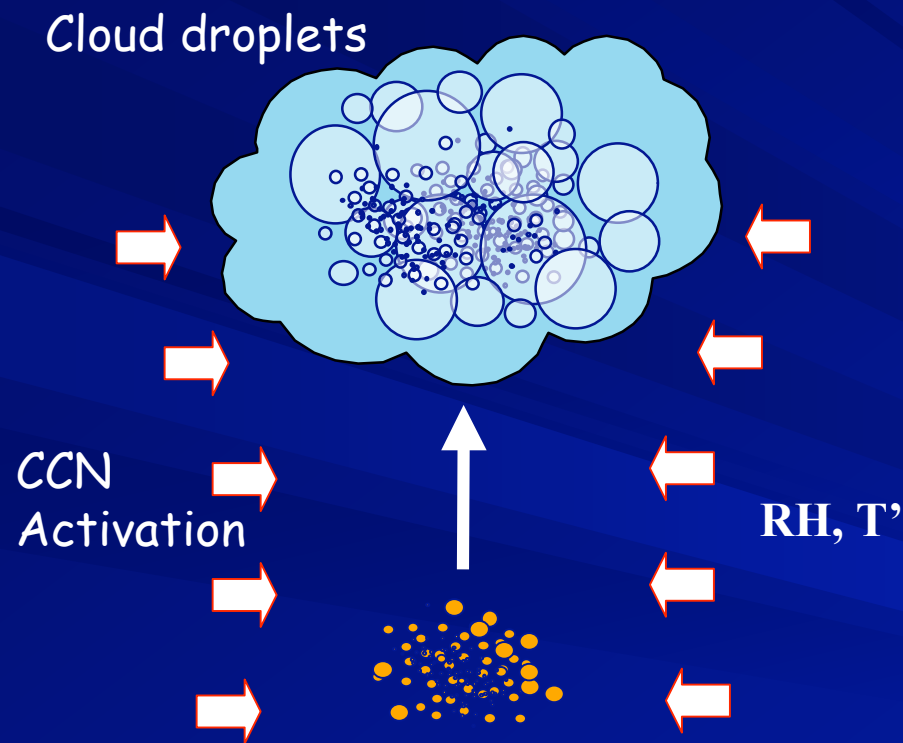
- Entrainment of air into cloudy parcels decreases cloud droplet number relative to adiabatic conditions
- In-situ observations often show that the liquid water content measured is lower than expected by adiabaticity.

Neglecting entrainment may lead to an overestimation of in-cloud droplet number biasing indirect effect assessments

**We need to include entrainment in the parameterizations**

# Barahona and Nenes (2007)

## Droplet formation in entraining clouds



- Cloud droplet formation is parameterized by integrating conservation principles in an ascending **entraining** air parcel.
- Equations are similar to adiabatic activation - only that mixing of outside air is allowed .
- "Outside" air with (RH, T') is assumed to entrain at a rate of  $e \text{ (kg air)(kg parcel)}^{-1}(\text{m ascent})^{-1}$

- The formulation is the first of its kind and can treat all the chemical complexities of organics (which we will talk about in a bit).
- Formulations available for either lognormal or sectional aerosol.

# Using the parameterization

Input:  $p_o$ ,  $T_o$ ,  $V$ ,  $e$ ,  $T-T'$ ,  $RH$ , aerosol & gas phase characteristics.

Compute CCN spectrum,  $F^s(s)$

Estimate  $s_{max}$

Solve for  $s_{max}$

$$\Delta = \left( s_{part}^4 - \frac{16A^2\alpha V}{9G} \right)$$

$\Delta \geq 0$   $\Delta < 0$

$$\frac{s_{part}}{s_{max}} = \left\{ \frac{1}{2} \left[ 1 + \left( 1 - \frac{16A^2\alpha V}{9Gs_{max}^4} \right)^{1/2} \right] \right\}^{1/2}$$

$$\frac{s_{part}}{s_{max}} = \min \left\{ \frac{2 \cdot 10^7 A}{3} s_{max}^{-0.3824}, 1.0 \right\}$$

$$\frac{\alpha V + eV \left[ \frac{\Delta H_v M_w}{RT^2} (T - T') - (1 - RH) \right]}{\gamma \frac{\pi}{2} \frac{\rho_w}{\rho_a}} - I_e(0, s_{max}) = ? 0$$

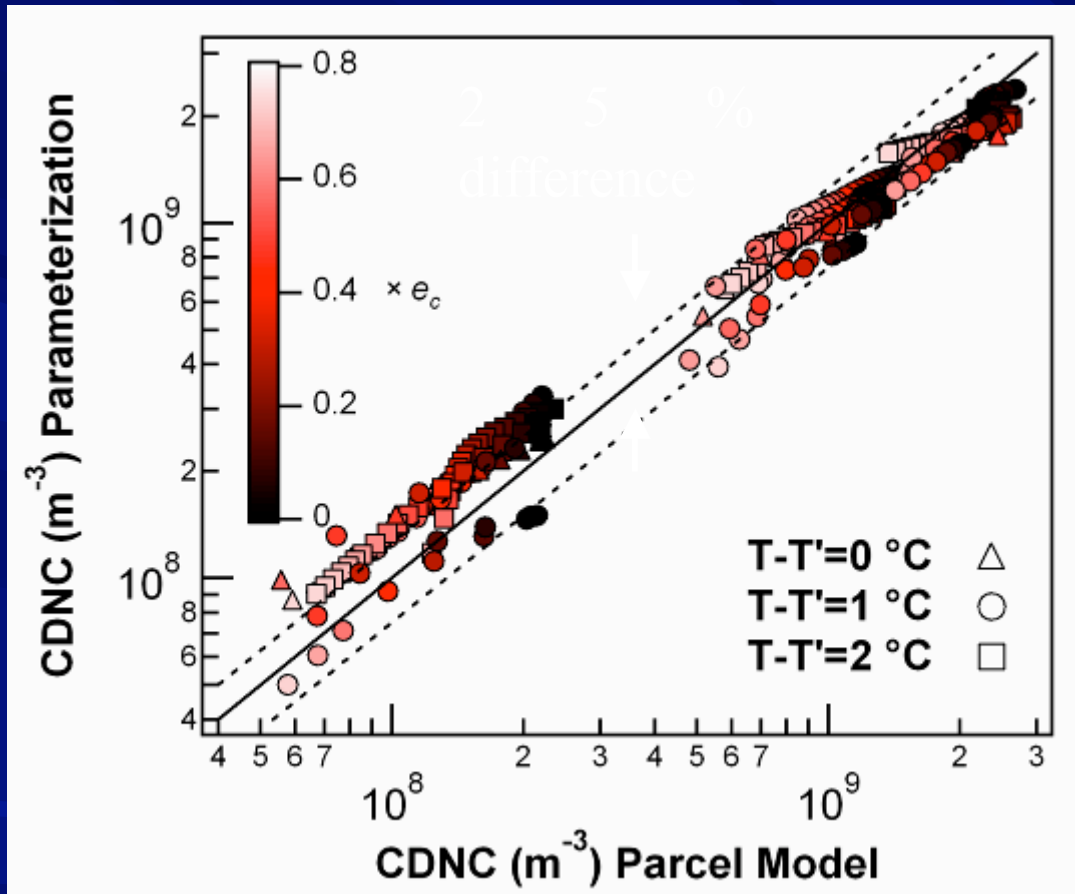
no

yes

Output:  $N_d$ ,  $s_{max}$   
droplet size distribution

Barahona and Nenes, (2007)

# Entraining Parameterization vs. parcel model



$V=0.1, 1.0$ , and  $5.0\text{ ms}^{-1}$ .  $T-T'=0, 1, 2\text{ }^{\circ}\text{C}$ .  
 $RH=60, 70, 80, 90\%$ . Background aerosol.  
2000 simulations.

- Comparison with detailed numerical model.
- Parameterization closely follows the parcel model
- Mean relative error  $\sim 3\%$ .
- $> 10^4$  times faster than numerical parcel model.

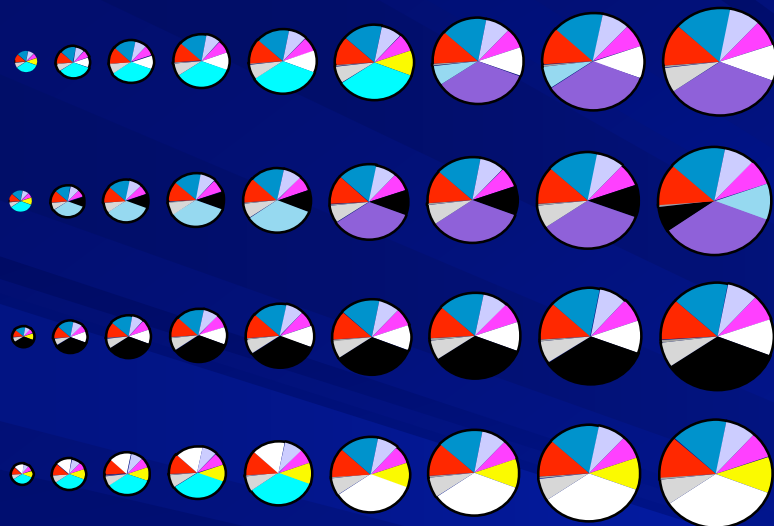
*Barahona and Nenes, (2007)*

# Issues of Parameterizations

- ✓ Highly idealized description of clouds. Most often they are adiabatic (few feedbacks)...
- ✓ They require information not currently found in most GCMs (cloud-base updraft velocity, complete aerosol chemical composition, etc.).
- ✓ Few processes are represented and are largely decoupled from other processes or interact at the "wrong scale" (e.g., dynamics, entrainment and autoconversion/drizzle)
- ✓ Very difficult to address... but not impossible.



# Aerosol Problem: Vast Complexity



## An integrated "soup" of

- Inorganics, organics (1000's)
- Particles can have uniform composition with size.
- ... or not
- Can vary vastly with space and time (esp. near sources)

Predicting CCN concentrations is a convolution of size distribution and chemical composition information.

CCN activity of particles is a strong function ( $\sim d^{-3/2}$ ) of aerosol dry size and (a weaker but important) function of chemical composition ( $\sim \text{salt fraction}^{-1}$ ).

# Aerosol Description: Complexity

## The ... headache of organic species:

- ✓ They can act as surfactants and facilitate cloud formation.
- ✓ They can affect hygroscopicity (add solute) and facilitate cloud formation.
- ✓ Oily films can form and delay cloud growth kinetics
- ✓ Some effects are not additive.
- ✓ Very difficult to explicitly quantify in any kind of model.

The treatment of the aerosol-CCN link is not trivial at all... but we'll talk about it on Wednesday.

# Overall Summary (for now)

- Droplet formation parameterizations are at the point where they can explicitly consider all the chemical “complexities” of CCN calculations and droplet growth kinetics.
- They can even begin incorporating effects of dynamics (entrainment, variable updraft).
- Observations should provide the “constraints” of organic properties (more on this on Wednesday).
- People developing aerosol-cloud parameterizations need to work very hard at linking them at the cloud-scale, starting off from idealized “conceptual” feedback models.
- A lot of work to do... but it's exciting and challenging (and not impossible).

THANK YOU!