

# Aerosol Representation in GCMs

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## Questions :

- 1) How are aerosol **properties** and **processes** represented in current GCMs? How do the models compare to each other?
- 2) What are the major **assumptions/simplifications** in the representations? What are the **weaknesses** in current representations?
- 3) Where are the trouble spots? Which **types** of aerosol, or which **regions** in which aerosols are not represented well, and/or simulated aerosols do not agree with measurements?
- 4) Following (2) and (3), how can current representations in GCMs be improved by **process studies**? What aerosol **properties** and/or **processes** need to be better understood and parameterized?

# Outline

- ▶ Aerosol Representations in GCMs
  - ❑ Size representation
  - ❑ Processes (sources & sinks)
  - ❑ Properties (physical, chemical & optical)
- ▶ Uncertainties in Aerosol Processes and Properties in GCMs
  - ❑ Primary emissions
  - ❑ Secondary aerosol formation
  - ❑ Wet removal
- ▶ How Can Aerosol Representation in GCMs be Improved?

# Host Models

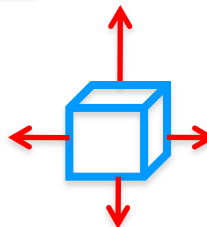
## Box Model

0D, no transport, no external forcing



## Parcel Model

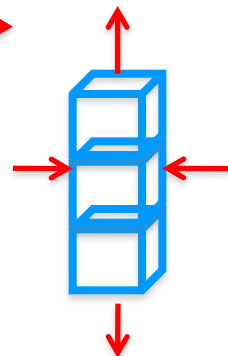
0D, moved by prescribed external forcing



## Single Column Model (SCM)

1D, vertical transport

External forcings (e.g., [campaign](#))



## Chemical Transport Model (CTM)

3D, regional or global

Met fields prescribed from GCMs or reanalysis,

[no feedbacks of aerosol & chemistry](#) on met fields

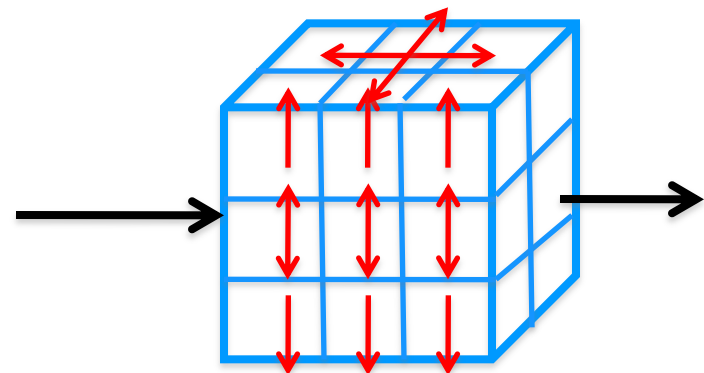
## Regional Circulation Model (e.g., WRF)

3D, regional

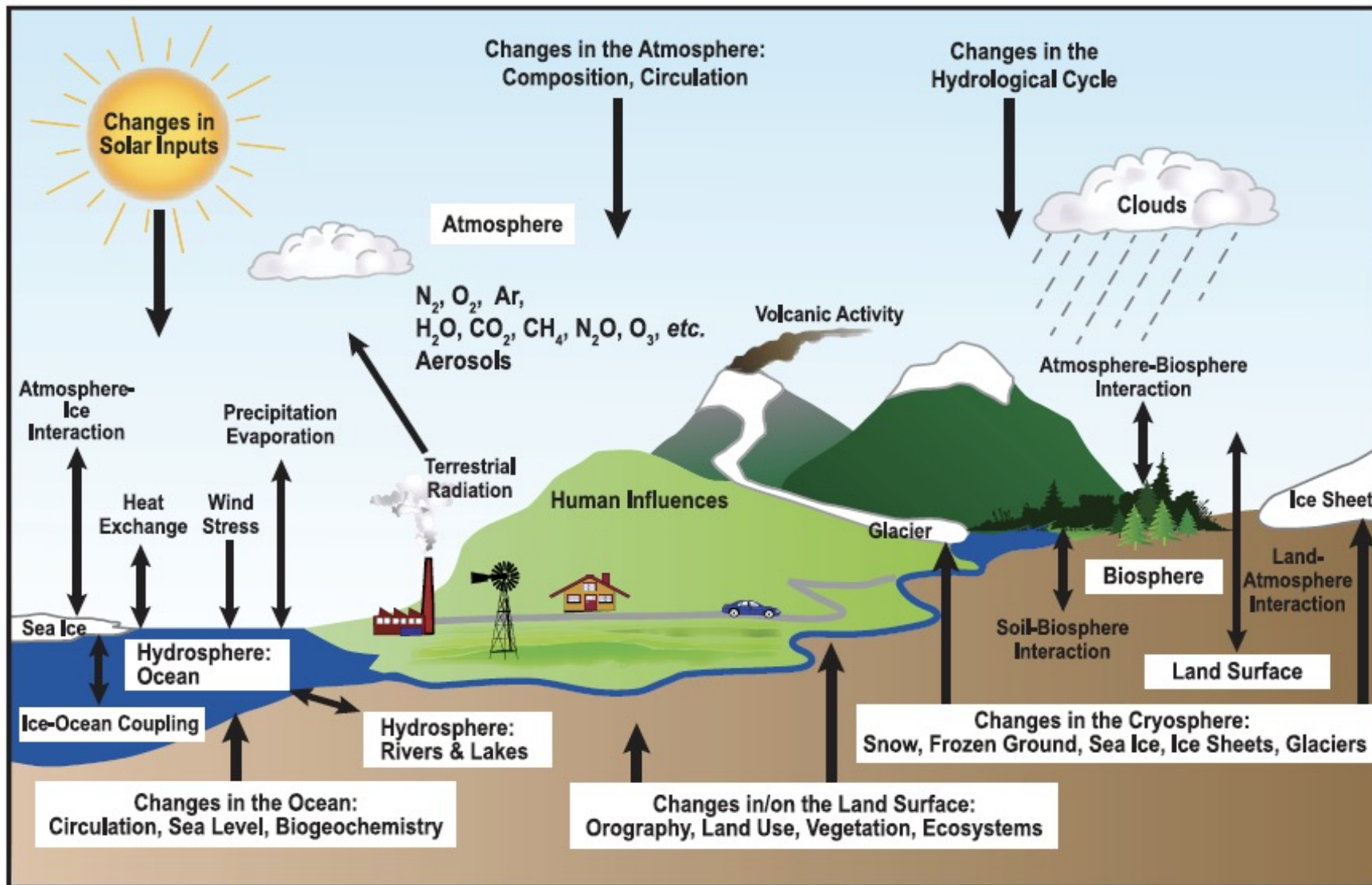
Met-fields predicted with boundary conditions from GCMs or reanalysis data

## Global Circulation Model (GCM)

3D, global, met-fields predicted, [online](#) or [offline](#) aerosol



# Components of the Climate System in GCMs



# Outline

- ▶ Aerosol Representations in GCMs
  - ❑ Size representation
  - ❑ Processes (sources and sinks)
  - ❑ Properties (physical, chemical, and optical)

# What is an aerosol?

- ▶ An *aerosol* (particulate matter) is a suspension of fine solid particles or liquid droplets in air.
- ▶ Size: 1 nm to ~ 10 micrometer in diameter.
- ▶ Composition: sulfate, nitrate, ammonium, organic carbon, black carbon, dust, sea salt.



Los Angeles smog on 29 January 2004 Photo by Alan Clements



Beijing haze

# Where do aerosols come from?

Primary



Sea Salt



Fire Smoke



Dust

Secondary



Sulfate



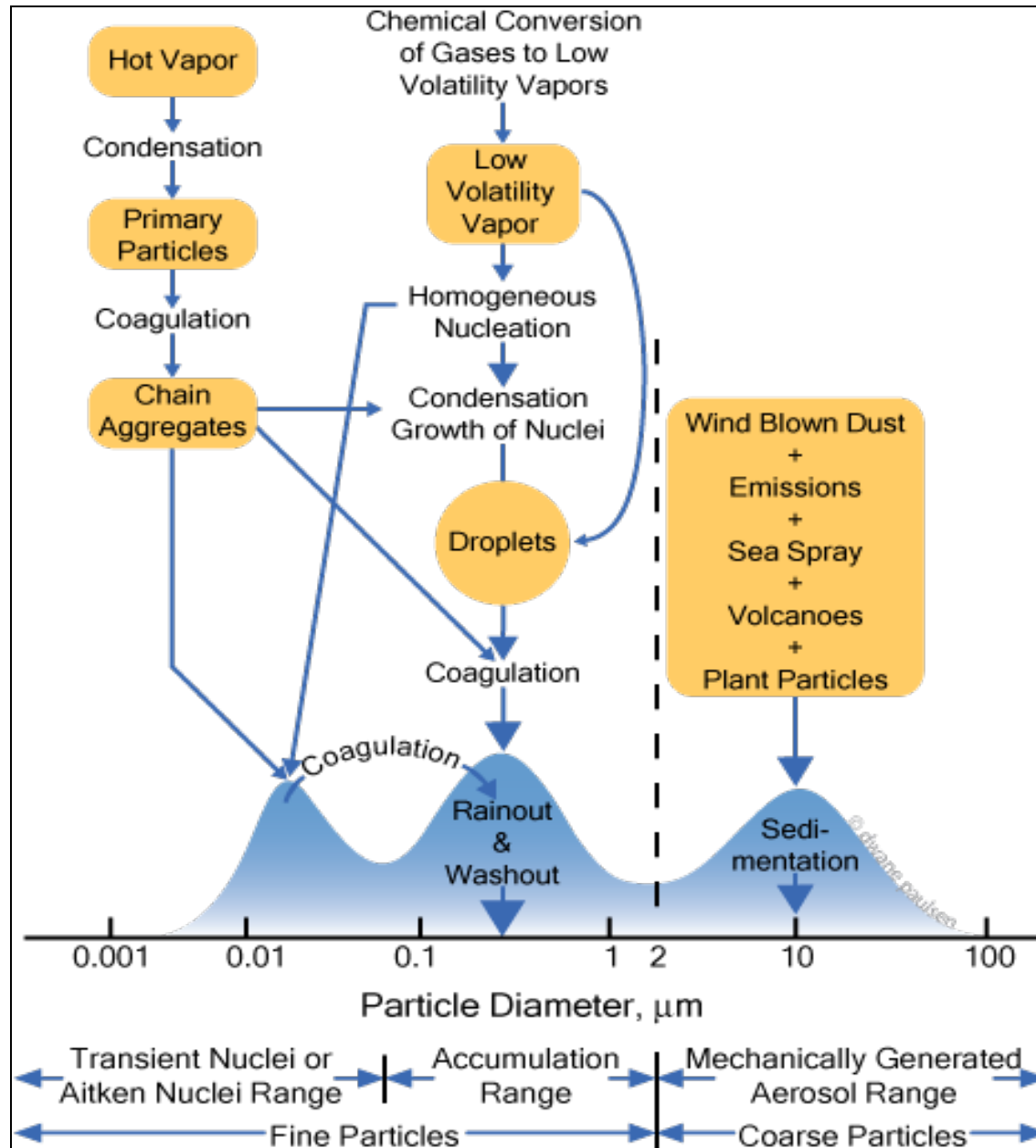
Nitrate



Secondary Organics



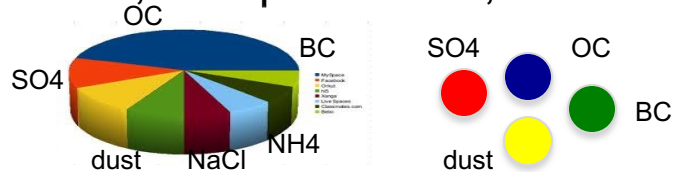
# Aerosol Size and Composition in the Atmosphere



# Aerosol Representation in GCMs

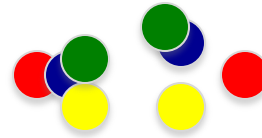
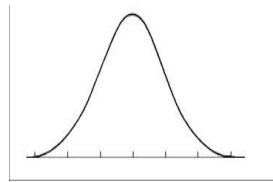
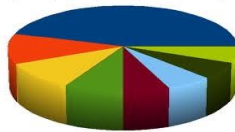
- **Bulk**

Mass based, size prescribed, external mixture assumed, no aerosol microphysics



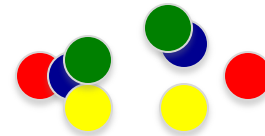
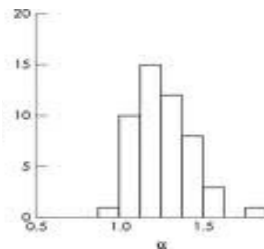
- **Moment-based (modal, 2-moment quadrature method of moments)**

Assumed functional form of size distributions (log-normal), predict evolution of size distribution by predicting mass (3<sup>rd</sup> moment) and number (0<sup>th</sup> moment) mixing ratio in each mode, assumed standard deviation of log-normal, internal mixture within modes and external mixture between modes, aerosol microphysics



- **Sectional (bin) method**

Split size distribution into bins, predict evolution of size distribution by predicting mass and number mixing ratio in each bins, aerosol microphysics



# Bulk Aerosol Module (BAM) in CAM3

---

sulfate

hydrophobic  
black  
carbon

sea salt 1

soil dust 1

ammonium

hydrophobic  
organic  
carbon

sea salt 2

soil dust 2

nitrate

hydrophilic  
black  
carbon

sea salt 3

soil dust 3

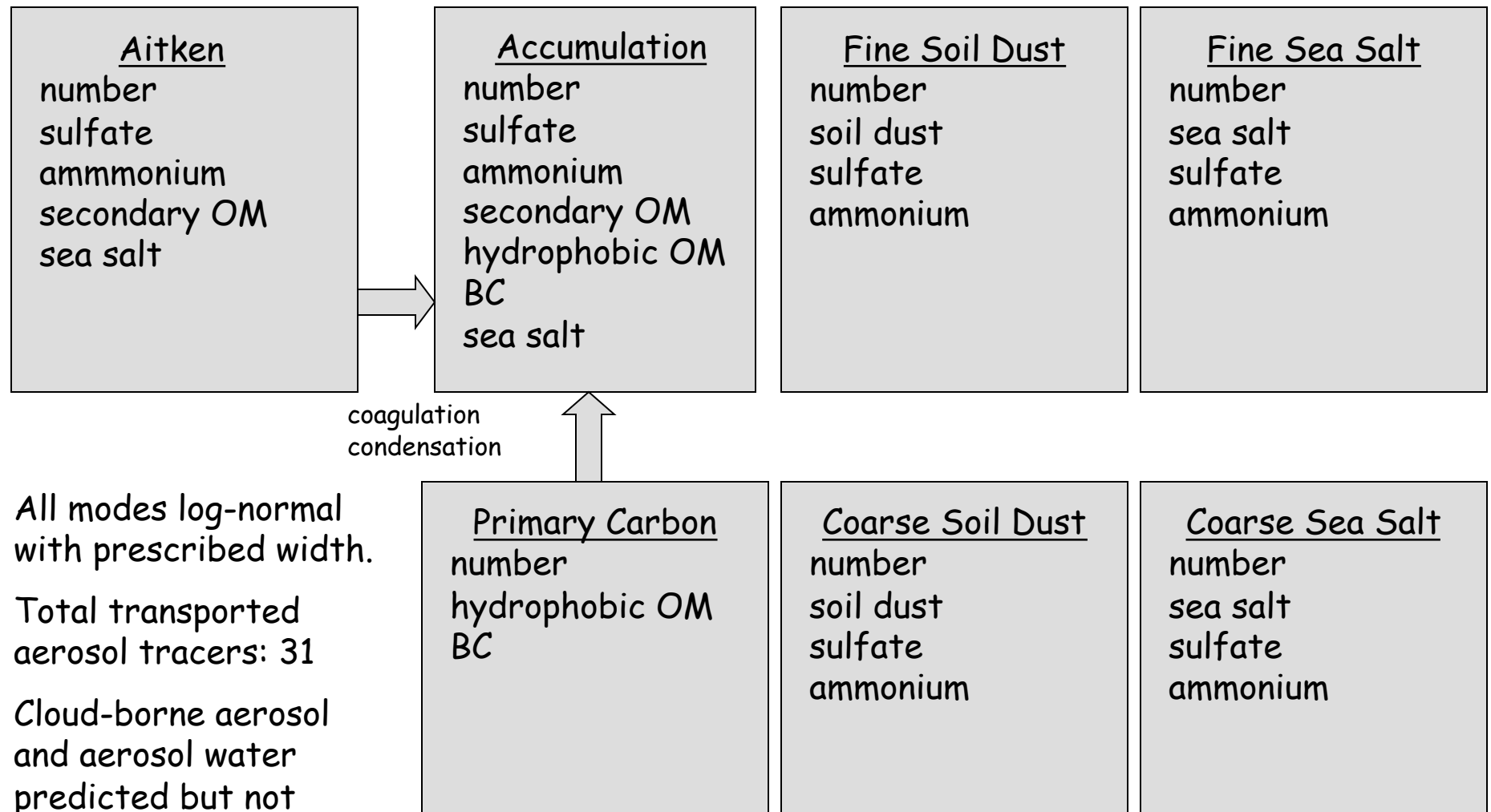
secondary  
organic  
carbon

hydrophilic  
organic  
carbon

sea salt 4

soil dust 4

# 7-Mode Modal Aerosol Module (MAM) in CESM1



coagulation  
condensation

All modes log-normal  
with prescribed width.

Total transported  
aerosol tracers: 31

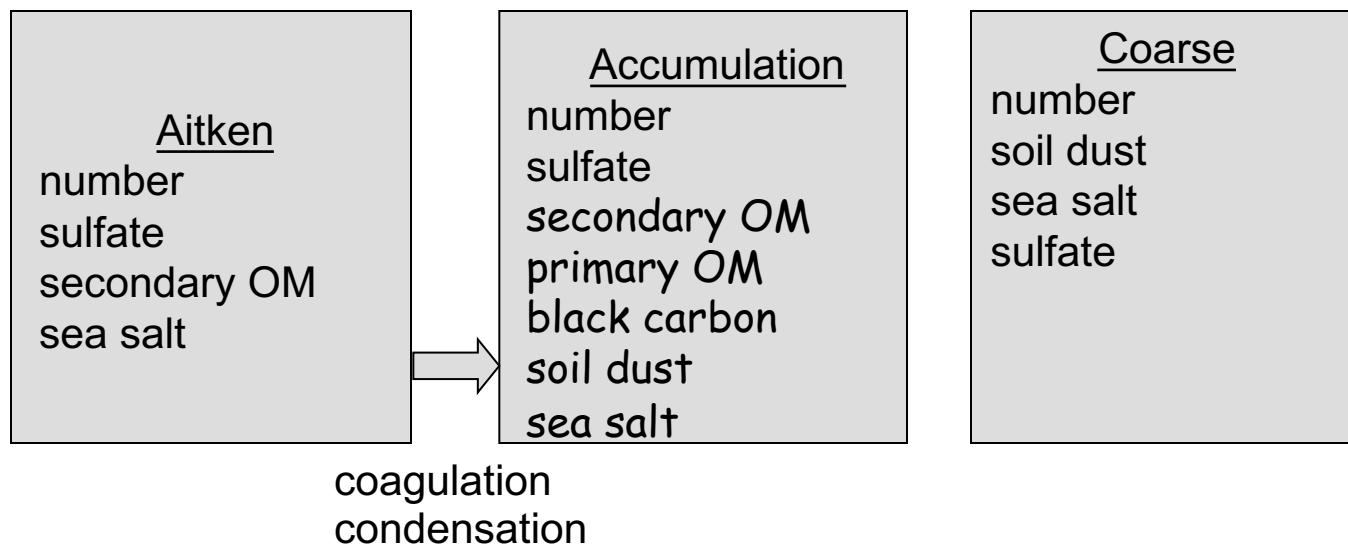
Cloud-borne aerosol  
and aerosol water  
predicted but not  
transported.

**Computer time is ~100% higher than BAM**

# Simplified 3-mode version of MAM in CESM1

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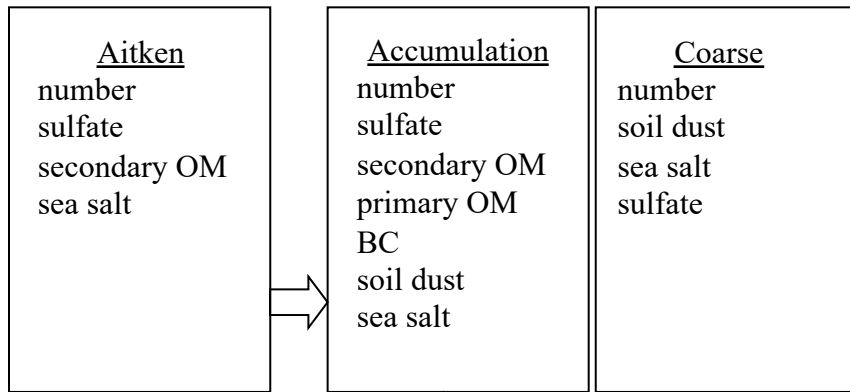
Assume primary carbon is internally mixed with secondary aerosol.  
Sources of dust and seasalt are geographically separate  
Assume ammonium neutralizes sulfate.



Total transported  
aerosol tracers: 15

**Computer time is 30% higher than BAM**

# 4-mode version of MAM4 in CESM2/E3SM



coagulation  
condensation

**Primary Carbon**  
number  
primary OM  
BC

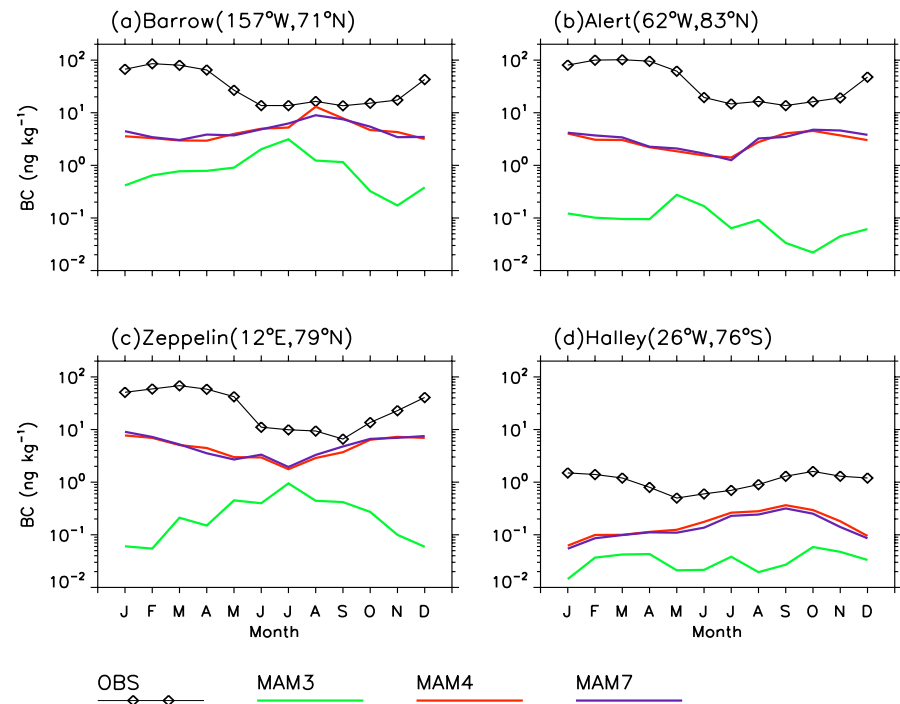
All modes log-normal with prescribed width.

Total transported aerosol tracers: **18**

Cloud-borne aerosol and aerosol water predicted but not transported.

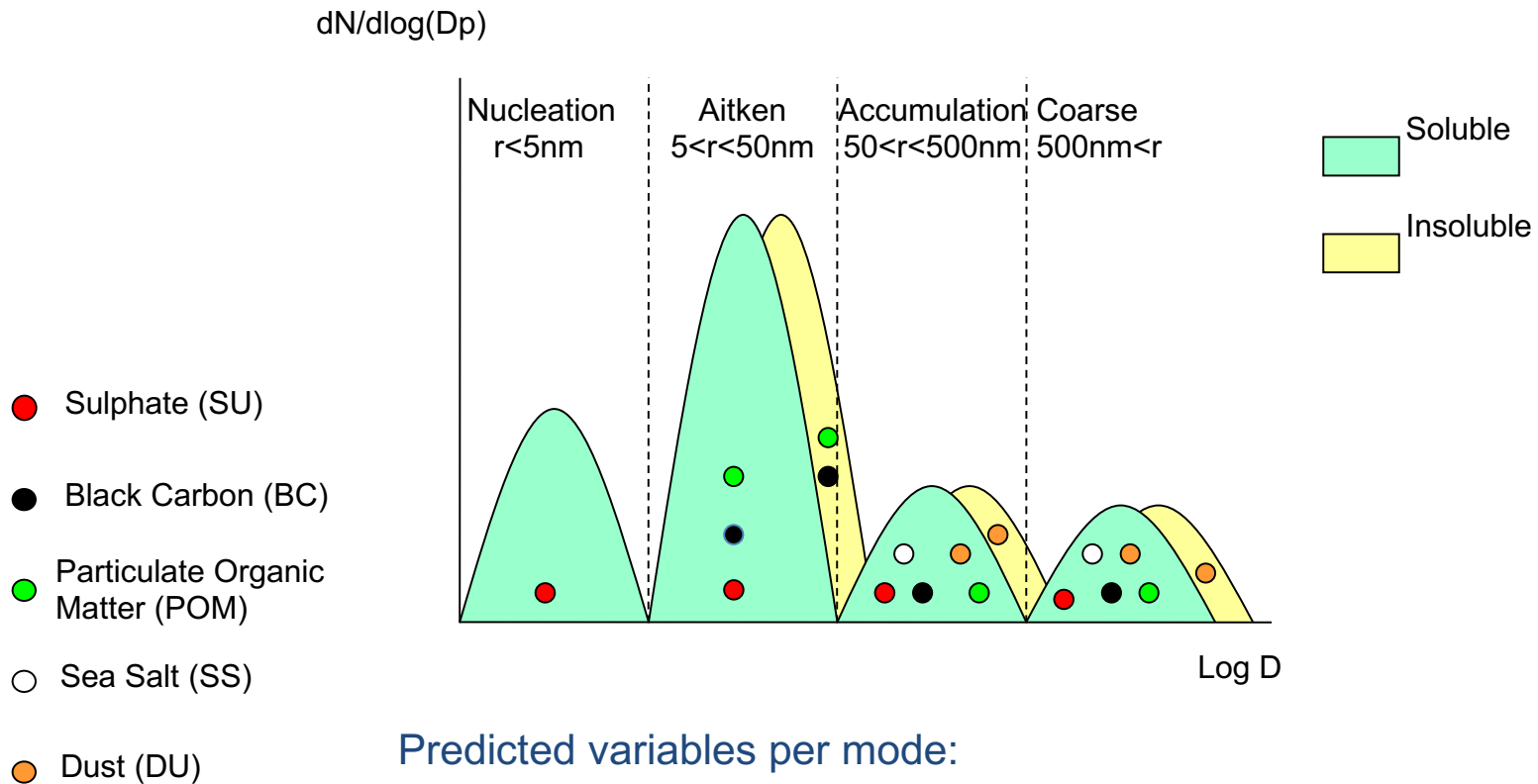
Adding a primary carbon mode in MAM4, and computer time is ~10% higher than MAM3

**MAM4 significantly increases (and improves) BC concentration in Arctic compared to MAM3 (and agrees with MAM7).** The remaining underestimation of BC concentration in Arctic in MAM4 is very likely due to wet scavenging by precipitation and/or emissions.



Comparison of model results (MAM3, MAM4, MAM7) with seasonal BC observations at surface in high latitudes

# M7 (ECHAM-HAM)

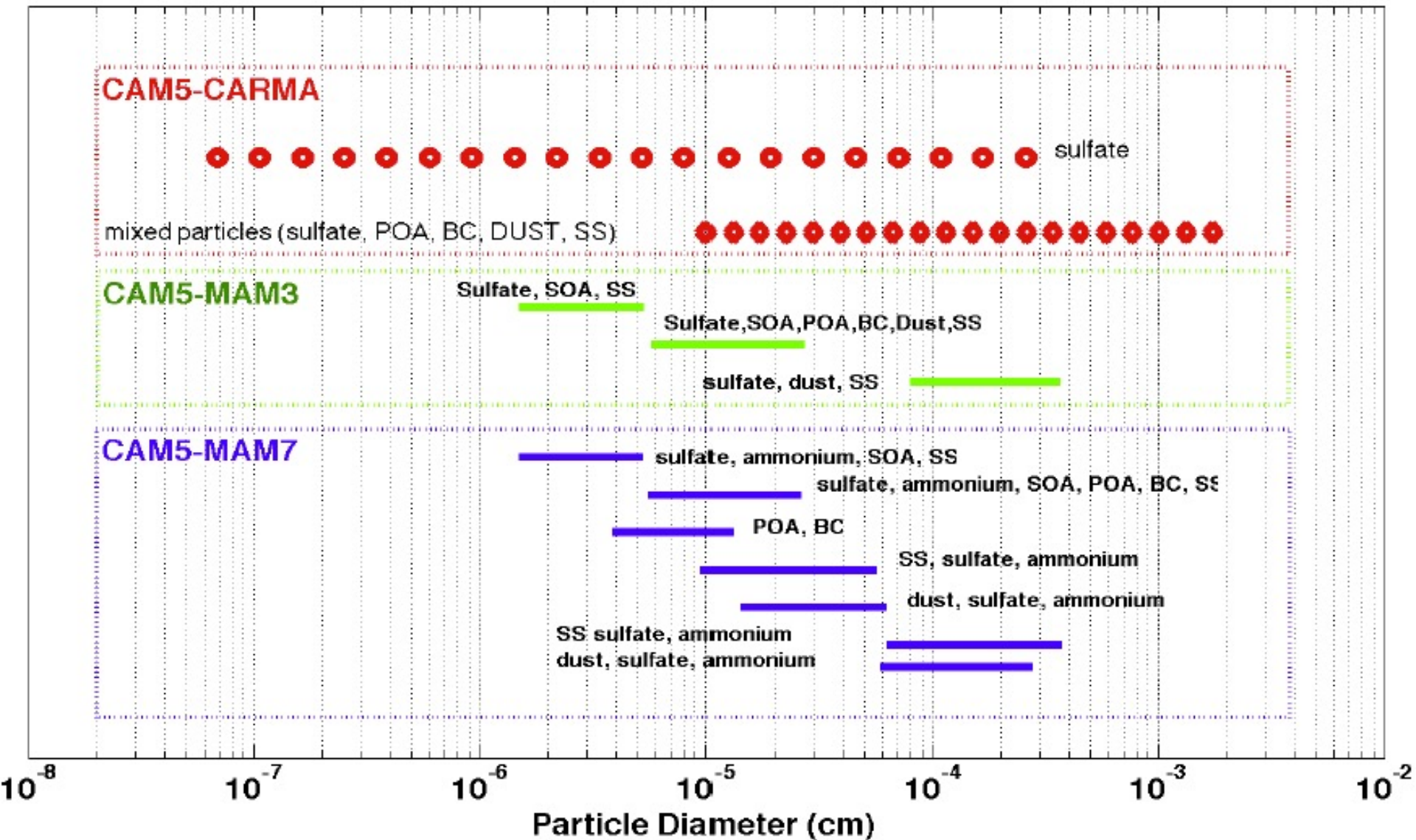


Predicted variables per mode:

One **number** concentration and the **mass** mixing ratios of each chemical compound

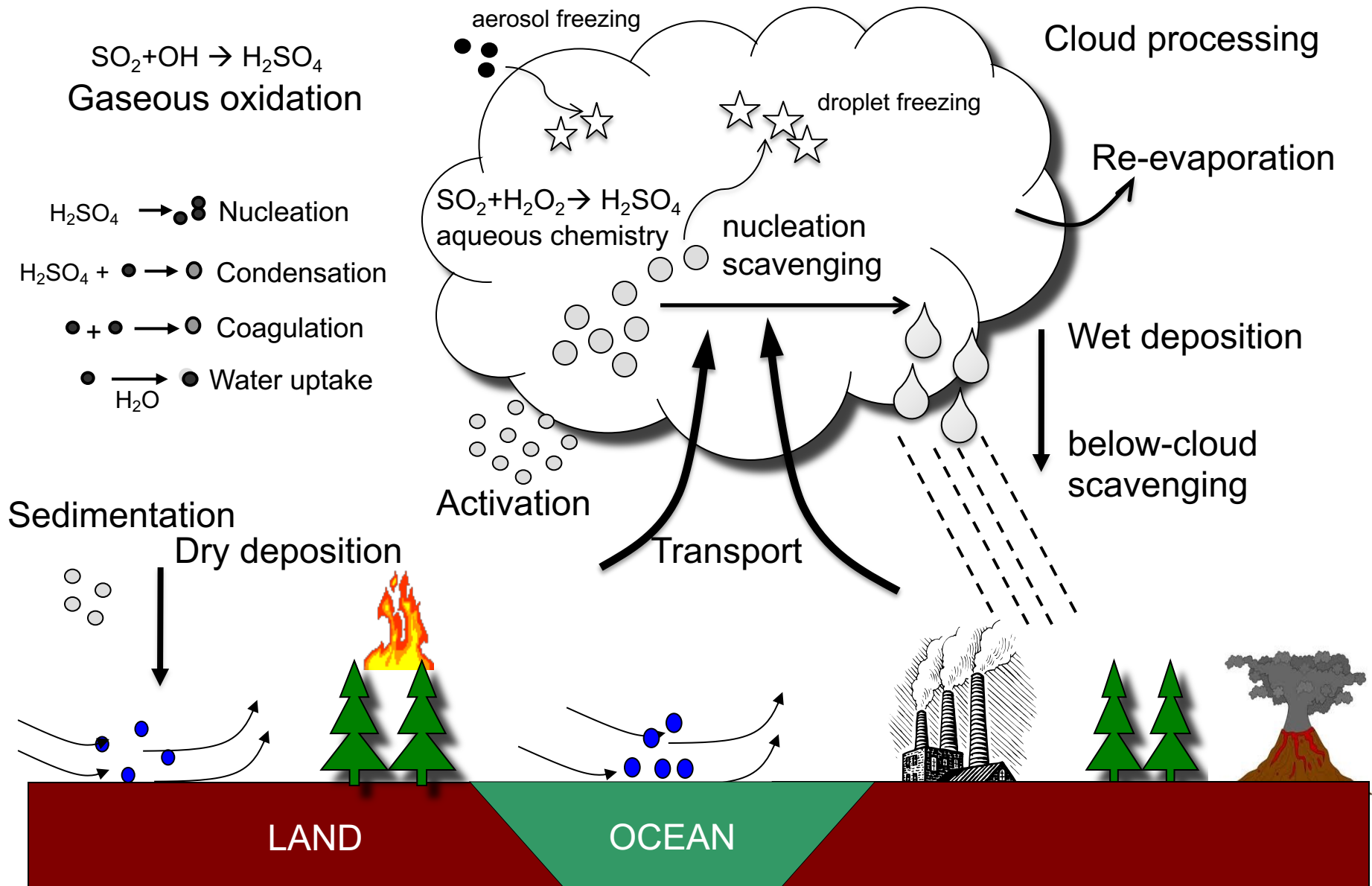
Courtesy of Declan O 'Donnell

# Sectional Aerosol Treatment in CESM-CAM5



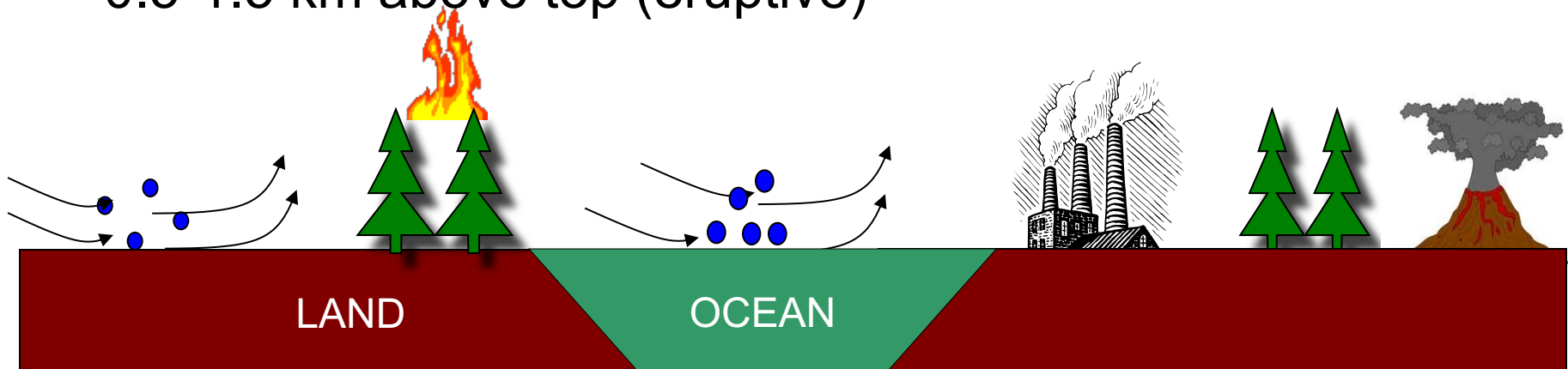


# Global Aerosol Cycles

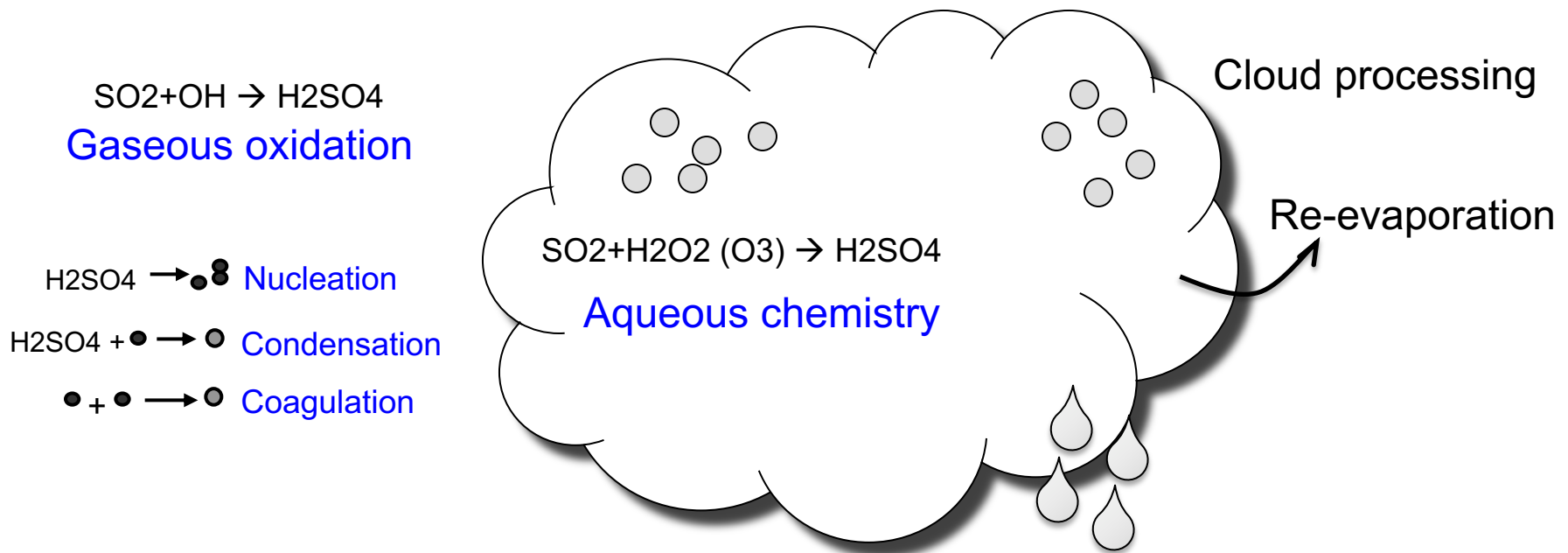


# Aerosol Processes : Primary Emission

- **Offline** emission mass flux (for  $\text{SO}_2$ , POA, BC, DMS): prescribed from inventory
- **Online** emission mass flux (for dust, sea salt, ocean POA):  $f(u, r, \text{soil moisture or ocean concentrations})$
- **Injection Heights:**
  - Most emission fluxes applied at surface (lowest grid box), power plant  $\text{SO}_2 \sim 100\text{-}300\text{ m}$ ;
  - Biomass burning applied an injection height profile;
  - Volcanic emission at  $2/3\text{-}1/1$  of volcano top (continuous) and  $0.5\text{-}1.5\text{ km}$  above top (eruptive)



# Aerosol Processes (Secondary SO<sub>4</sub> Formation)



**All models:** include gas and aqueous phase SO<sub>2</sub> chemistry

**Bulk models:** assume instantaneous conversion of H<sub>2</sub>SO<sub>4</sub> (g) to sulfate,  
no nucleation/condensation/coagulation

**Modal (bin) models:**

Nucleation of H<sub>2</sub>SO<sub>4</sub>/NH<sub>3</sub>/H<sub>2</sub>O : form new particles

Condensation of H<sub>2</sub>SO<sub>4</sub>/NH<sub>3</sub>/SOA(g) : thermo-dynamical transport, increase mass

Coagulation : reduce number

Aqueous chemistry: bulk chemistry depends on pH values, produces mass distributed to aerosol modes (bins) in proportional to number activated from modes (bins)

# Aerosol Processes (SOA Formation)

## Earlier Approaches:

SOA formed by assuming a fixed 15% SOA yield from the monoterpene emissions estimates of Guenther et al. (1995), with immediate non-volatile SOA production. Treat formed SOA as primary organics. ~15 Tg OC/yr.

## Newer Approaches:

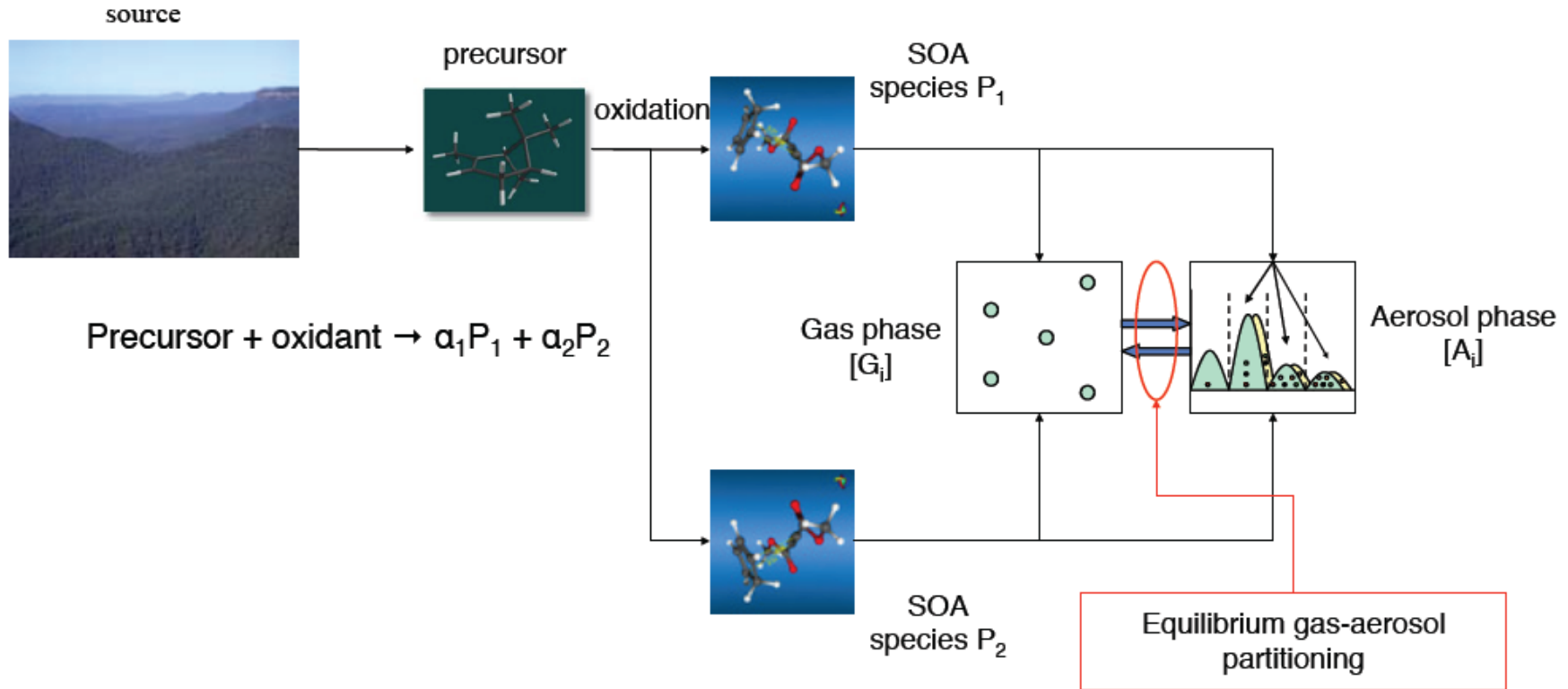
Prognostic SOA scheme with explicit gas/aerosol partitioning

**One step of more complexity** : assumed fixed yields for biogenic and anthropogenic VOCs to form SOA (g). Treat SOA (g) as primary gas emission at surface. explicit gas/aerosol partitioning of SOA (g) -- **CAM5**.

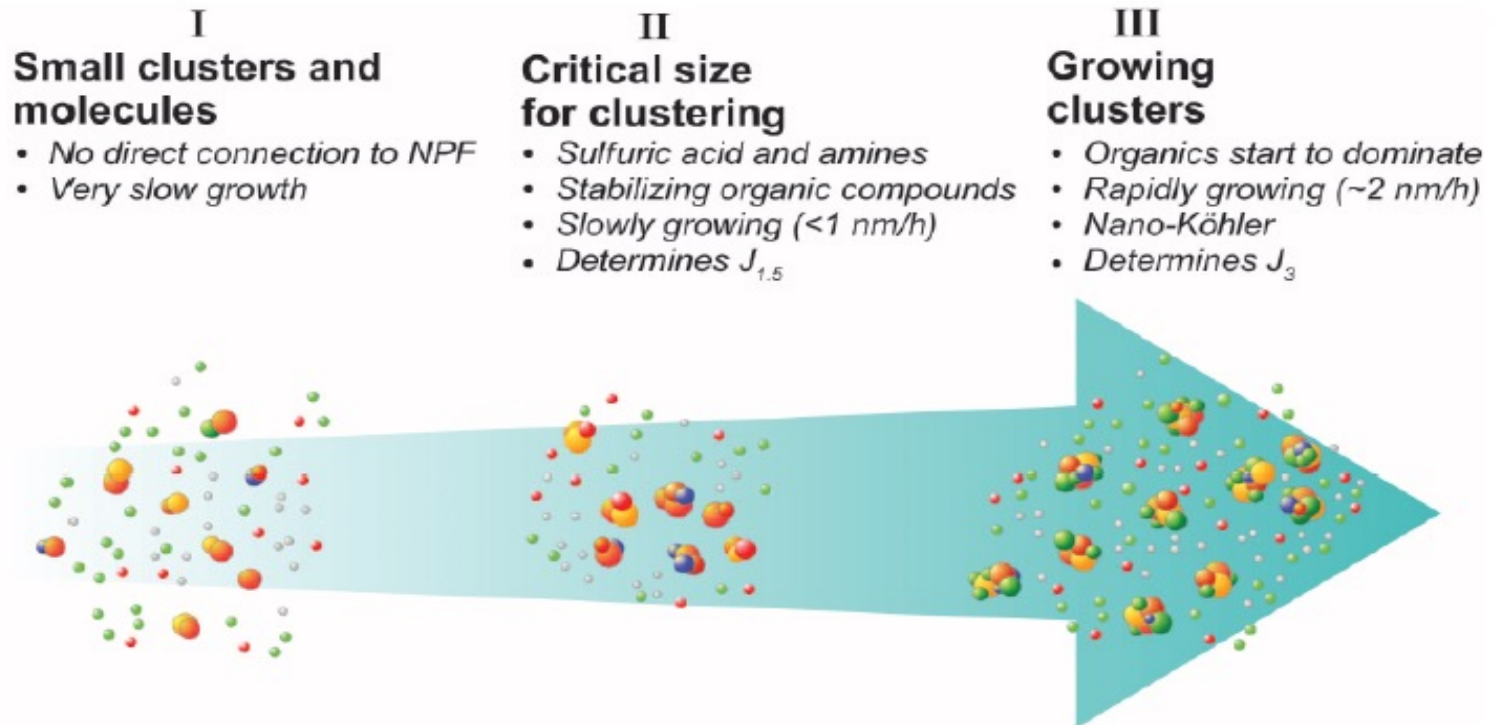
**Two steps of more complexity** : primary VOCs emission and oxidation in atmosphere to form SOA (g). explicit gas/aerosol partitioning of SOA (g) – **ECHAM & GISS**.

**Multi-generational aging** of organic vapors (VBS scheme) & treating SOA as **non-volatile semi-solid** (glassy) – CAM5/CAM6

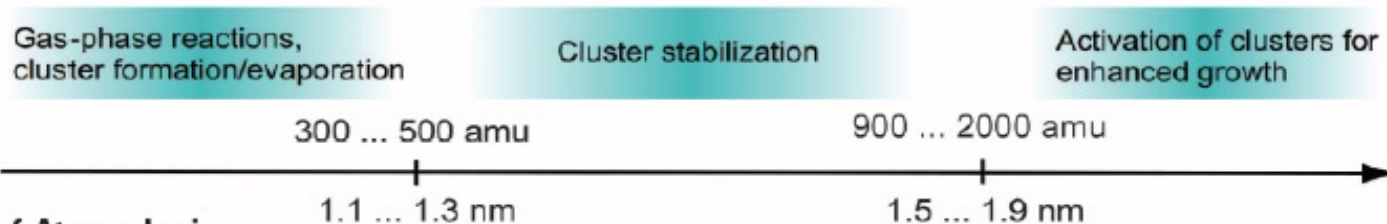
# SOA scheme in ECHAM-HAM2



# Aerosol Processes (Nucleation)



## Key processes:

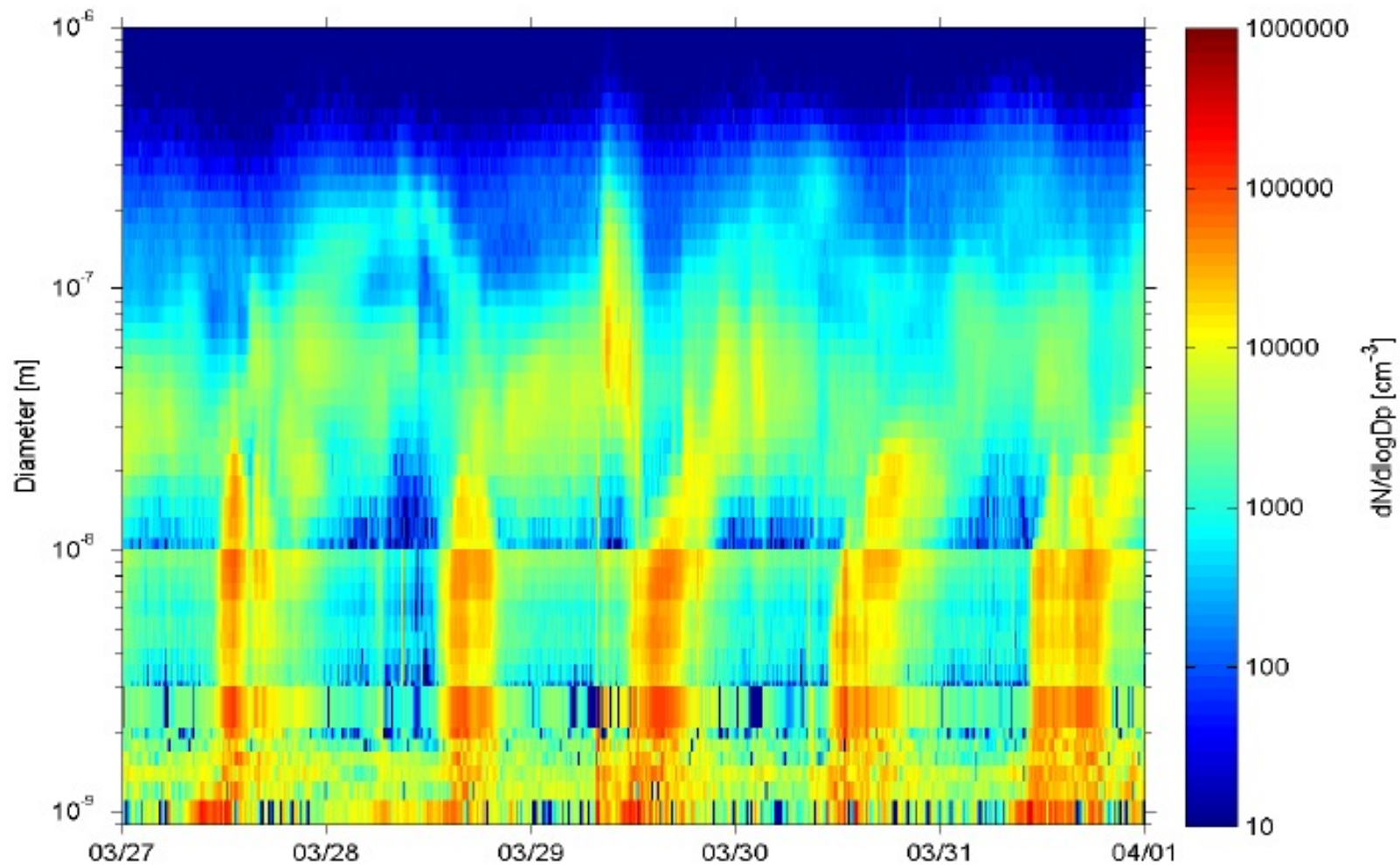


## Direct Observations of Atmospheric Aerosol Nucleation

Markku Kulmala,<sup>1</sup> Jenni Kontkanen,<sup>1</sup> Heikki Junninen,<sup>1</sup> Katrianne Lehtipalo,<sup>1</sup> Hanna E. Manninen,<sup>1</sup> Tuomo Nieminen,<sup>2,3,4</sup> Tuukka Petäjä,<sup>1</sup> Mikko Sipilä,<sup>1</sup> Siegfried Schobesberger,<sup>1</sup> Pekka Rantala,<sup>1</sup> Alessandro Franchin,<sup>5</sup> Tuula Jokinen,<sup>1</sup> Emma Järvinen,<sup>1</sup> Mikko Aijälä,<sup>1</sup> Juhani Kangasluoma,<sup>1</sup> Jani Hakala,<sup>1</sup> Pasi P. Raito,<sup>1</sup> Pauli Paasonen,<sup>1</sup> Jyri Mikkilä,<sup>1</sup> Joona Vanhanen,<sup>2</sup> Juhani Raitta,<sup>1</sup> Riinette Hakola,<sup>1</sup> Jilla Makkonen,<sup>1</sup> Taina Ruuskanen,<sup>1</sup> Roy L. Mauldin III,<sup>1,6</sup> Jonathan Duplissy,<sup>1</sup> Hanna Vehkamäki,<sup>1</sup> Jaana Bäck,<sup>1</sup> Aki Korhonen,<sup>1</sup> Riina Rippen,<sup>1</sup> Theo Kurtén,<sup>1,9</sup> Barry V. Johnston,<sup>10</sup> James R. Smith,<sup>11,12</sup> Mikael Ehn,<sup>1,13</sup> Thomas F. Mentel,<sup>12</sup> Kari E. J. Lehtinen,<sup>14</sup> Ari Laaksonen,<sup>15</sup> Veli-Matti Kerminen,<sup>1</sup> Douglas R. Worsnop<sup>1,17,18</sup>

**Direct Observations of Atmospheric Aerosol Nucleation**  
 Markku Kulmala *et al.*  
*Science* **339**, 943 (2013);  
 DOI: 10.1126/science.1227385

# Aerosol Processes (Nucleation)



# Aerosol Processes (Aging)

## Earlier Approaches:

Prescribed 1-2 days aging time from hydrophobic to hydrophilic for OC and BC

## Newer Approaches:

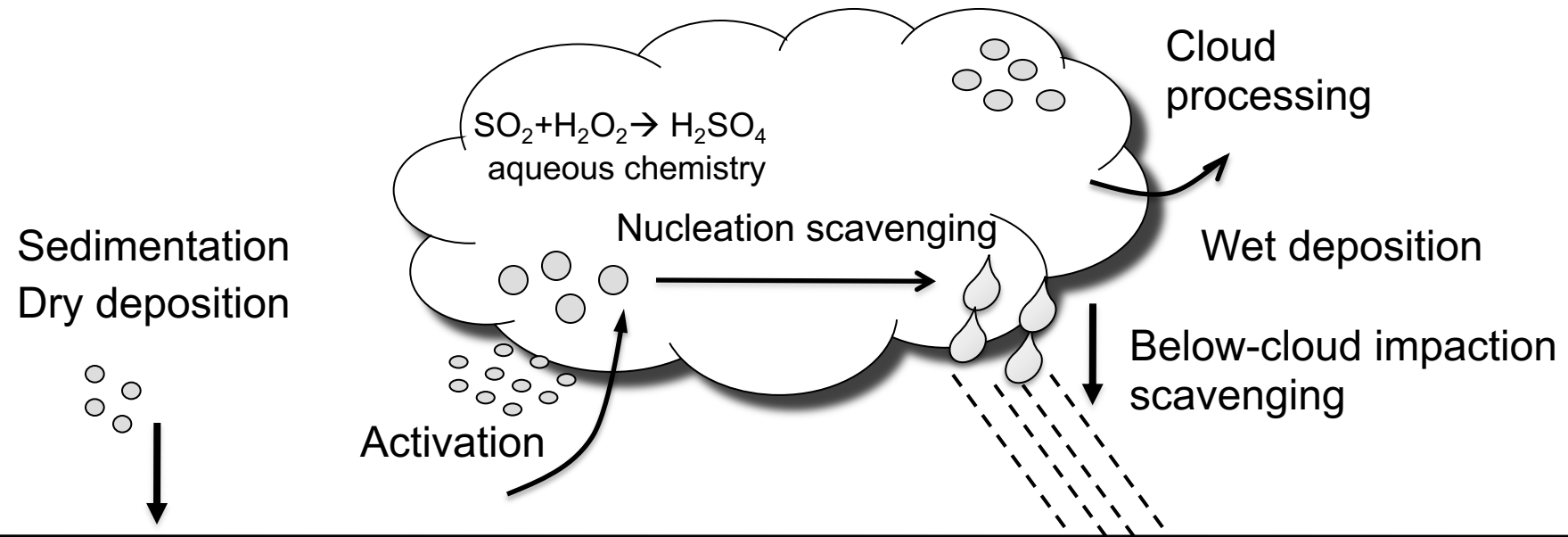
Aging depending on coating of soluble materials : primary OC/BC aged to mixed mode depending on the surface coating of soluble materials (SO<sub>4</sub>, NH<sub>4</sub>, SOA, NO<sub>3</sub>) – CAM5-MAM4/7, ECHAM & GISS



# Aerosol Processes (Water Uptake)

- CAM5:** Thermodynamical equilibrium based on K-Kohler theory; volume mean K from each component for each mode; Hysteresis (averaging upper and lower curves between deliquesce and crystallization RH)
- GISS:** Thermodynamical equilibrium based on EQSAM; E. Lewis formula for sea salt
- ECHAM:** Old: ZSR method (Zdanovskii-Stokes-Robinson)  
New: K-Kohler theory

# Aerosol Processes (Removal)



**Dry Deposition** : most models use the classical serial resistance approach.

$$F_d = C\rho_a v_d \quad v_d = v_g + \frac{1}{r_a + r_s}$$

**Wet Deposition** : most models calculate 1<sup>st</sup> order loss rate of cloud water with cloud water and precipitation rate:  $P_r / Q_c$

Earlier models: prescribed soluble (activated) fraction depending on aerosol species (in-cloud nucleation scavenging);  
below-cloud scavenging coefficient ( $c_0$ ) assumed

Improved models:

**CAM5** : predicting **aerosols in cloud water** (through activation, aqueous chemistry, diffusion, and evaporation); size dependent of  $c_0$

**Caveat**: very simple cloud microphysics in convective clouds

# Aerosol Properties in GCMs

- **Mass and composition**
  - interactive SO<sub>4</sub>, POA, SOA, BC, dust and sea salt,
  - ammonium, nitrate often not treated (CAM, ECHAM)
- **Size distribution**
  - variable for each mode, bin
- **Mixing state**
  - internal and external mixture
- **Radiative properties and refractive index**
  - parameterized in terms of bulk refractive index and wet effective radius or look-up tables
- **Hygroscopicity**
  - volume average of  $K$  from components in each mode

# Outline

- ▶ Aerosol Representations in GCMs (CAM, GISS, ECHAM)
  - ❑ Size representation
  - ❑ Processes (sources, sinks)
  - ❑ Properties (physical, chemical, optical)
- ▶ Uncertainties in Aerosol Processes in GCMs
  - ❑ Primary emissions
  - ❑ Secondary aerosol formation
  - ❑ Wet removal

# Uncertainties in Aerosol Processes in GCMs

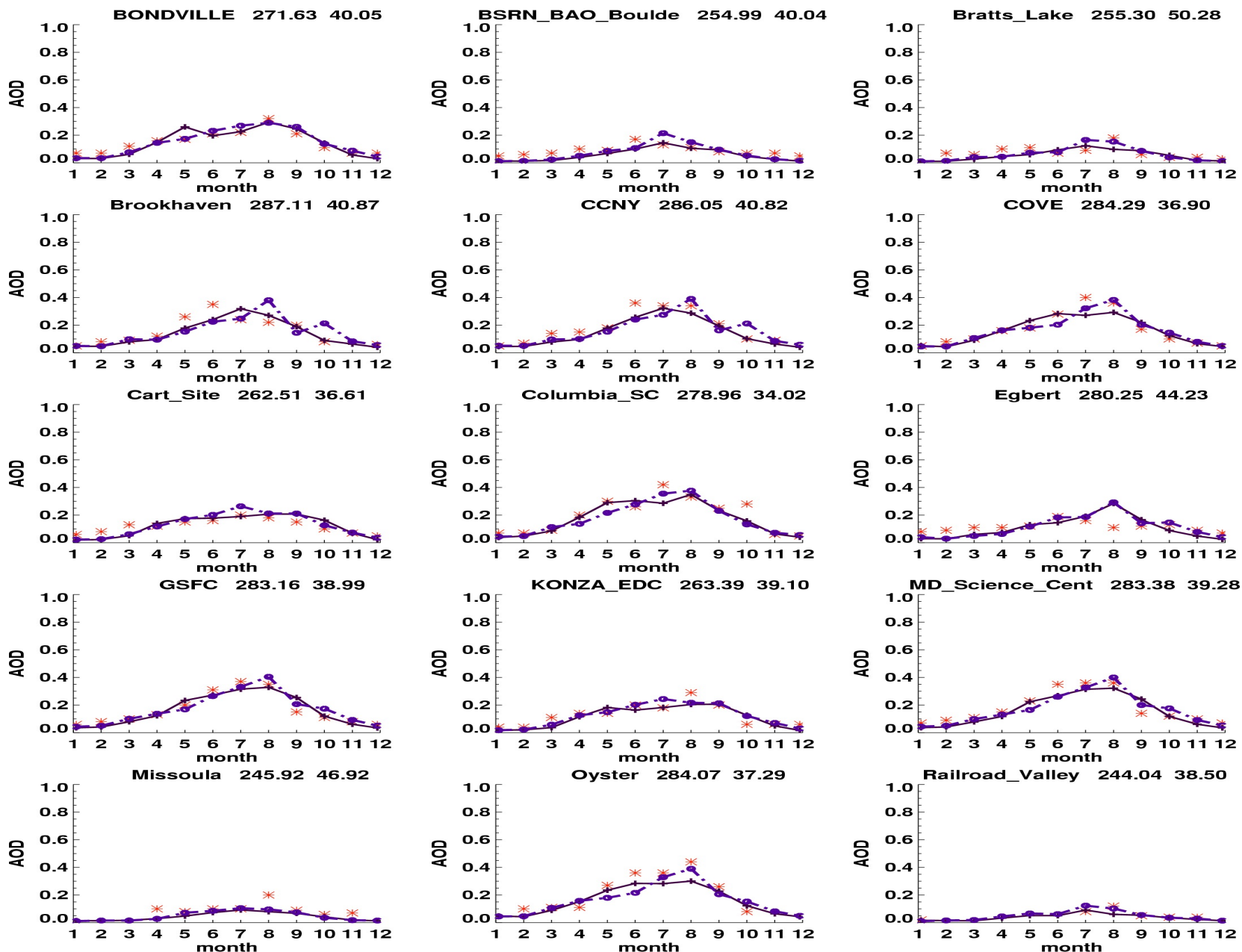
- **Primary emissions**: mass flux, size distribution, injection height
  - **Anthropogenic emissions in developing countries**
  - **Biomass burning emissions** (e.g., GFED)
  - **Mineral dust and sea salt emissions**
    - Dust: 1640 Tg/yr  $\pm$  50% (AEROCOM-A);  
3200 Tg/yr (CAM5)
    - Sea salt: 6280 Tg/yr  $\pm$  200% (AEROCOM-A);  
5000 Tg/yr (CAM5)

# Effect of Primary Emissions

**AOD**      **North\_America**

**OBS \***

**CAM3mod-**    **CAM7mod-**



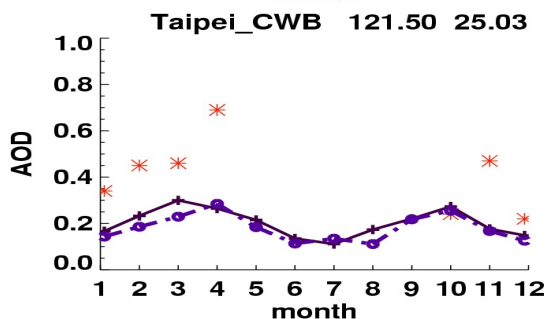
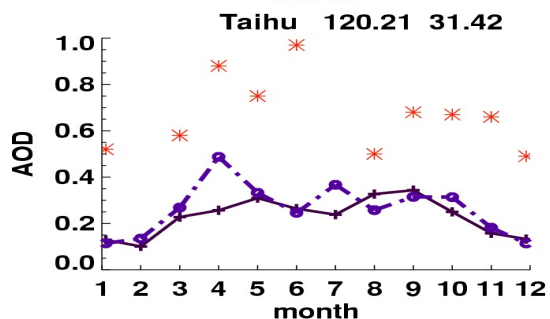
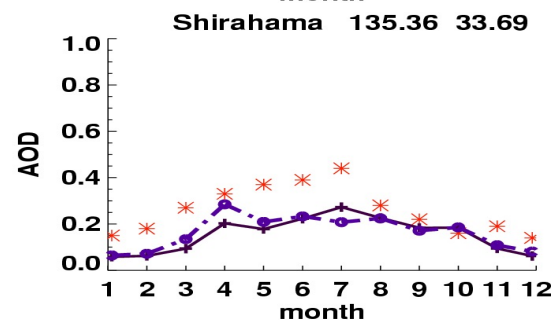
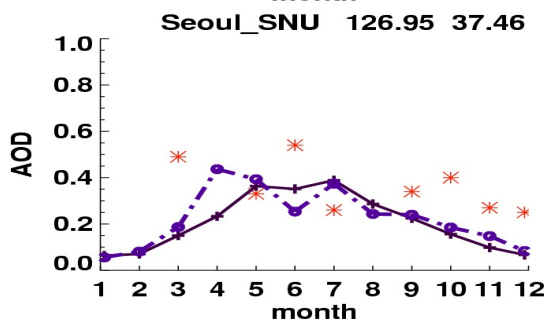
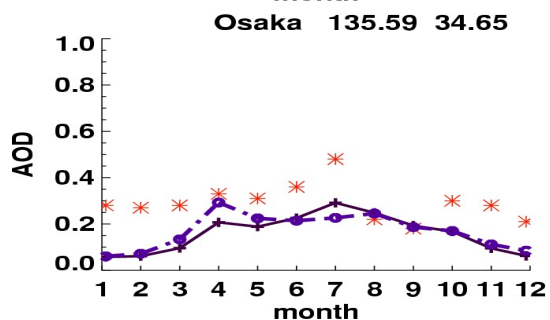
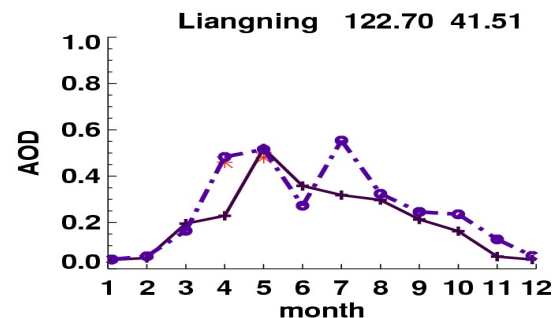
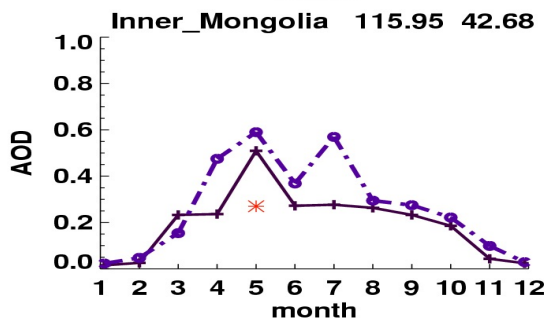
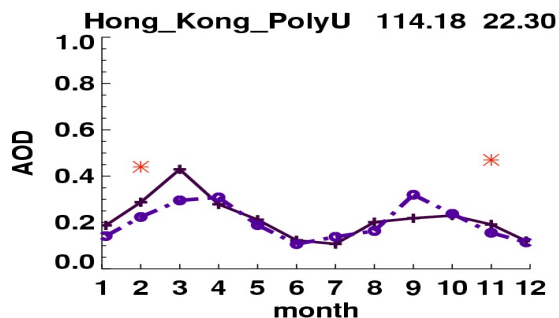
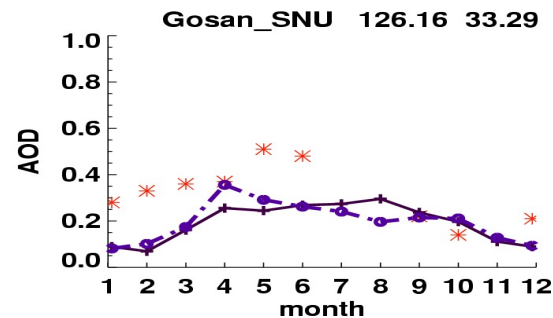
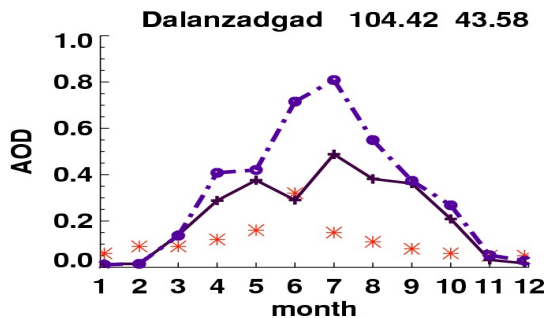
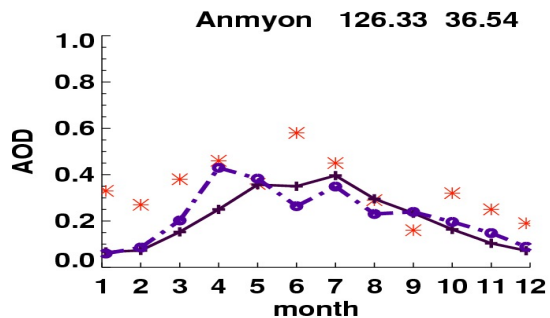
# Effect of Primary Emissions

## AOD

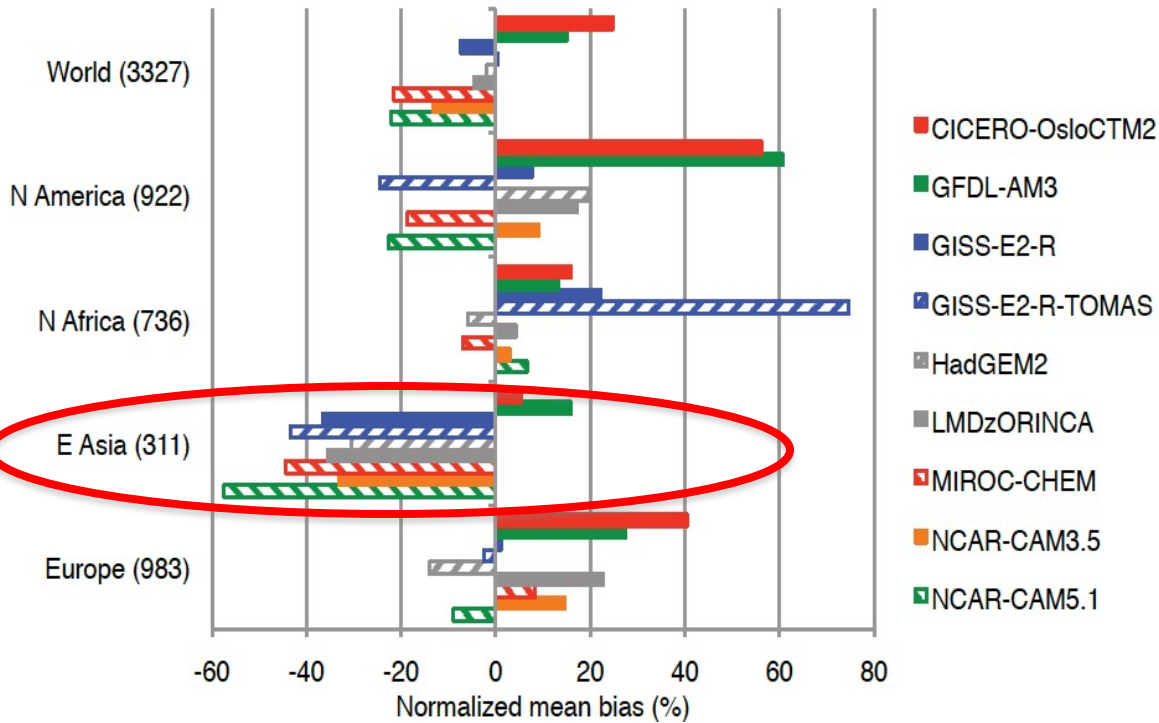
## East\_Asia

## OBS \*

## CAM3mod- CAM7mod-



# Underestimation of aerosols in East Asia



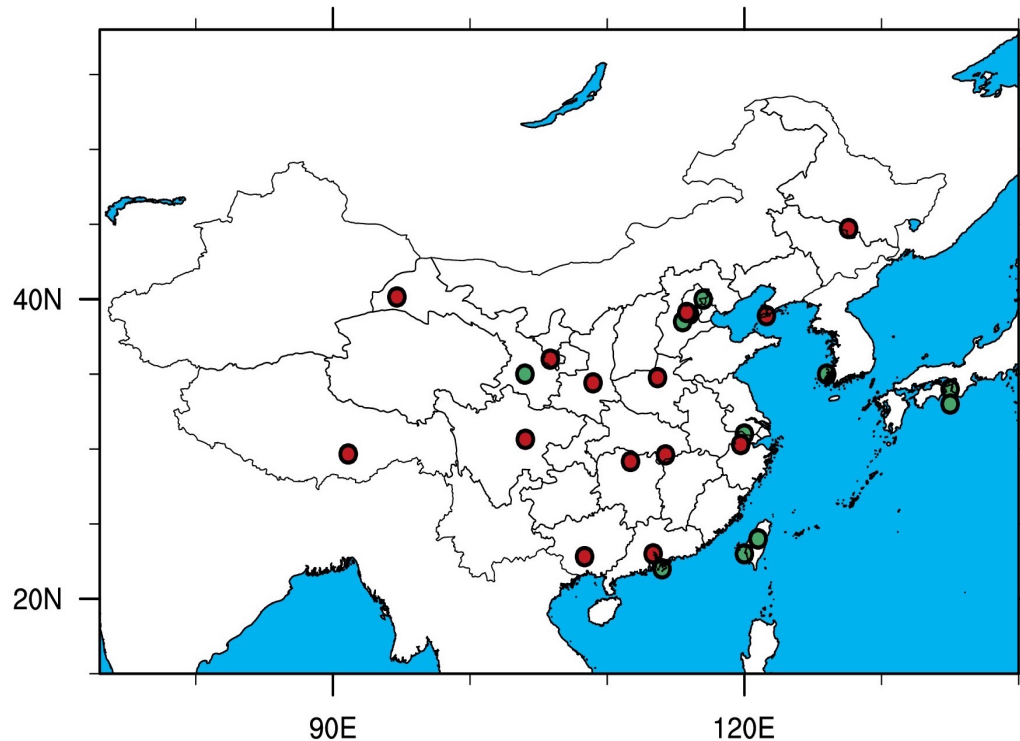
“Nearly all models show large negative biases over East Asia. The two models that do not show a large negative bias over East Asia show the largest positive biases over both Europe and North America, indicating they are systematically higher than the other models rather than matching East Asia observations better”

**Comparison of Atmospheric Chemistry and Climate Model Intercomparison Project (ACCMIP) models with AERONET AOD**

(Shindell et al. 2013)



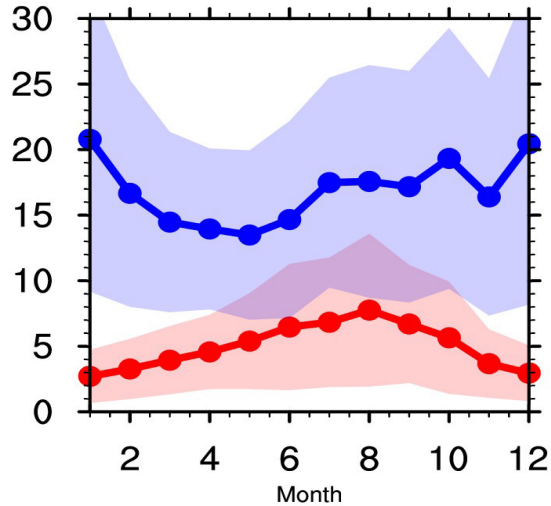
# Long-term aerosol composition measurements used for model evaluation



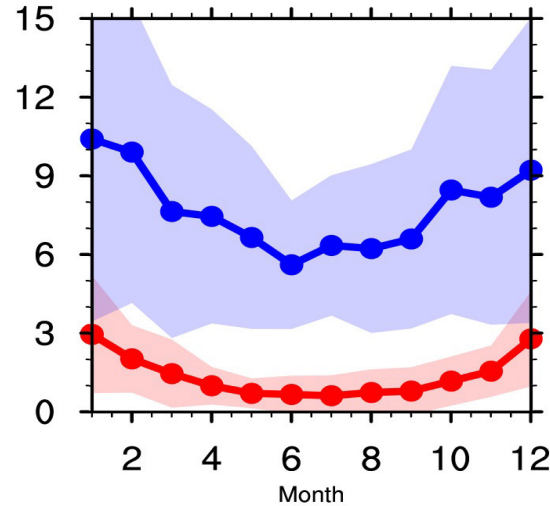
- **Measured concentrations** at 14 CAWNET sites (**red circles**) of the China Meteorological Administration (CMA) Atmosphere Watch Network (**CAWNET**)
- **Measured AOD** from
  - ✧ AERONET sites (**green circles**) (Holben et al., 1998)
  - ✧ Satellite measurements (MODIS, MISR)

# Simulated surface concentrations from ACCMIP models vs. measurements at CAWNET sites

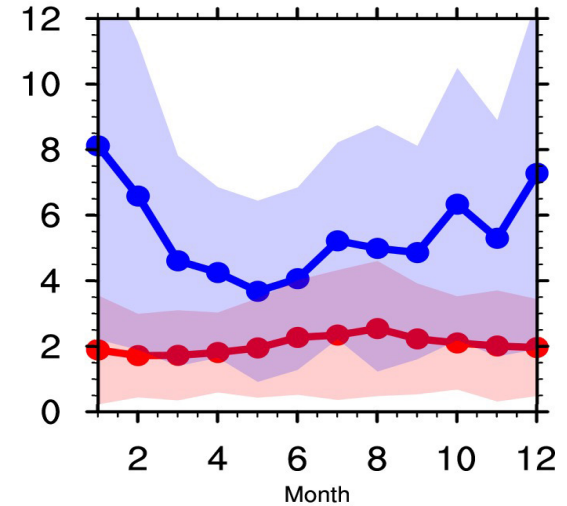
## Sulfate



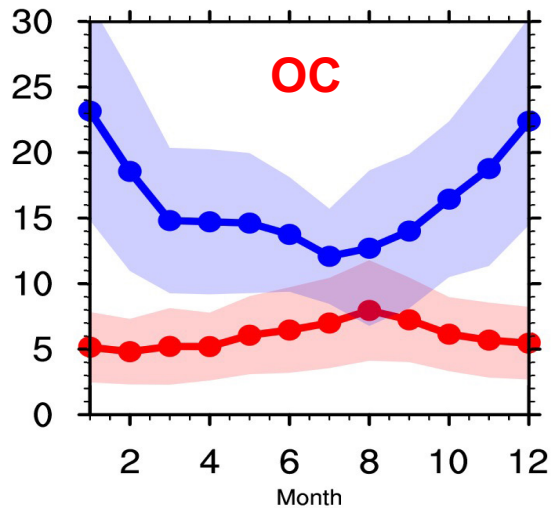
## Nitrate



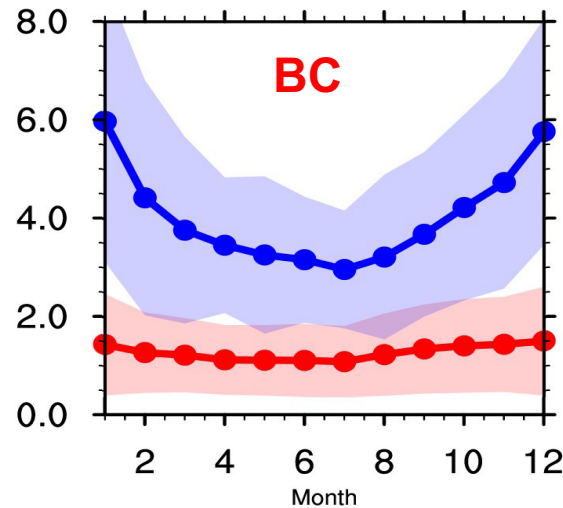
## Ammonium



## OC



## BC



**Red: Multi-model mean conc.;**

**Blue: observed conc.;**

**Both simulated and measured concentrations are averaged over 14 CAWNET sites**

# Why are aerosols in East Asia underestimated in GCMs?

▶ Anthropogenic aerosol emissions underestimated?

▶ Aerosol processes under-represented or missing?

■ Nitrate

■ SOA

■ Dust-sulfate/nitrate chemistry interactions

▶ GCM model resolution too coarse? Subgrid variability

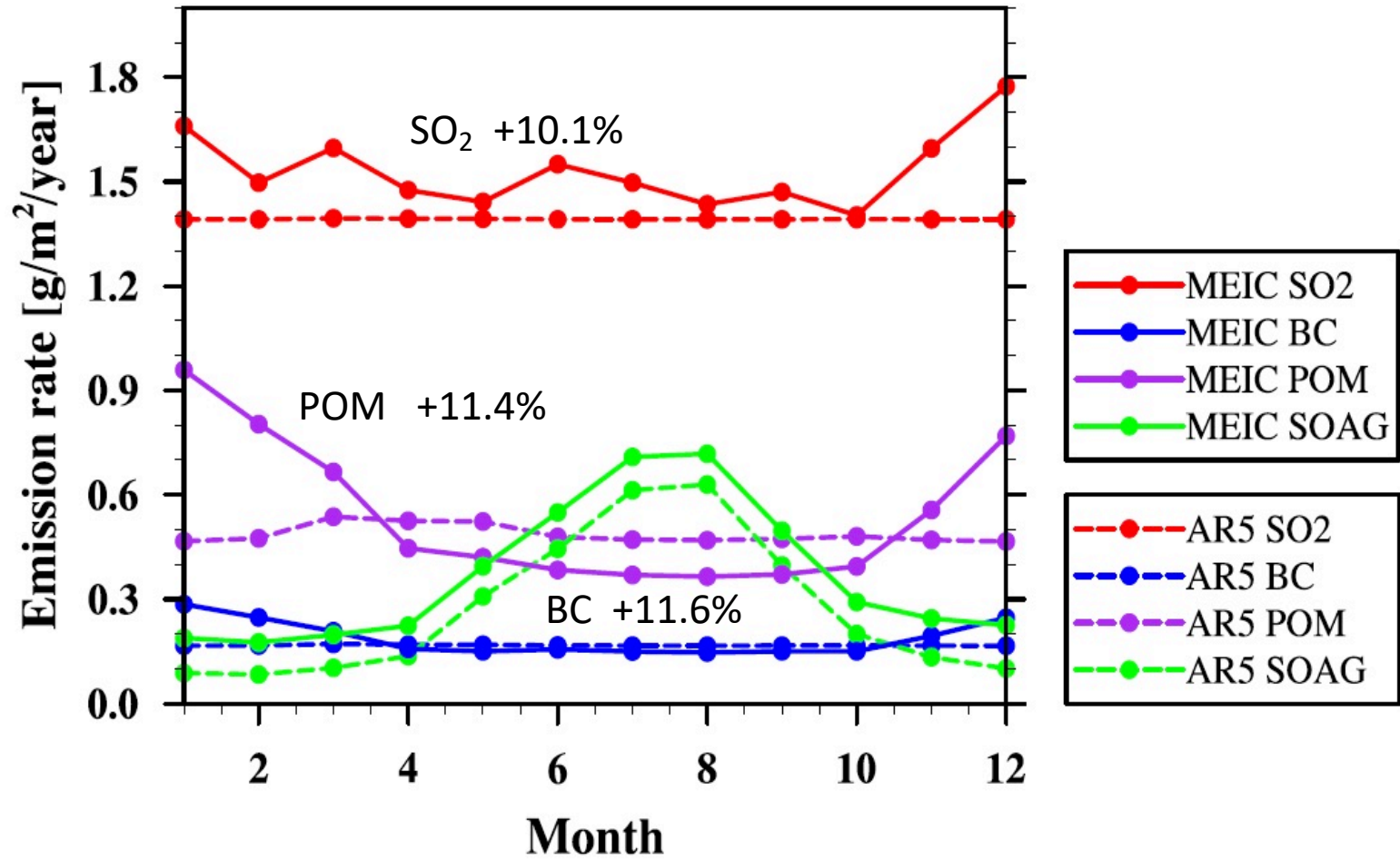
## NCAR CAM5.2

- Six-years simulations (2006~2011) nudged by ECMWF re-analysis data
- At  $1.9^\circ \times 2.5^\circ$  resolution

# New aerosol emission for China

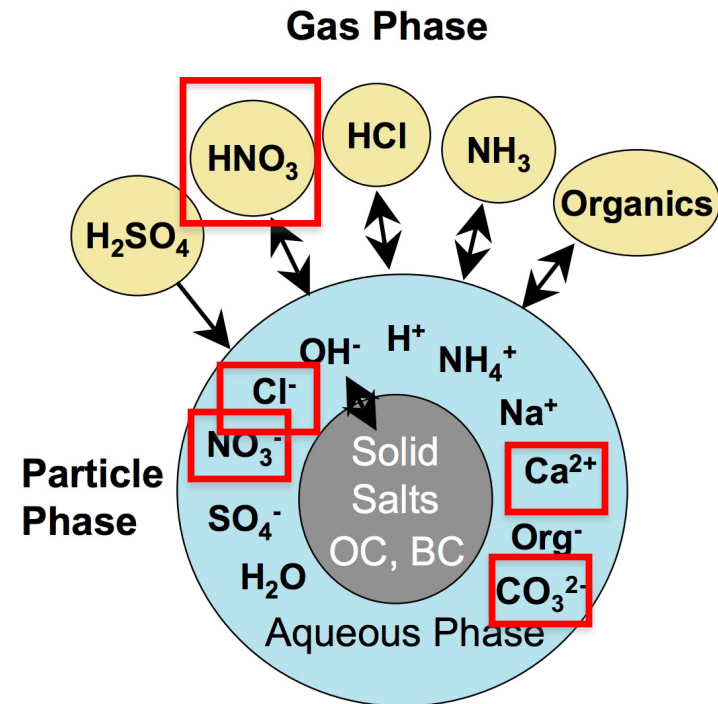
- ▶ IPCC AR5 emission
  - update every 10 years
  - *no seasonal variation for anthropogenic aerosols*
  - horizontal resolution:  $0.5^\circ \times 0.5^\circ$  or model-dependent
  - anthropogenic, biogenic, and biomass burning aerosols
  
- ▶ Multi-scale Emission Inventory for China (MEIC)
  - technology-based
  - update every year
  - *seasonal variation*: monthly mean
  - horizontal resolution:  $0.25^\circ \times 0.25^\circ$ ,  $0.5^\circ \times 0.5^\circ$ ,  $1^\circ \times 1^\circ$
  - anthropogenic aerosols only

# AR5 and MEIC emissions in East China

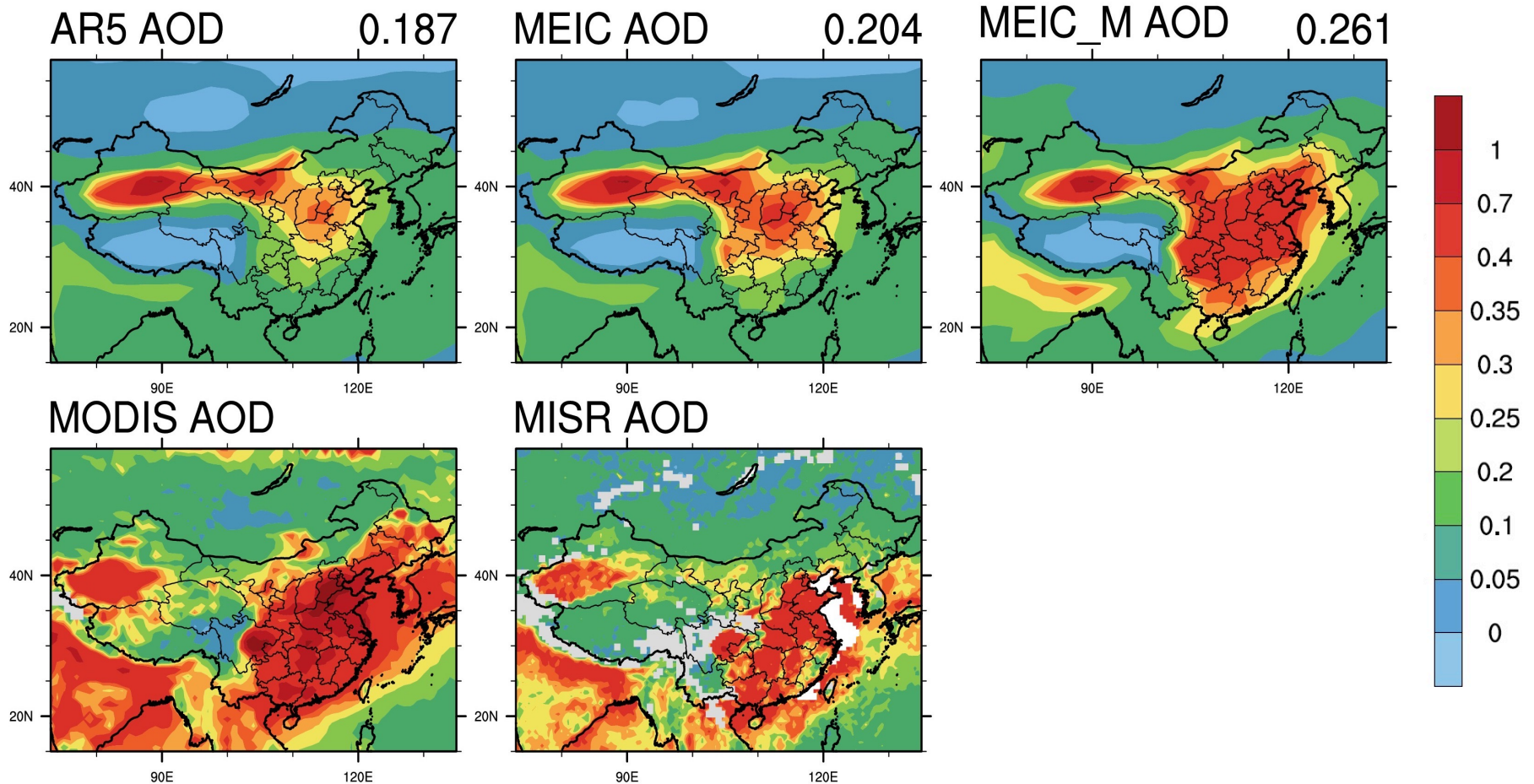


# Nitrate aerosol in CAM5

- In order to treat  $\text{NO}_3$  aerosol, [Model for Simulating Aerosol Interactions and Chemistry \(MOSAIC\)](#) module [Zaveri et al., 2008] is coupled with MAM4 and MAM7 (MOSAIC-MAM4/7)
- In the version of MAM coupled with MOSAIC, *gas-aerosol exchange* is treated by MOSAIC. The remaining processes are still treated by MAM

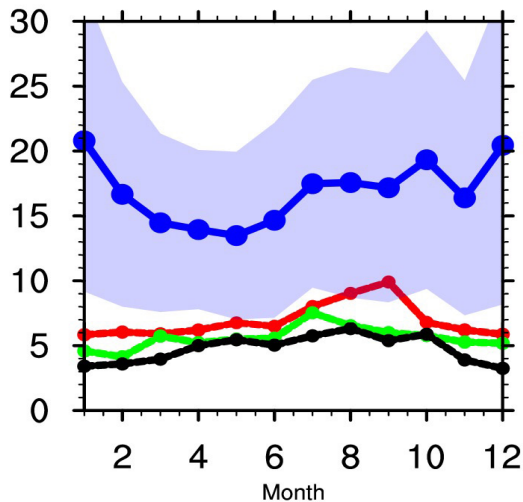


Emission accounts for 16%-21%,  
emission & nitrate account for 63%-86% of the modeled  
AOD low biases in eastern China

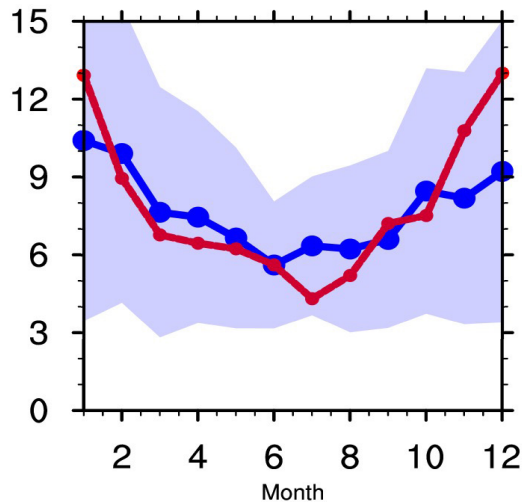


# Simulated surface concentrations from CAM5 vs. measurements at CAWNET sites

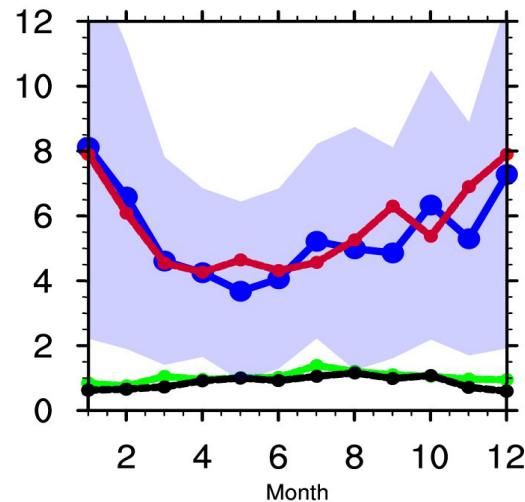
## Sulfate



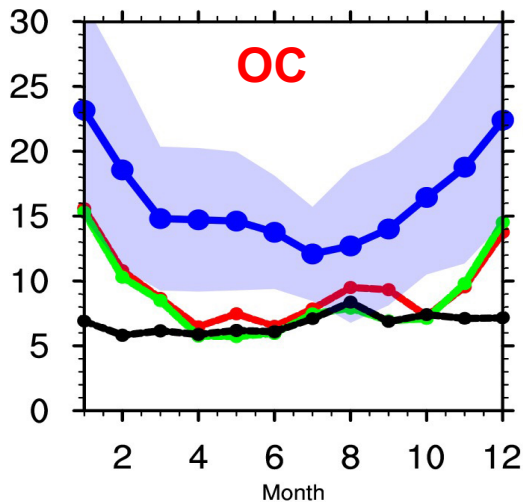
## Nitrate



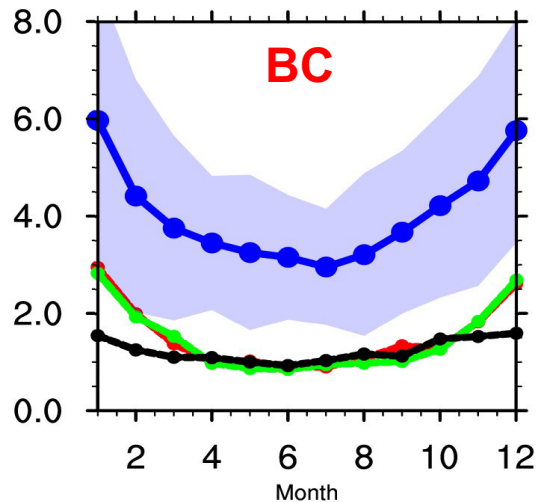
## Ammonium



## OC



## BC



**Blue: CAM5 w/ AR5 emission**  
**green: CAM5 w/ MEIC emission**  
**Red: CAM5 w/ MEIC & nitrate**

**Blue: observed conc.**



# Uncertainties in Aerosol Processes in GCMs

- **Wet removal**
  - Cloud water content, cloud fraction
  - Treatment of aerosol wet removal
  - Aerosol processes in convective clouds

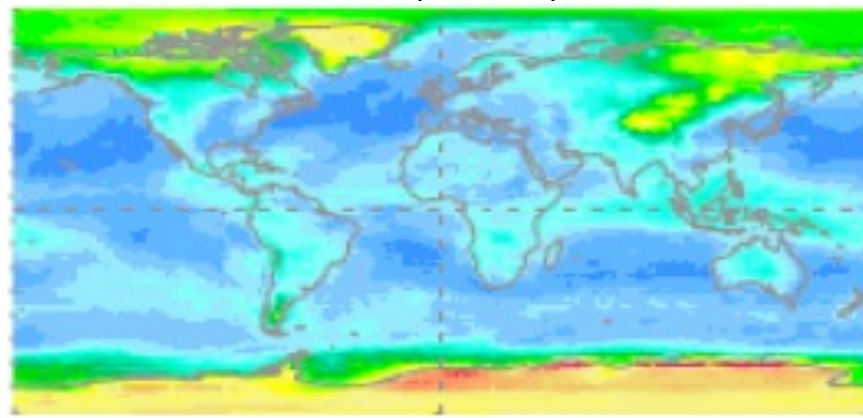
# Aerosol Models Have Particular Trouble Simulating Aerosol Beyond the Polar Front

- Most relative uncertainty in simulated AOD/mass **poles**.
- Arctic aerosol sources primarily from midlatitudes.
- Uncertainty in transport treatment unlikely to cause x10-uncertainty.
- Large uncertainty could be from treatment of wet scavenging.

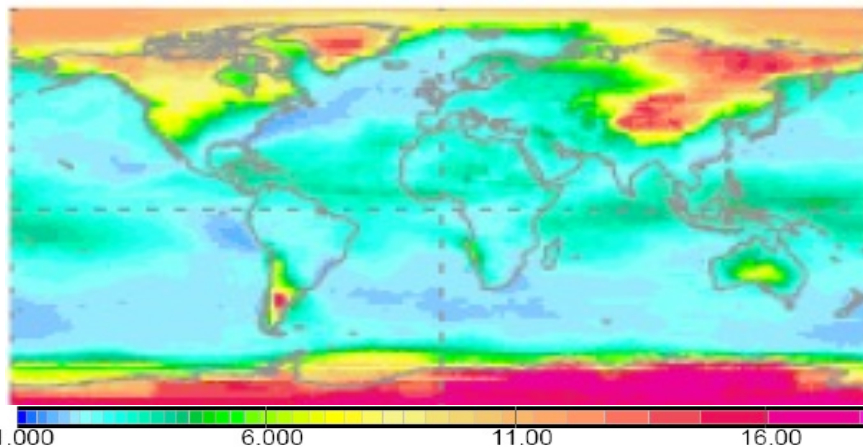
Major differences in **poles**

Max/Min of Central 2/3 of 16 Models

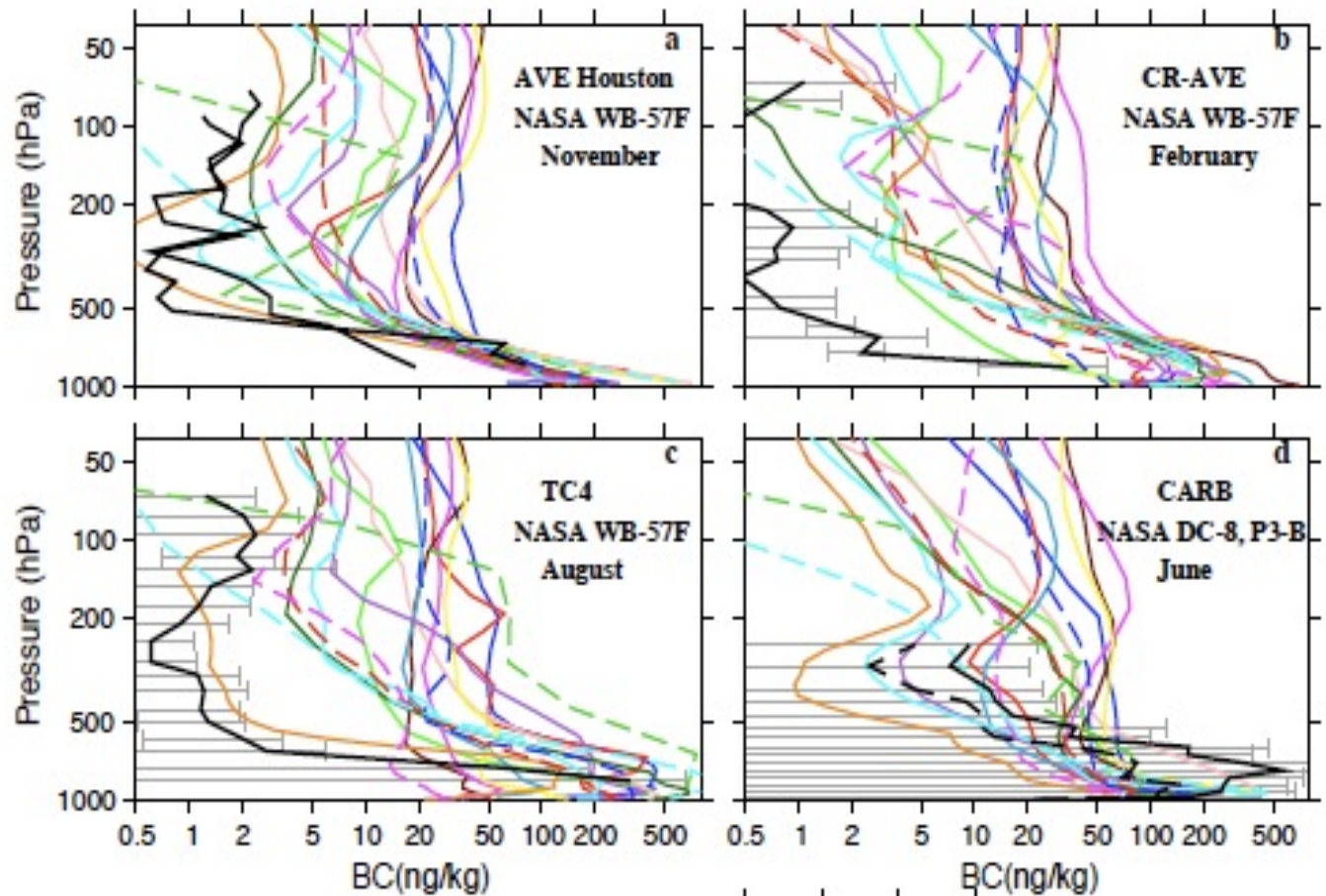
Aerosol Optical Depth



Aerosol Column Mass

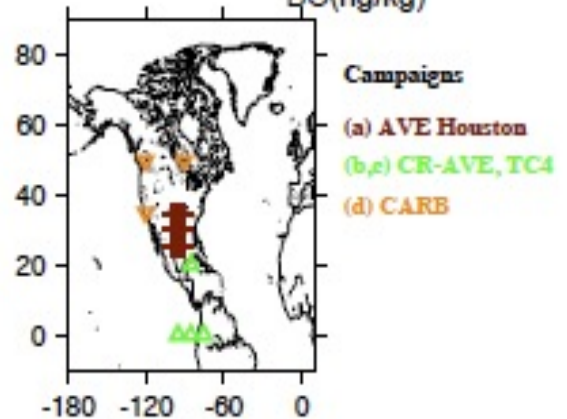


BC compared with SP2 (tropics and mid-lat.)

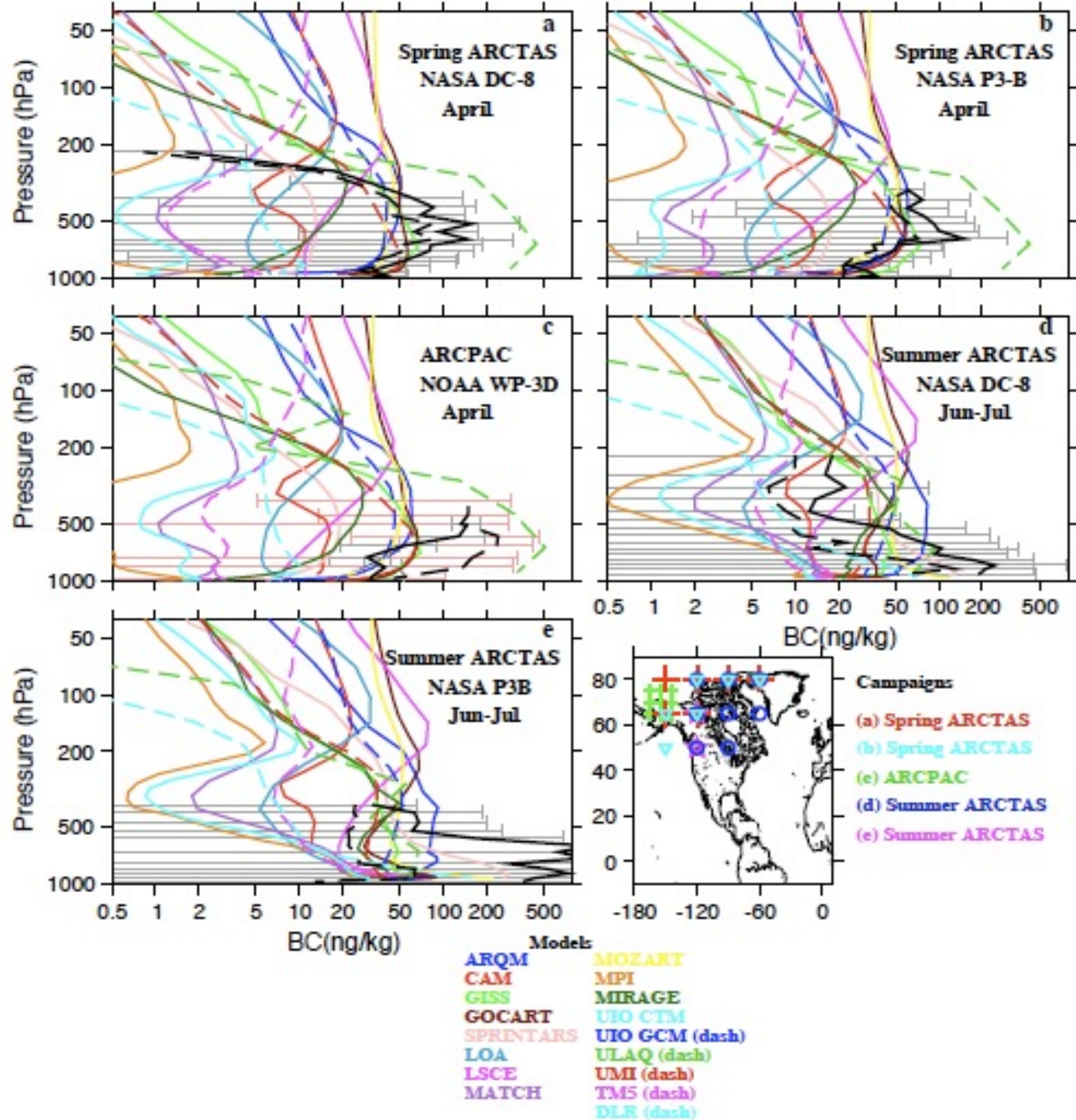


Major differences in free troposphere

- Models**
- ARQM
  - CAM
  - GISS
  - GOCART
  - SPRINTARS
  - LOA
  - LSCE
  - MATCH
  - MOZART
  - MPI
  - MIRAGE
  - UIO CTM
  - UIO GCM (dash)
  - ULAQ (dash)
  - UMI (dash)
  - TM5 (dash)
  - DLR (dash)

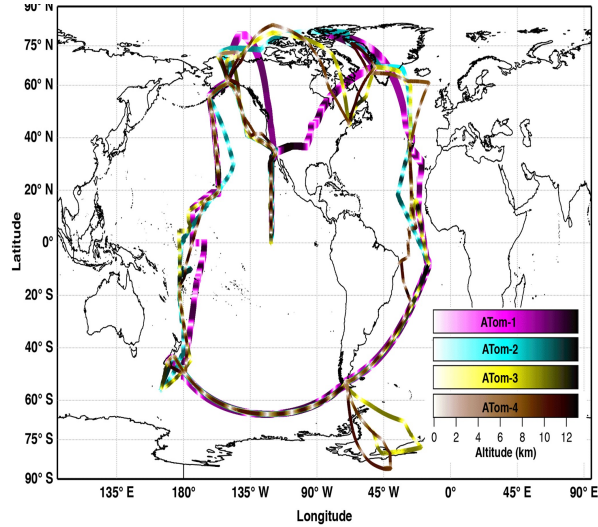


BC compared with SP2 (high-latitudes)

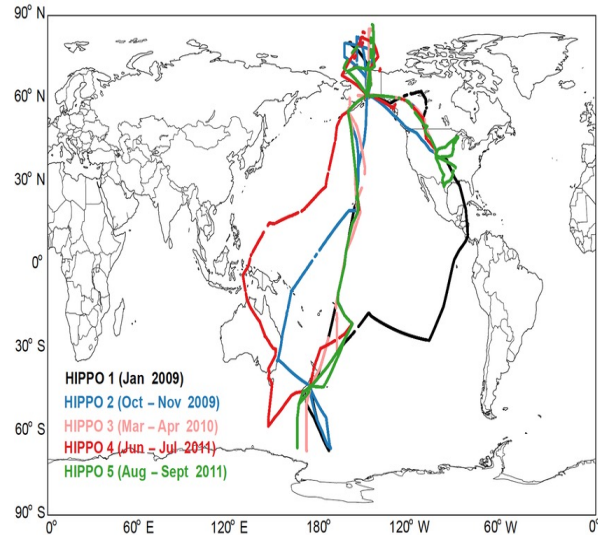


# Impact of convective processes in CESM2 on BC

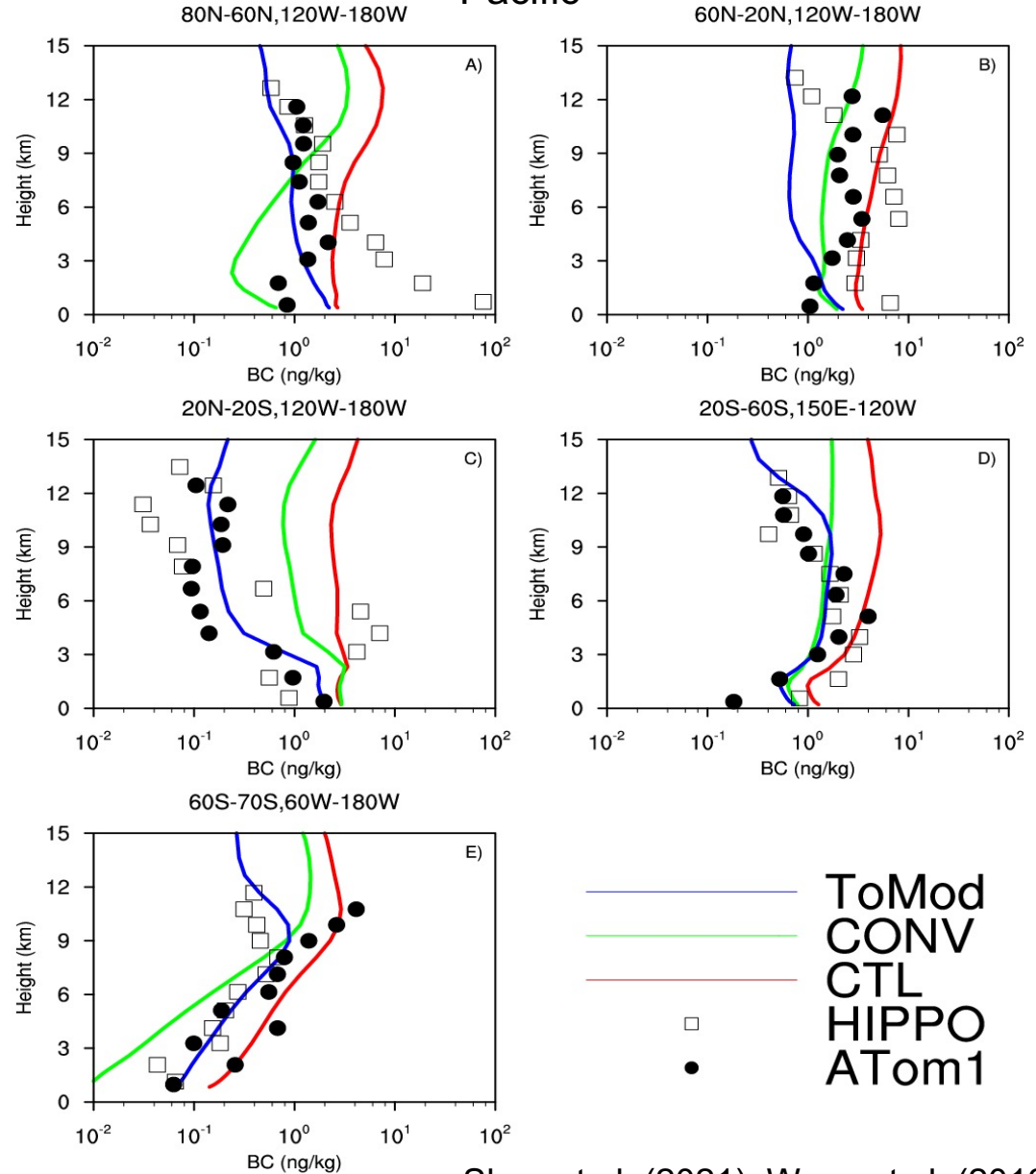
## NASA-ATom



## NSF-HIPPO



## Pacific



# Outline

- ▶ Aerosol Representations in GCMs (CAM, GISS, ECHAM)
- ▶ Uncertainties in Aerosol Processes and Properties in GCMs
- ▶ How Can Aerosol Representation be Improved in GCMs?

# How Can Aerosol Representation in GCMs be Improved?

## Processes :

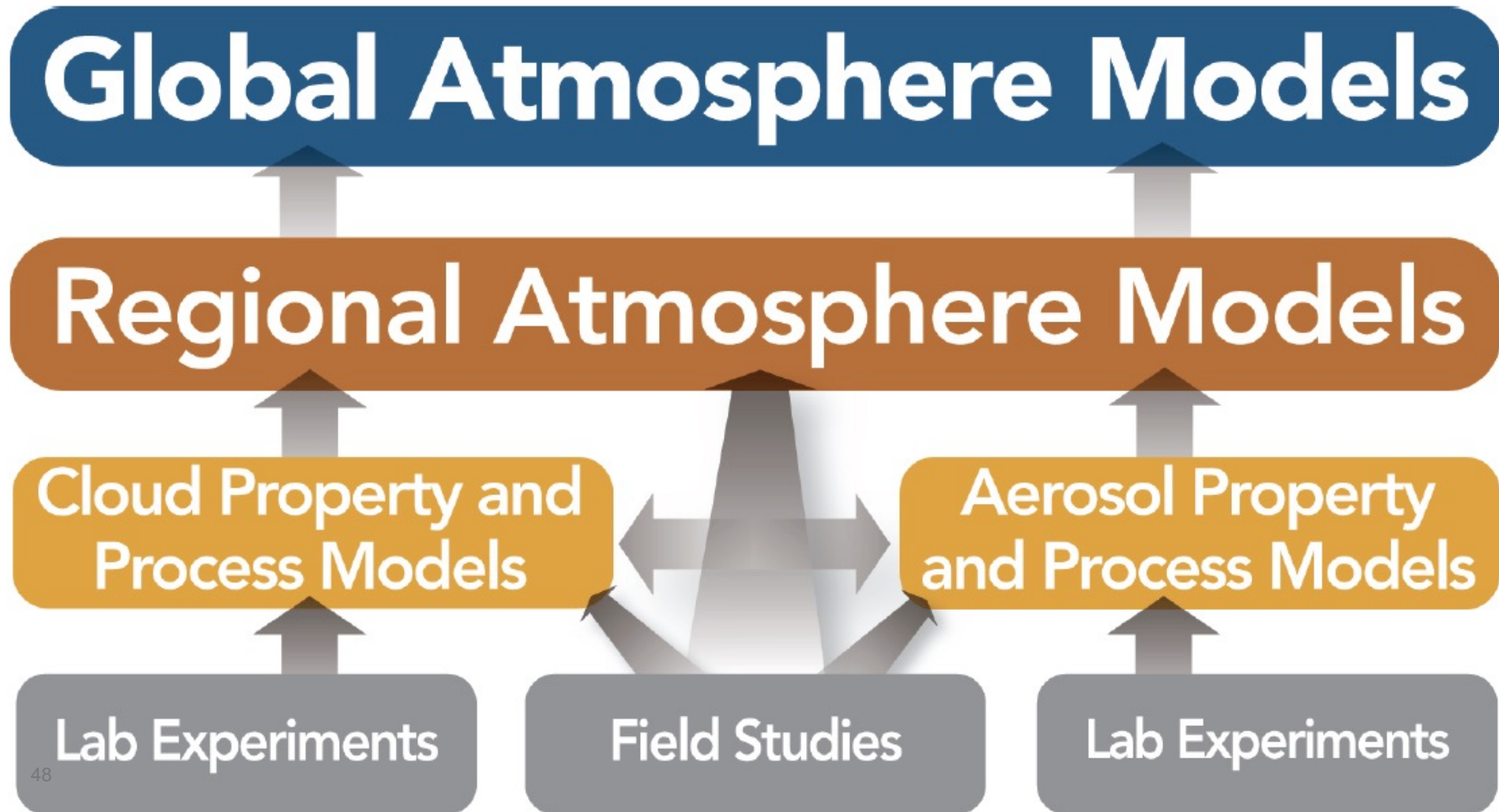
- Improve primary emissions: flux, size distribution and injection heights
- Aerosol nucleation and growth (BL nucleation, role of organics)
- SOA production and evaporation
- Wet scavenging (cloud and precipitation in GCMs)

## Properties :

- Hygroscopicity of organics
- Mixing state (e.g., BC)
- Refractive index (brown carbon)

# Road Map from Process Studies to GCMs

(Ghan and Schwartz, BAMS, 2007)





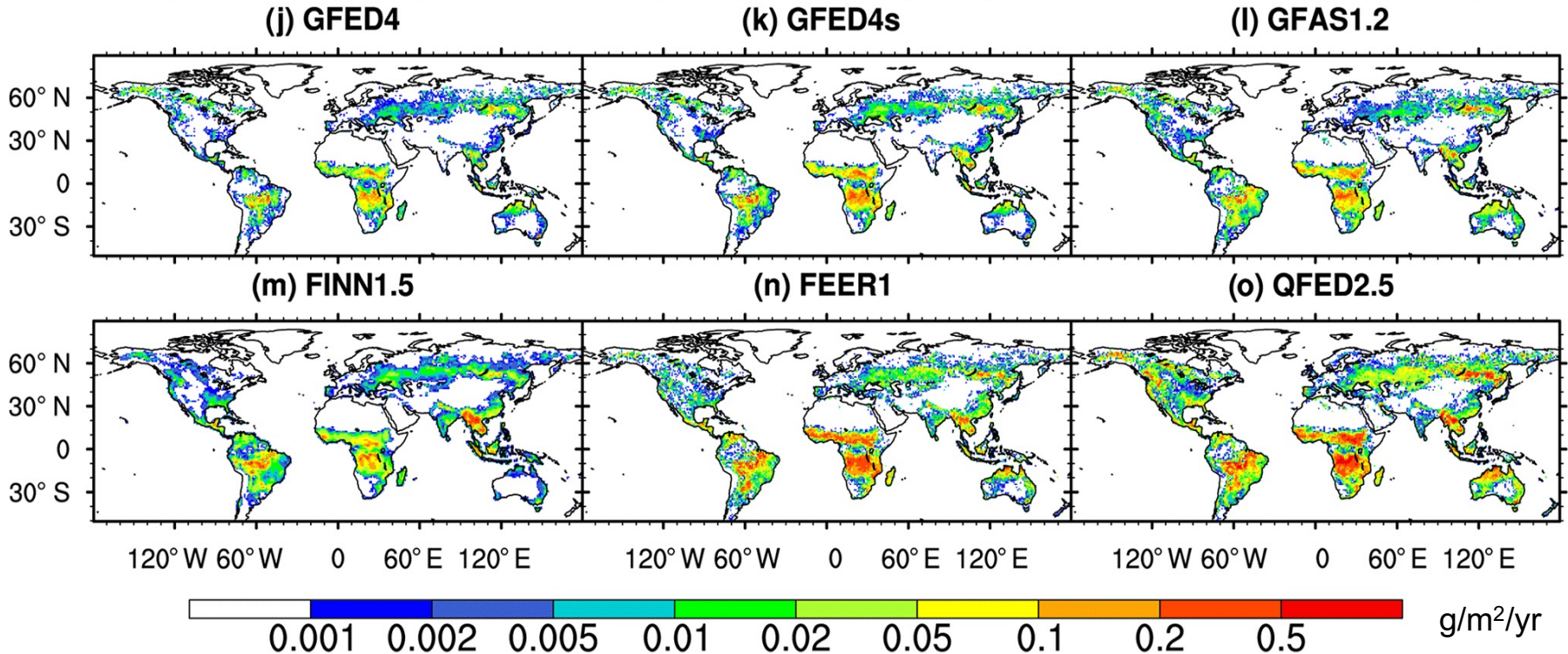
# Thanks!

**Book Chapter:**

**Liu, X.**, “**Aerosols and Climate Effects**”,

In: *Fast Physics in Large Scale Atmospheric Models: Parameterization, Evaluation, and Observations* [Y. Liu, P. Kollias, L. Donner (eds.)], Wiley  
Publisher, in press, 2022.

# Annual fire BC emissions from satellite-based products averaged over 2003-2008



Modified from Li et al. (2019)

Two types of fire emissions: burned area (BA)-based, like GFED and active fire or fire radiative power (FRP)-based emissions, like FINN and QFED.

Over India, small-size fires dominate, probably related to agriculture activity. FRP-based emission datasets perform better in capturing these small fires.