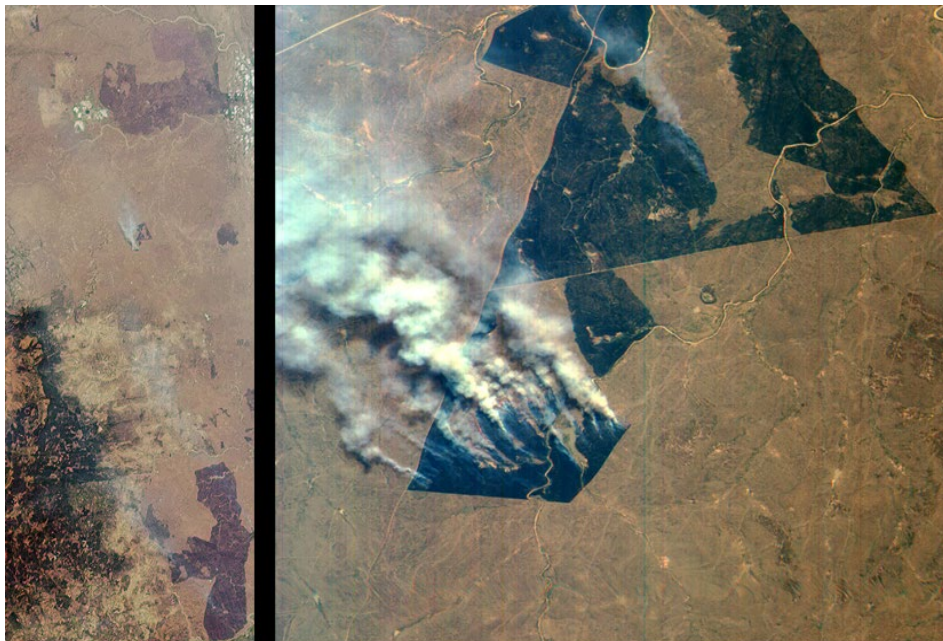
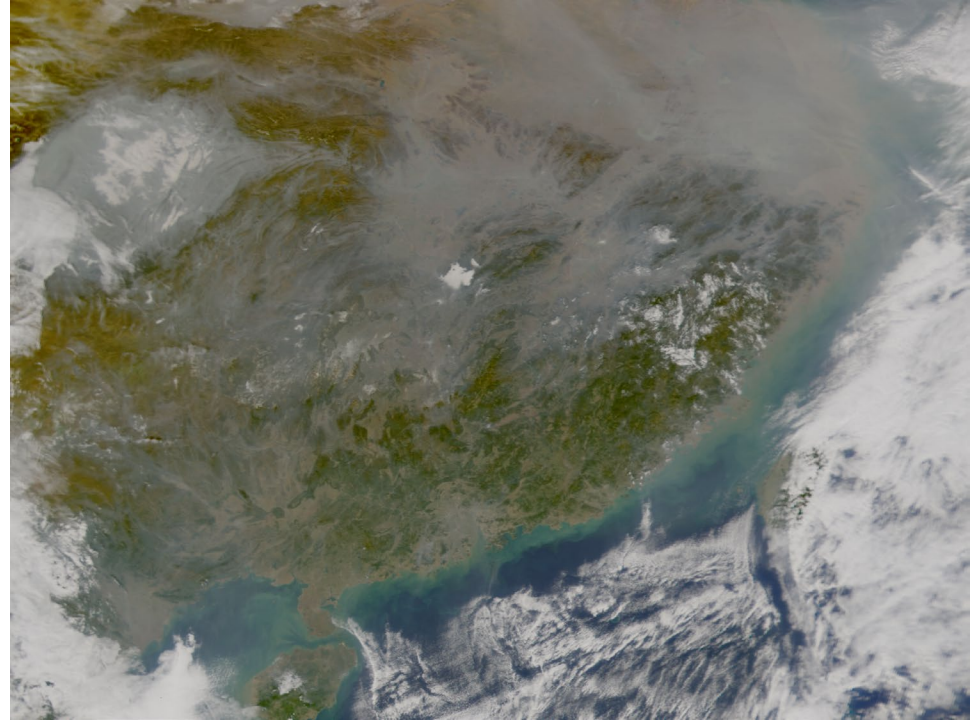
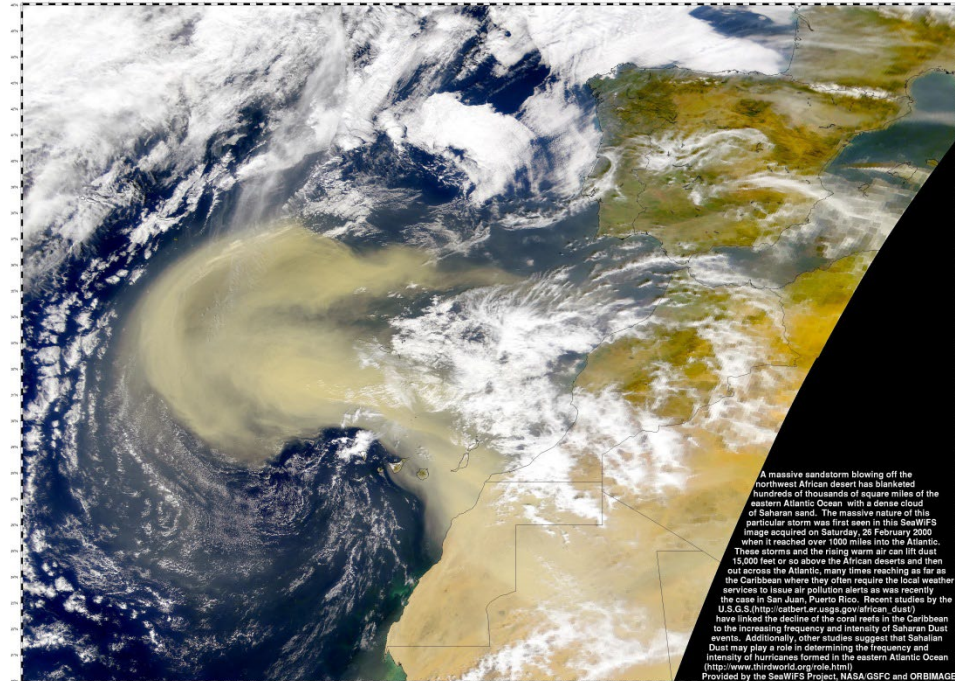


# Lecture 23. Aerosol modeling and comparisons with observations



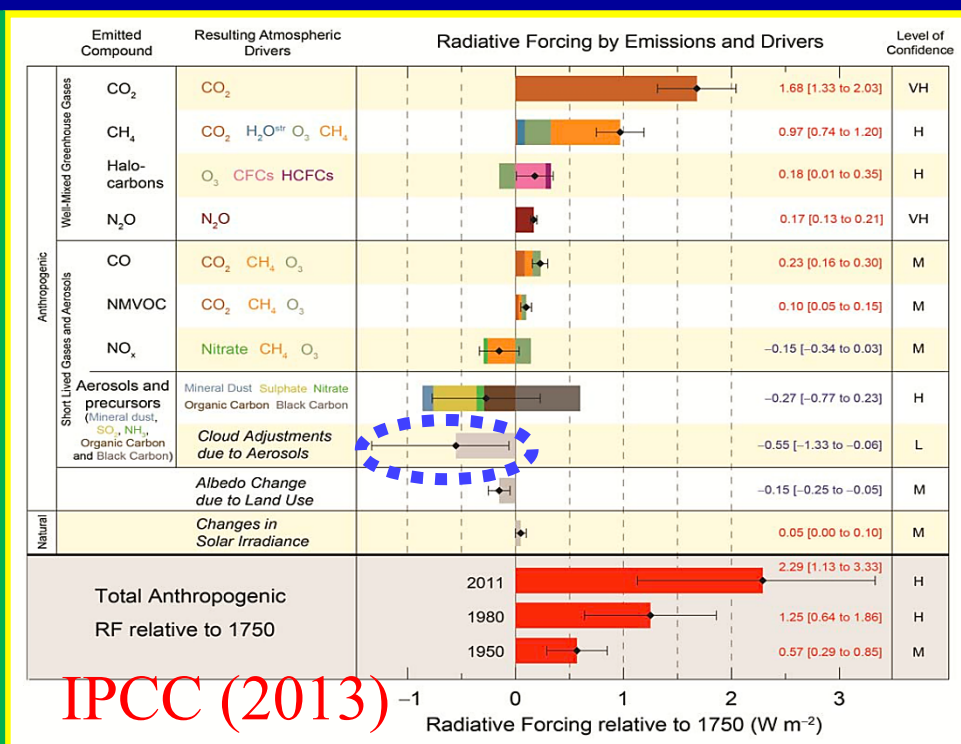
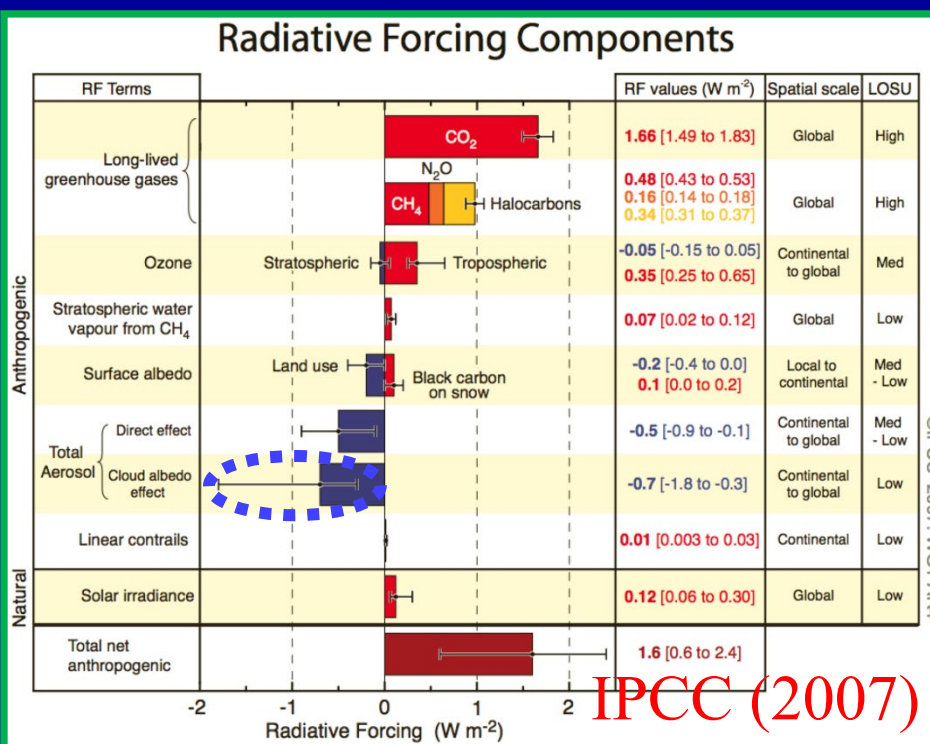
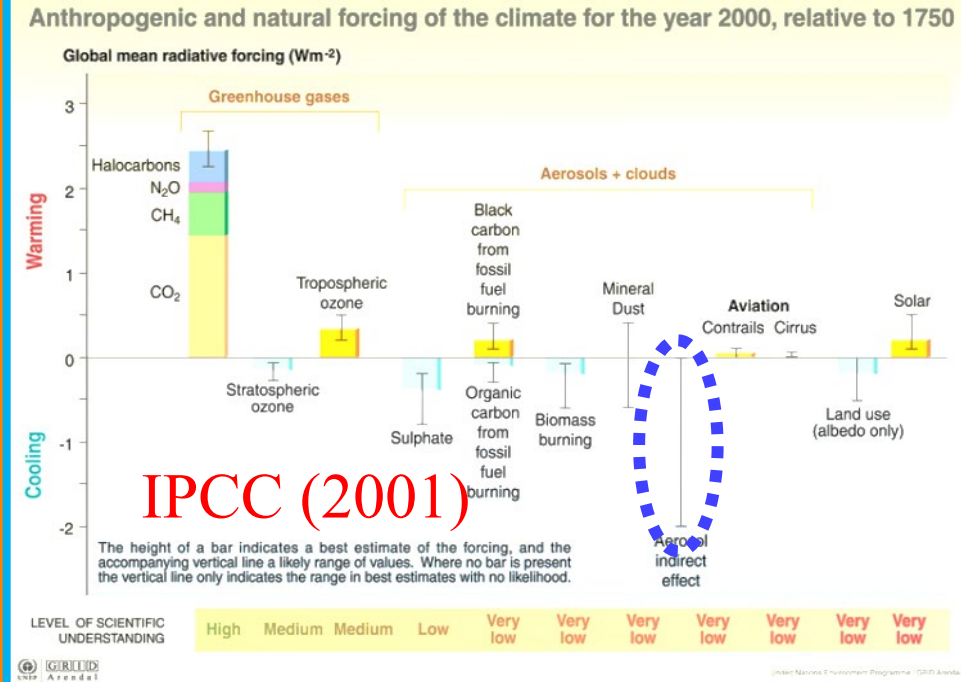
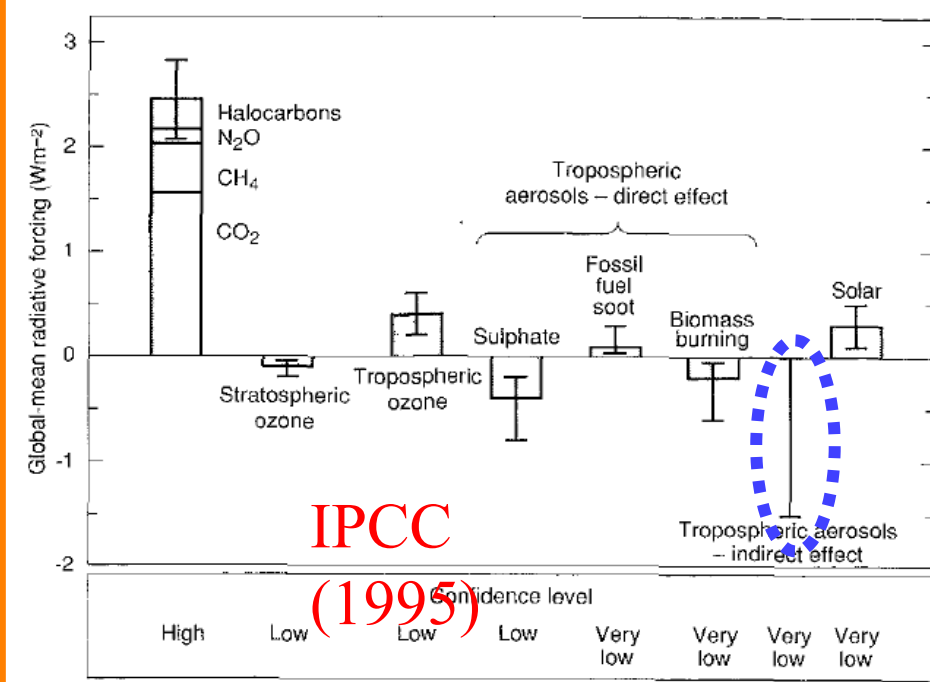
MISR

AirMISR



A massive sandstorm blowing off the northwest African desert has blanketed hundreds of thousands of square miles of the eastern Atlantic Ocean, with a dense cloud of Saharan sand. The massive nature of this particular storm was first seen in this SeaWiFS image acquired on Saturday, 26 February 2000 when it reached over 1000 miles into the Atlantic. These storms and the rising warm air can lift dust 15,000 feet or so above the African deserts and then out across the Atlantic, many times reaching as far as the Caribbean where they often require the local weather services to issue air pollution alerts as was recently the case in San Juan, Puerto Rico. Recent studies by the U.S.G.S. ([http://cstnet.cr.usgs.gov/africa\\_dust/](http://cstnet.cr.usgs.gov/africa_dust/)) have linked the decline of the coral reefs in the Caribbean to the increasing frequency and intensity of Saharan Dust events. Additionally, other studies suggest that Saharan Dust may play a role in determining the frequency and intensity of hurricanes formed in the eastern Atlantic Ocean (<http://www.thirdworld.org/role.html>). Provided by the SeaWiFS Project, NASA/GSFC and ORBIMAGE





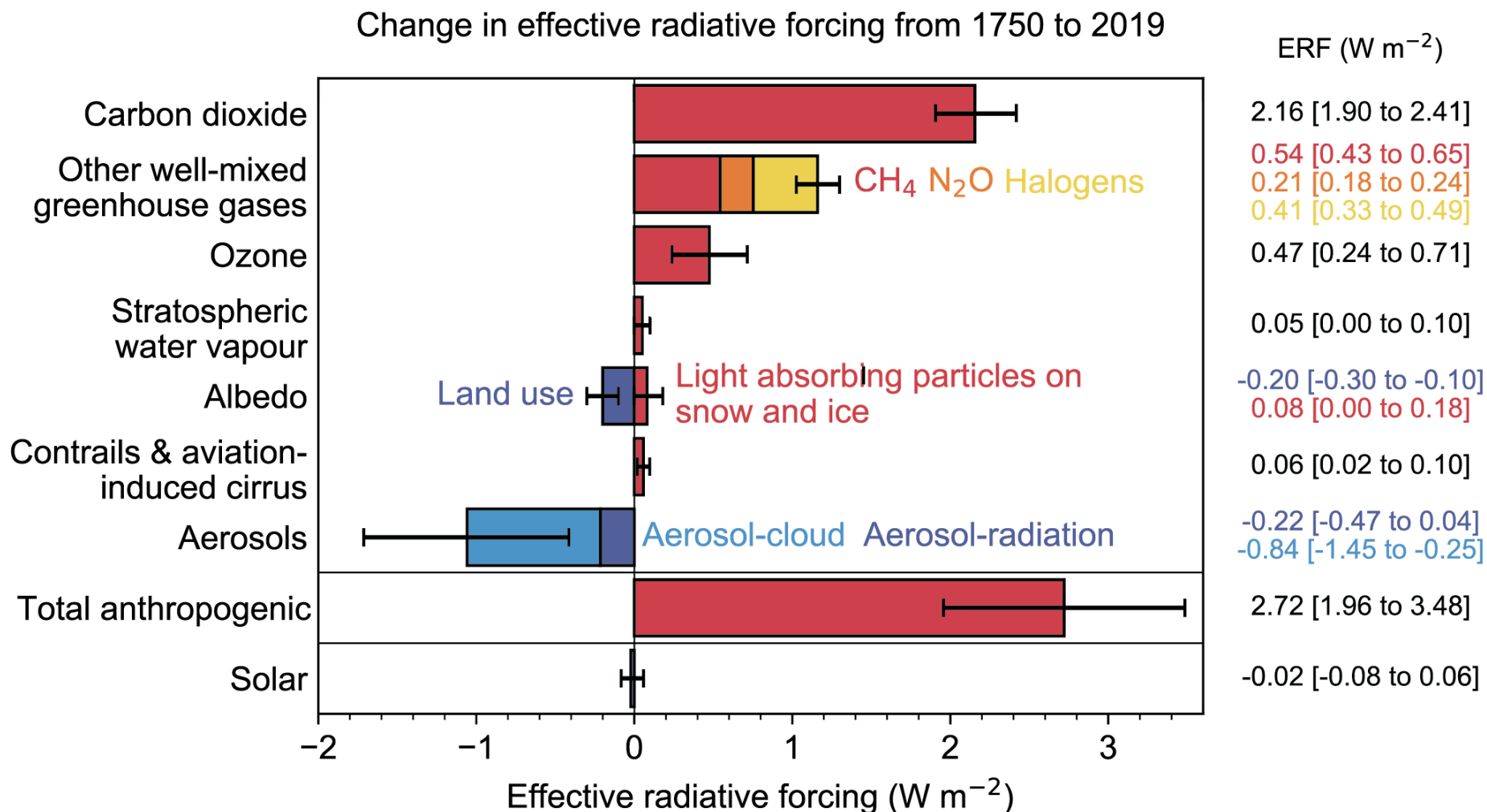
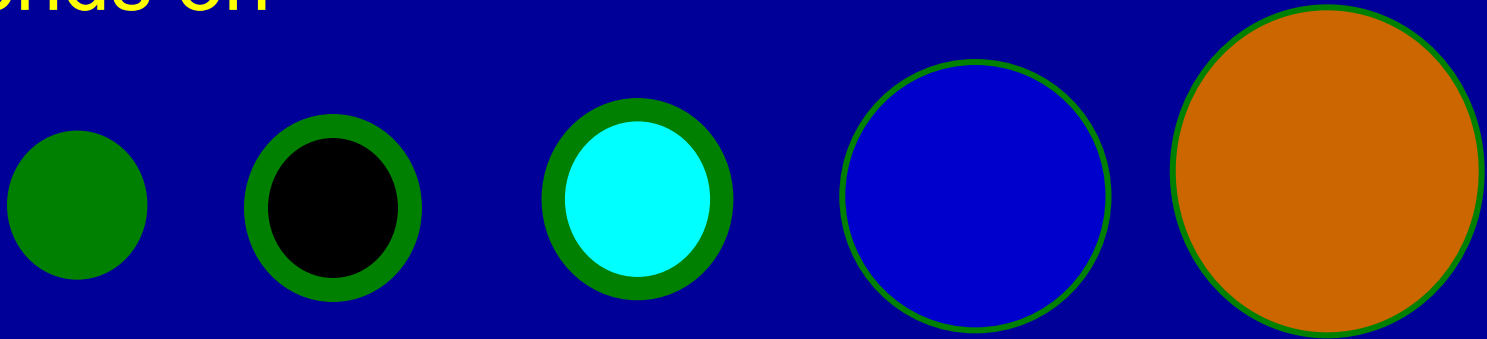


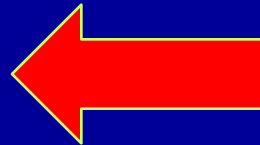
Figure 7.6 | Change in effective radiative forcing (ERF) from 1750 to 2019 by contributing forcing agents (carbon dioxide, other well-mixed greenhouse gases (WMGHGs), ozone, stratospheric water vapour, surface albedo, contrails and aviation-induced cirrus, aerosols, anthropogenic total, and solar).

# Aerosol climatic and environmental impacts

depends on



Concentrations,  
Sizes,  
Compositions,  
Mixing States

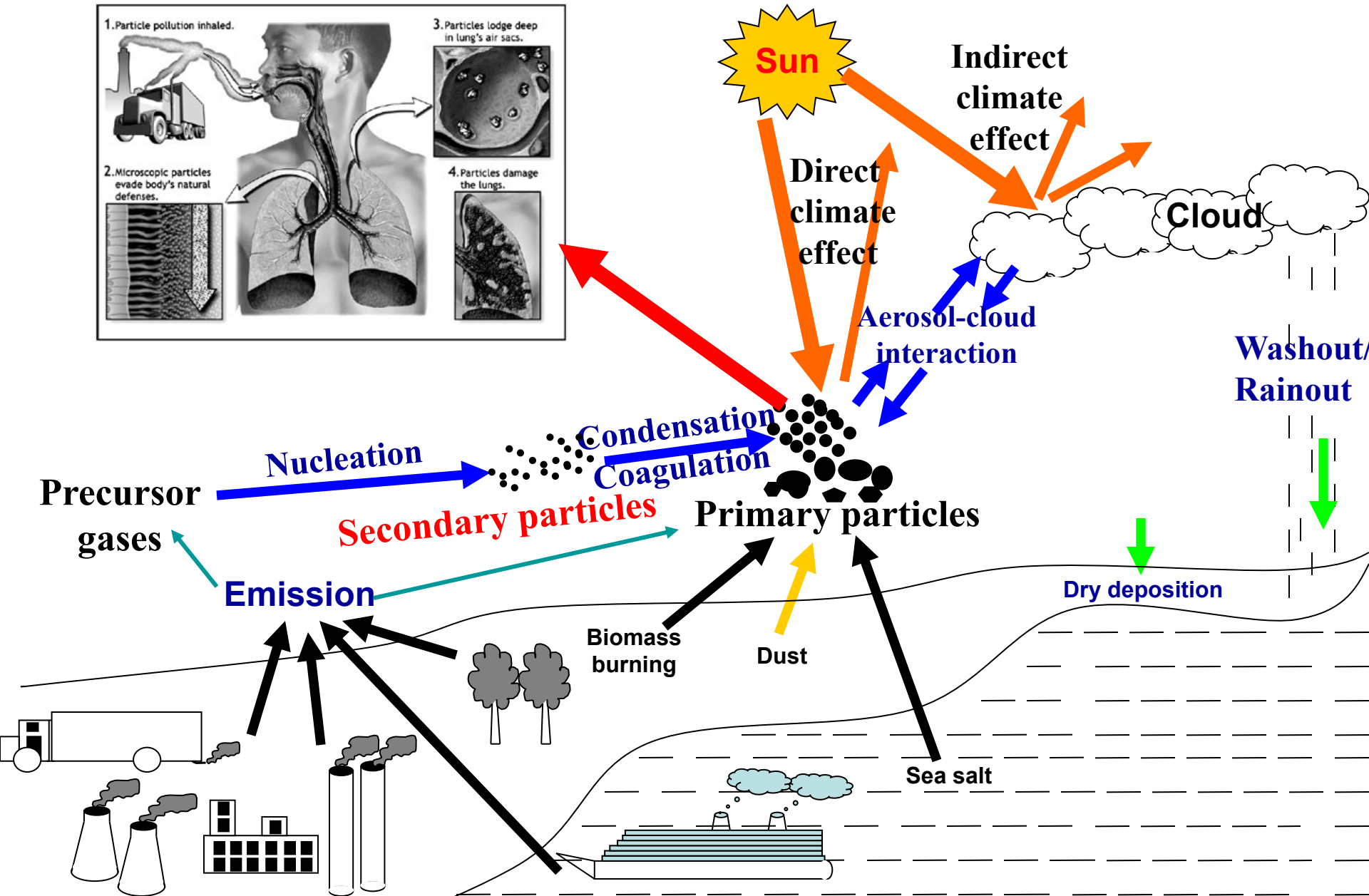
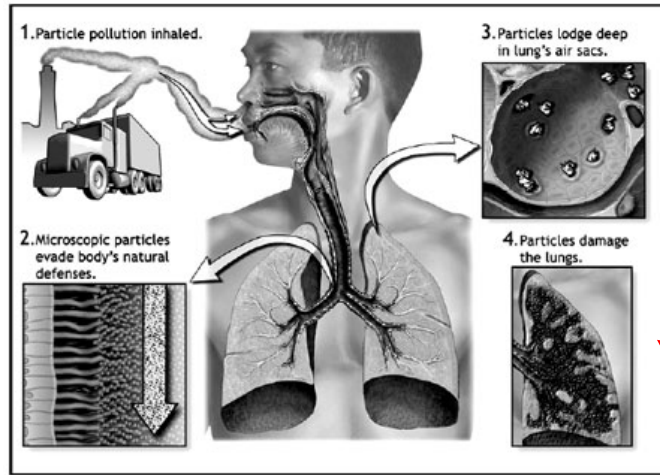


Emission, Deposition,  
Nucleation, Growth,  
Coagulation,  
Scavenging,  
Aqueous Chemistry

which have large spatial and temporal variations.



# Physical processes controlling aerosol properties



# THE CONTINUOUS GENERAL DYNAMIC EQUATION

$$\begin{aligned} \frac{\partial n(v, t)}{\partial t} = & \frac{1}{2} \int_0^v K(v - q, q) n(v - q, t) n(q, t) \, dq \\ & - n(v, t) \int_0^\infty K(q, v) n(q, t) \, dq - \frac{\partial}{\partial v} [I(v) n(v, t)] \\ & + J_0(v) \delta(v - v_0) + S(v) - R(v) \end{aligned}$$

**TABLE 12.6    Properties of Coagulation, Condensation, and Nucleation**

Process	Number Concentration	Volume Concentration
Coagulation	Decreases	No change
Condensation	No change	Increases
Nucleation	Increases	Increases
Coagulation and condensation	Decreases	Increases

# Approaches to modeling aerosols

Sizes:

1. Bulk

2. Modal

3. Sectional

Mixing states:

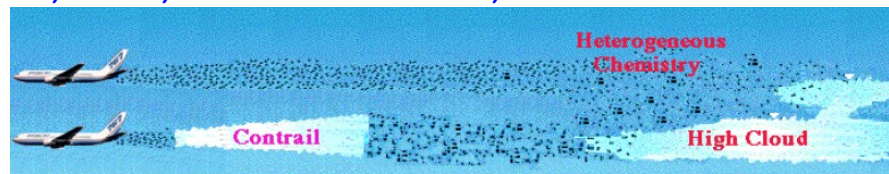
1. External

2. Internal

3. Semi-external



Yu, 1998, Ph.D Dissertation, Advisor: Prof. R. Turco ***“A Study of the Formation and Evolution of Aerosols and Contrails in Aircraft Wakes: Development, Validation & Application of an Advanced Particle Microphysics (APM) Model”***



## Two versions of APM model:

### 1. A comprehensive APM box model for detailed particle microphysics studies

Atmos. Chem. Phys., 18, 17451–17474, 2018  
<https://doi.org/10.5194/acp-18-17451-2018>  
 © Author(s) 2018. This work is distributed under the Creative Commons Attribution 4.0 License.



#### **H<sub>2</sub>SO<sub>4</sub>–H<sub>2</sub>O–NH<sub>3</sub> ternary ion-mediated nucleation (TIMN): kinetic-based model and comparison with CLOUD measurements**

Fangqun Yu<sup>1</sup>, Alexey B. Nadykto<sup>1,2,3</sup>, Jason Herb<sup>1</sup>, Gan Luo<sup>1</sup>, Kirill M. Nazarenko<sup>2</sup>, and Lyudmila A. Uvarova<sup>2,3</sup>



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Article

#### **Revisiting Contrail Ice Formation: Impact of Primary Soot Particle Sizes and Contribution of Volatile Particles**

Fangqun Yu,\* Bernd Kärcher, and Bruce E. Anderson



Cite This: *Environ. Sci. Technol.* 2024, 58, 17650–17660



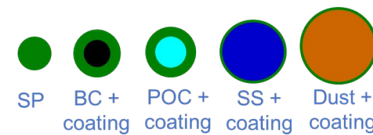
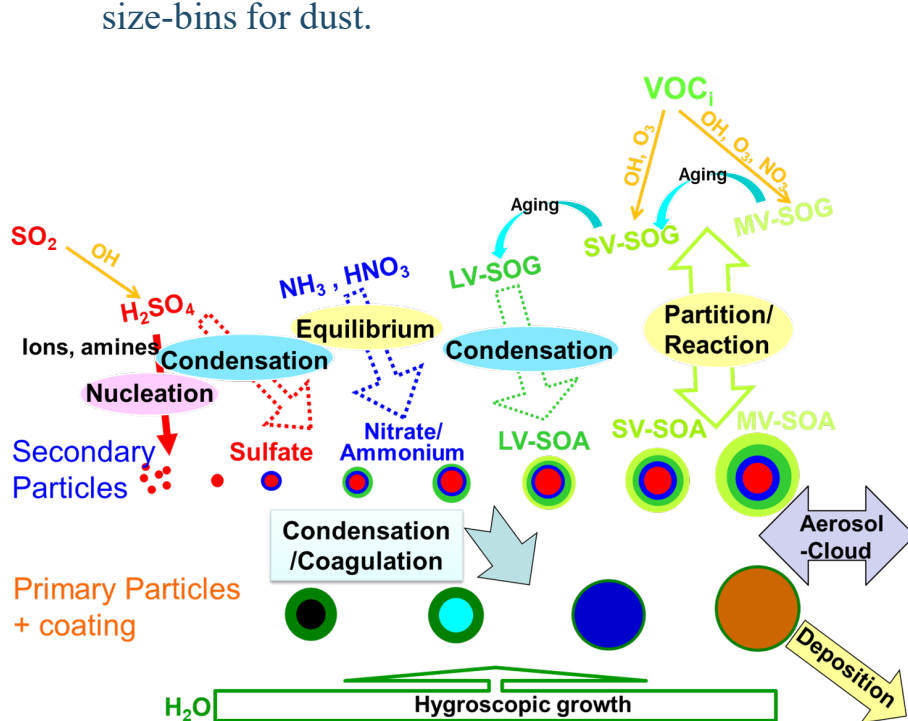
Read Online

### 2. A simplified and computationally efficient APM for integrating with 3-D global and regional models

- **GEOS-Chem** (Yu and Luo, ACP, 2009)
- **WRF-Chem** (Luo and Yu, ACP, 2011)
- **NAQPMS** (Chen et al., SOLA, 2017)
- **IAP-AACM** (Chen et al., ACP, 2021)
- **CESM2-WACCM** (Williamson et al., Nature, 2019; Yu et al., under review, 2025)
- **WRF-CMAQ** (Mao et al., JGR, 2025)
- **E3SMv3** (Luo et al., to be submitted, 2025)

# Advanced Particle Microphysics (APM) for 3-D Models

- APM considers particle nucleation, condensation, coagulation, equilibrium/partition, and deposition processes.
- APM includes 40 size-bins for secondary particle, 15 size-bins for OC and BC, 20 size-bins for sea salt, and 15 size-bins for dust.



Secondary particles (SP) : 40 bins  
(composed of  $\text{SO}_4$ ,  $\text{NO}_3$ ,  $\text{NH}_4$ , SOA)

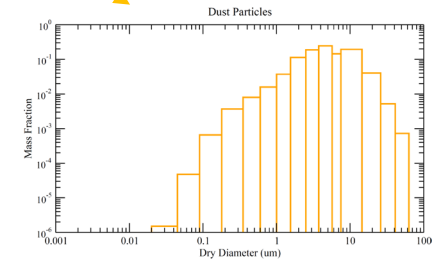
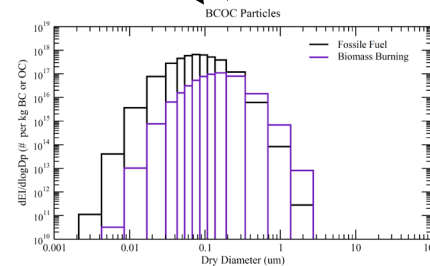
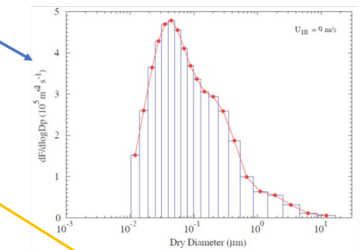
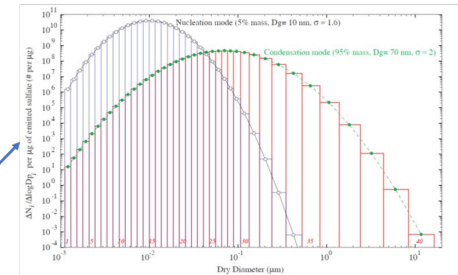
Sea salt particles: 20 bins

Dust: 15 bins

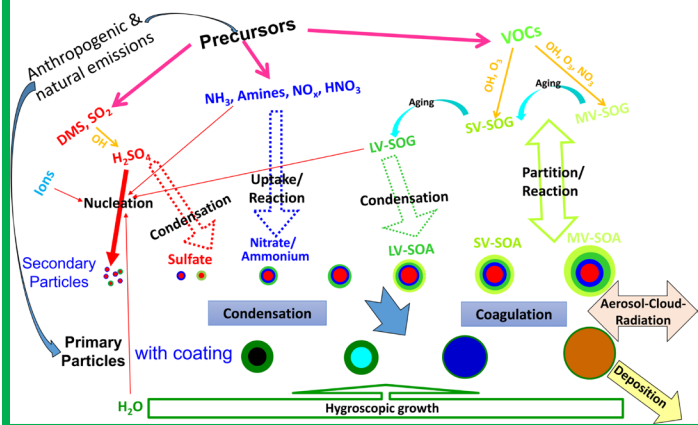
BC: 15 bins

Primary OC: 15 bins

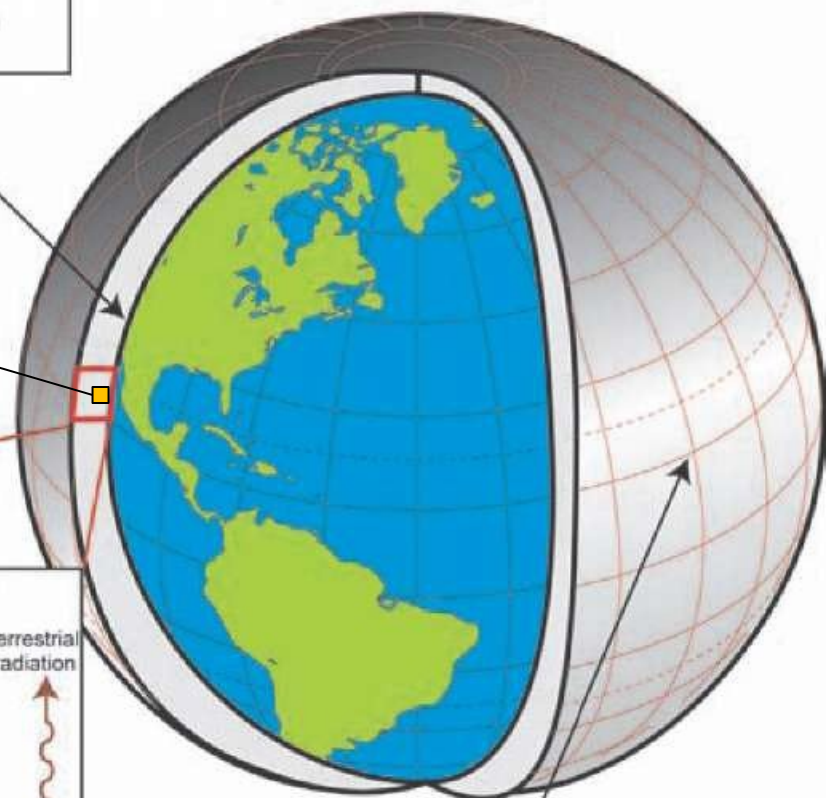
Coating of primary particles by secondary species tracked.



# Formation and evolution of atmospheric particles

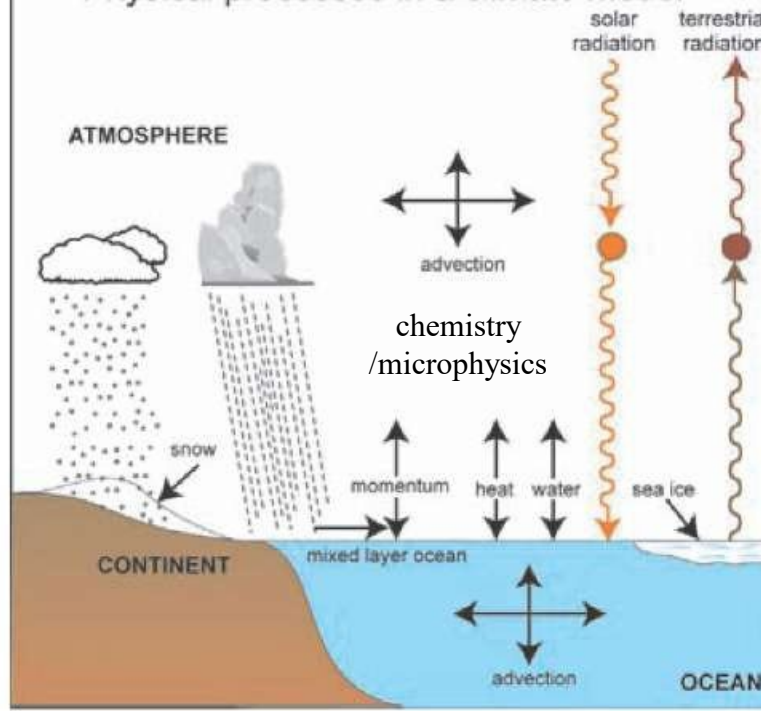


Vertical grid  
height or pressure



Horizontal grid  
latitude-longitude

## Physical processes in a climate model





# Key features of APM

**Binary and Ternary Ion-Mediated Nucleation (IMN)**  
**and other Nucleation Schemes** (Yu and Turco, GRL1997, GRL 2000, JGR 2001, ACP 2008, 2011; Yu, JCP 2005, ACP 2006, JGR 2010; Yu et al., 2017, 2018)

**Equilibrium uptake of  $\text{NH}_3$ ,  $\text{HNO}_3$ , and  $\text{H}_2\text{O}$ :**  
**ISORROPIA II** (Fountoukis and Nenes, ACP, 2007)

**SOA formation:** Extended 2-product method which considers successive oxidation aging and kinetic condensation (Yu, ACP, 2011)

**Mixing state:** Semi-externally mixed that tracks the amount of secondary species coated on primary particles (Yu and Luo, ACP, 2009; Yu et al., ACP, 2011)

**Validation:** Computationally efficient and simulations validated by a large number field measurements (Yu and Luo, 2009, 2010; Yu, 2010; Luo and Yu, 2011a, b; Yu et al., 2011, 2012; Ma et al., 2012a, b)

GEOS-Chem-APM

## GEOS-Chem-APM (Yu and Luo, 2009)

- ✓ Full chemistry (NO<sub>x</sub>, SO<sub>x</sub>, VOCs, etc.)
- ✓ Full size-resolved microphysics
- ✓ Offline assimilated meteorology
- ✓ Suitable for studies of processes and global long-term simulations

## Computing cost (24-core workstation)

GEOS-Chem (2°x2.5° , 47 layers, **1 yr**)

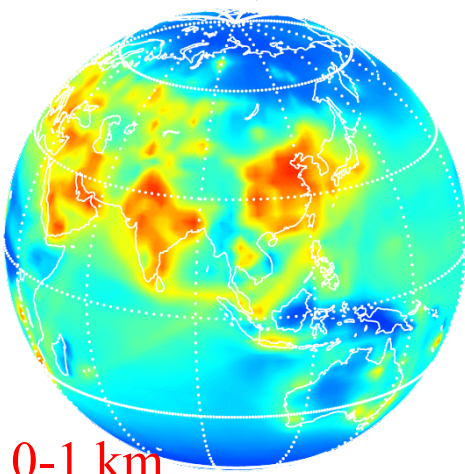
Original model	With APM
----------------	----------

59 tracers	59+88= 147 tracers
------------	--------------------

~ <b>5</b> day	~ <b>11</b> days
----------------	------------------



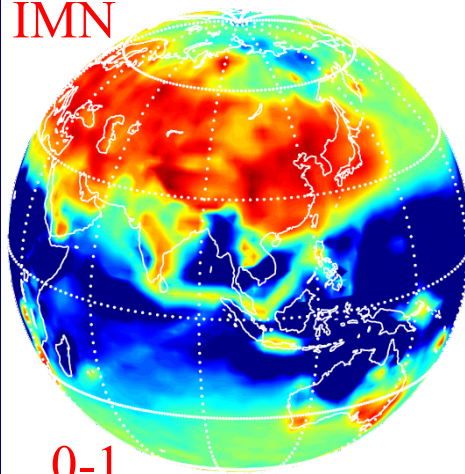
$[\text{H}_2\text{SO}_4]10^6 \text{ \# cm}^{-3}$ : Annual, 2005



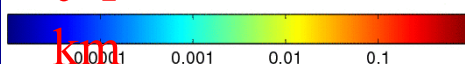
0-1 km



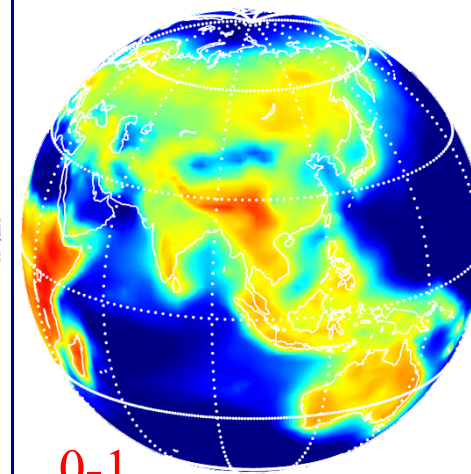
$J (\text{\# cm}^{-3} \text{ s}^{-1})$ : Annual, 2005



0-1 km



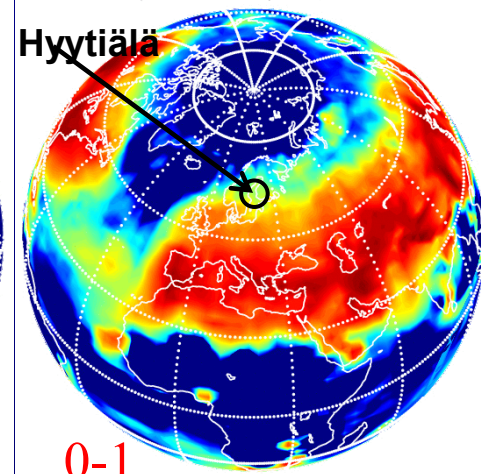
$[\text{LV-SOG}]10^6 \text{ \# cm}^{-3}$ : Annual, 2005



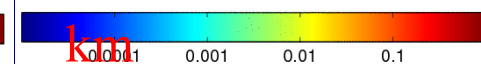
0-1 km



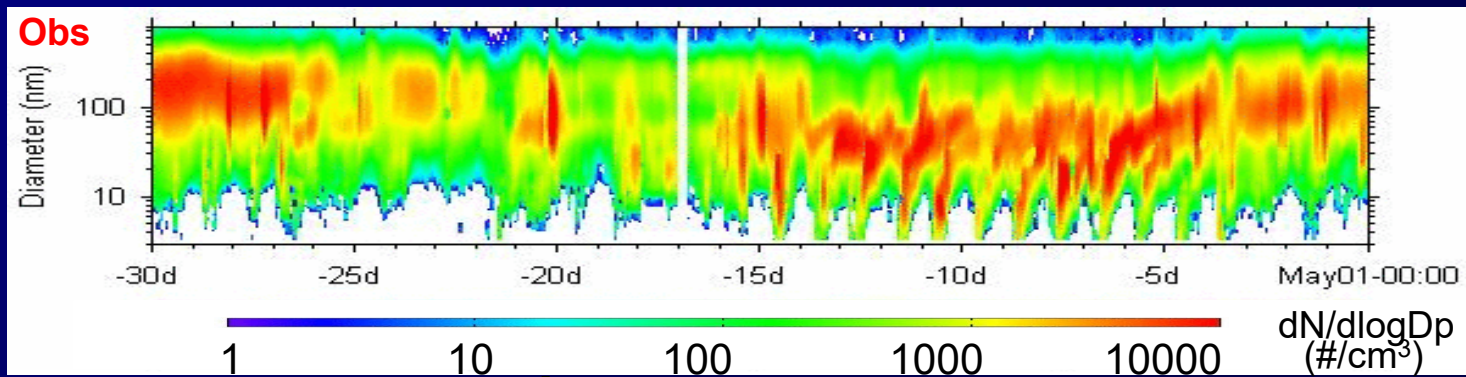
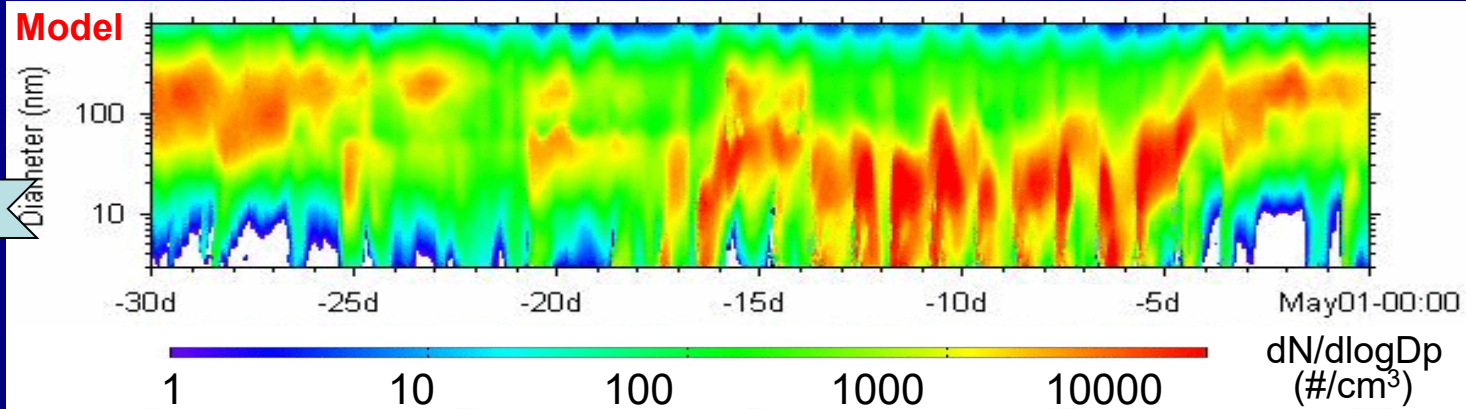
$J (\text{\# cm}^{-3} \text{ s}^{-1})$ : 01, 2005



0-1 km



CN  
CCN/IN  
Ext Coef.  
AOD

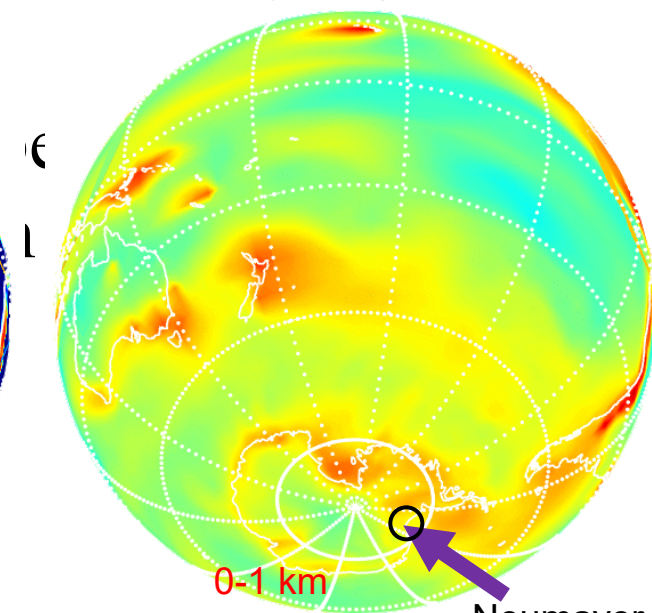
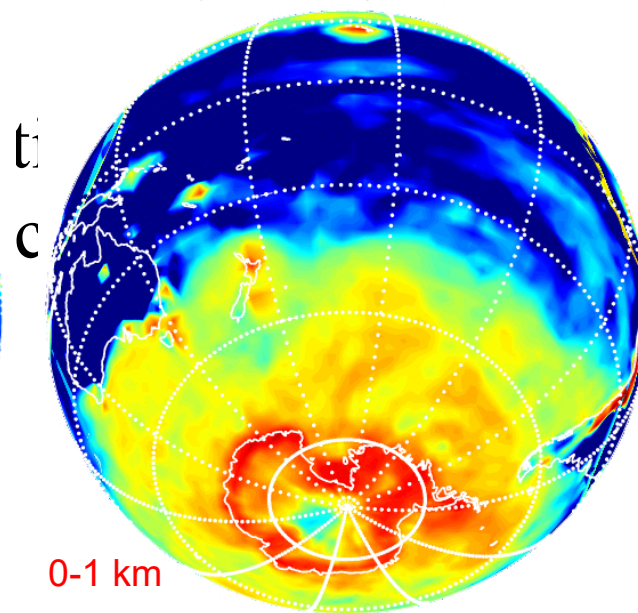
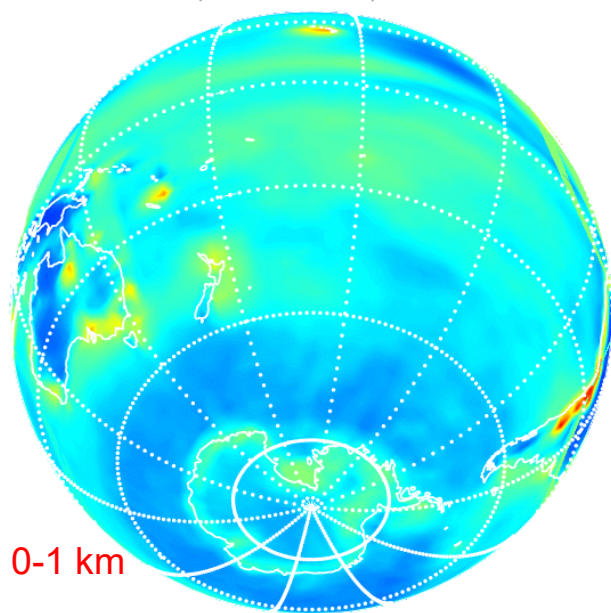


Data  
acknowledgements:  
Prof Markku Kulmala,  
CREATE and  
EUSSAR data base.

$[\text{H}_2\text{SO}_4]$  ( $10^6 \# \text{ cm}^{-3}$ ): 01, 2005

$J$  ( $\# \text{ cm}^{-3} \text{ s}^{-1}$ ): 01, 2005

CN10 ( $\# \text{ cm}^{-3}$ ): 01, 2005



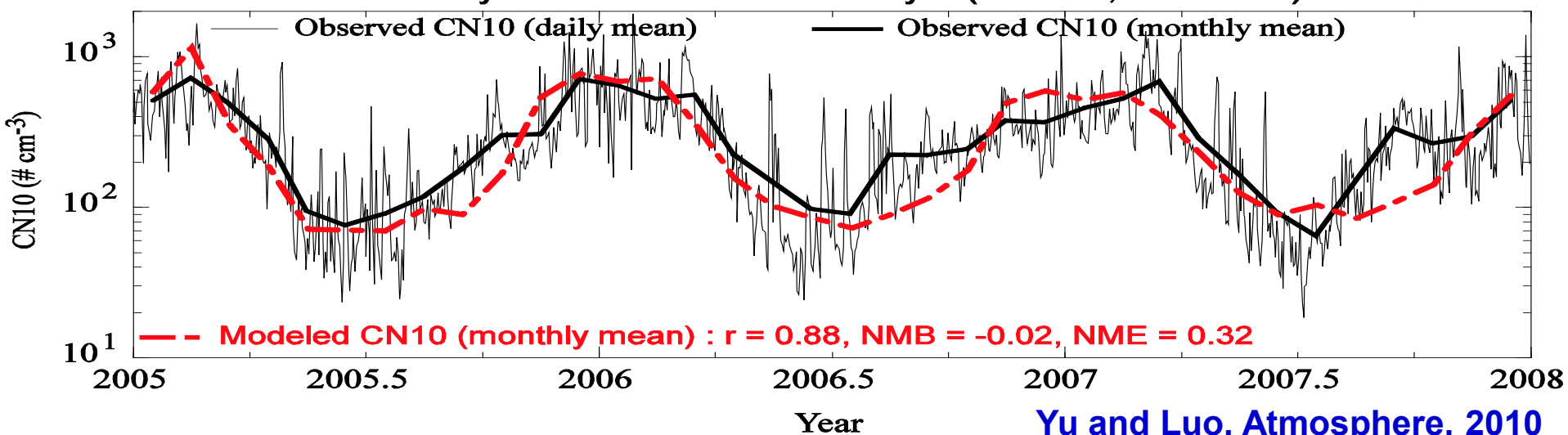
0-1 km

0-1 km

0-1 km

Neumayer

### Germany Antarctic station Neumayer ( $70^{\circ}40'S$ , $008^{\circ}16'W$ )



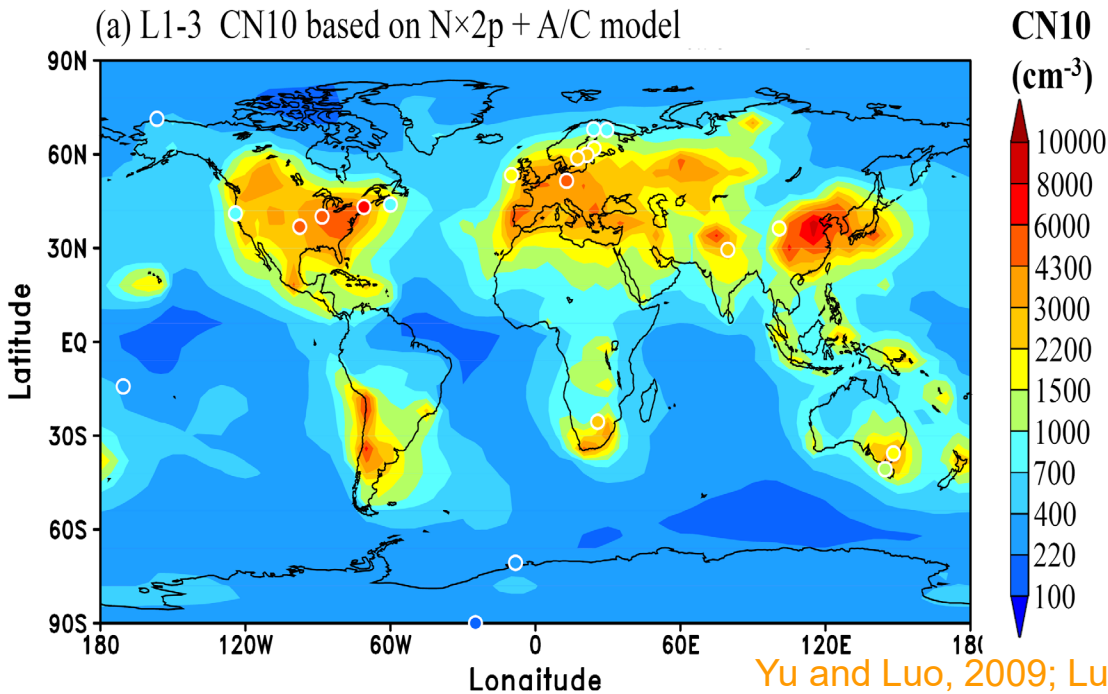
Yu and Luo, Atmosphere, 2010

Modeling results are for surface layer

data references: König-Langlo et al. (1998), Weller and Lampert (2008)

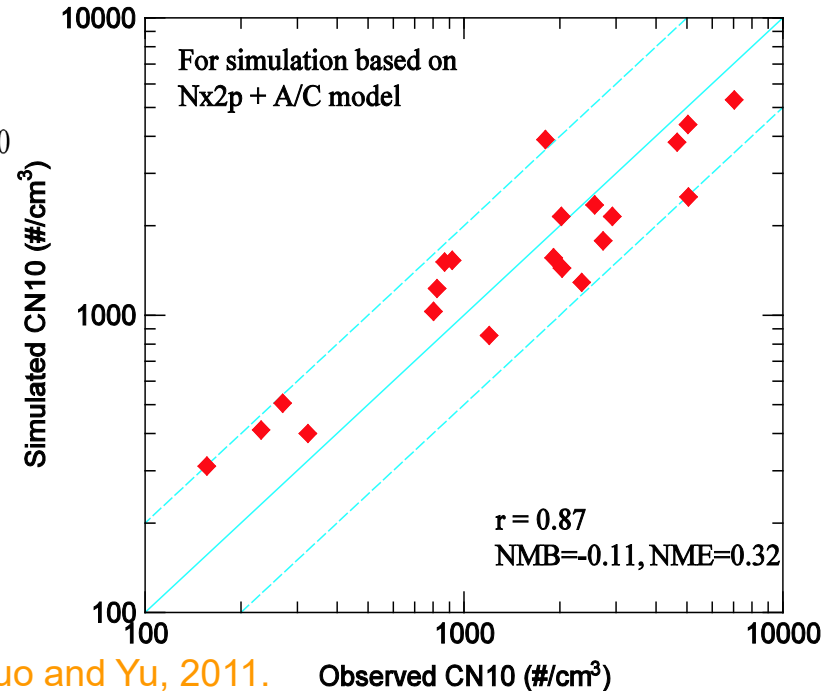


(a) L1-3 CN10 based on  $N \times 2p + A/C$  model

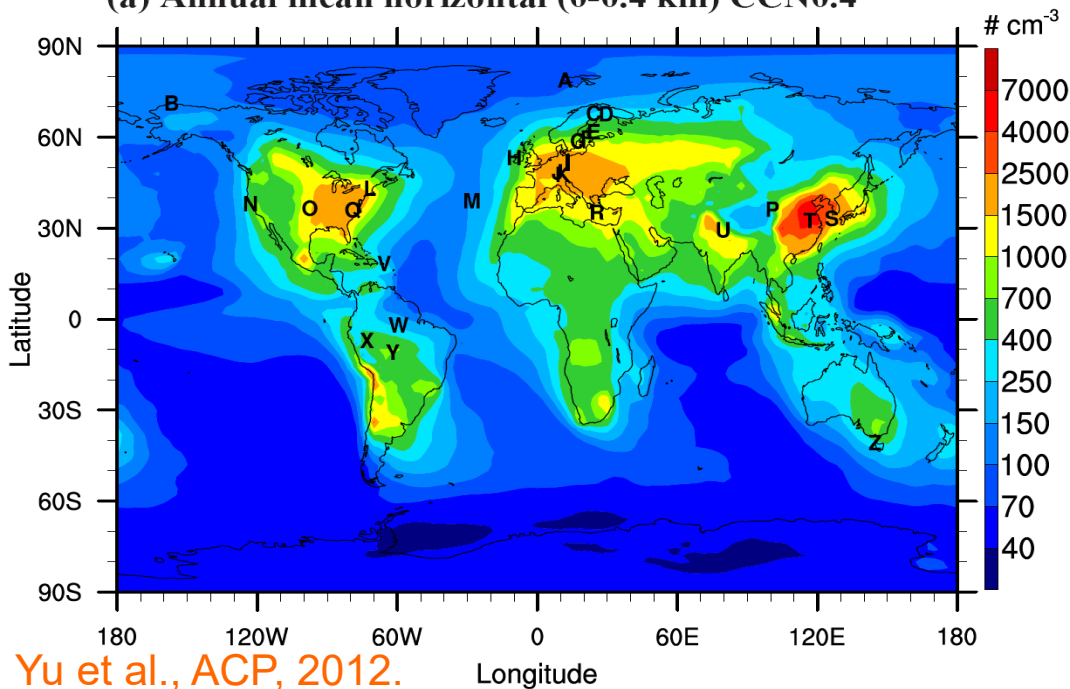


Yu and Luo, 2009; Luo and Yu, 2011.

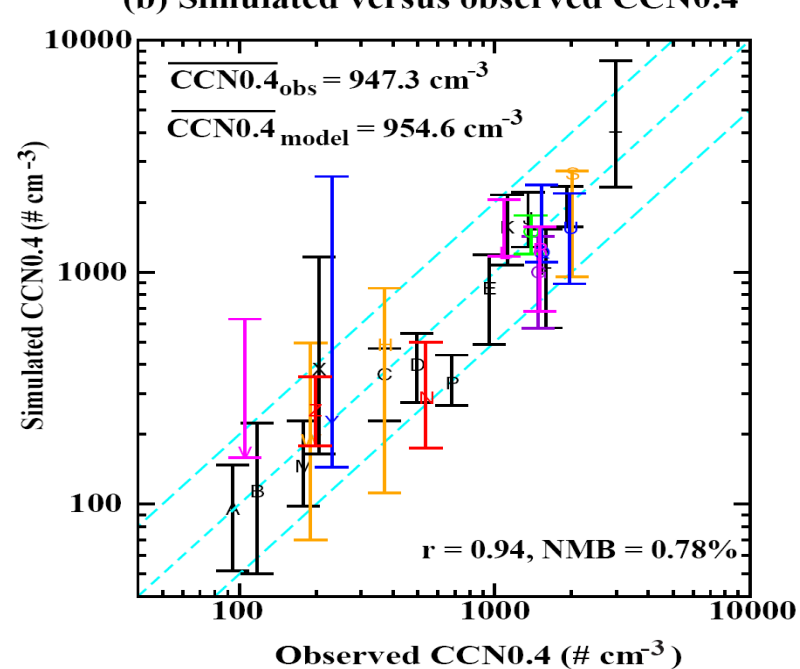
CN10  
( $\text{cm}^{-3}$ )



(a) Annual mean horizontal (0-0.4 km) CCN0.4



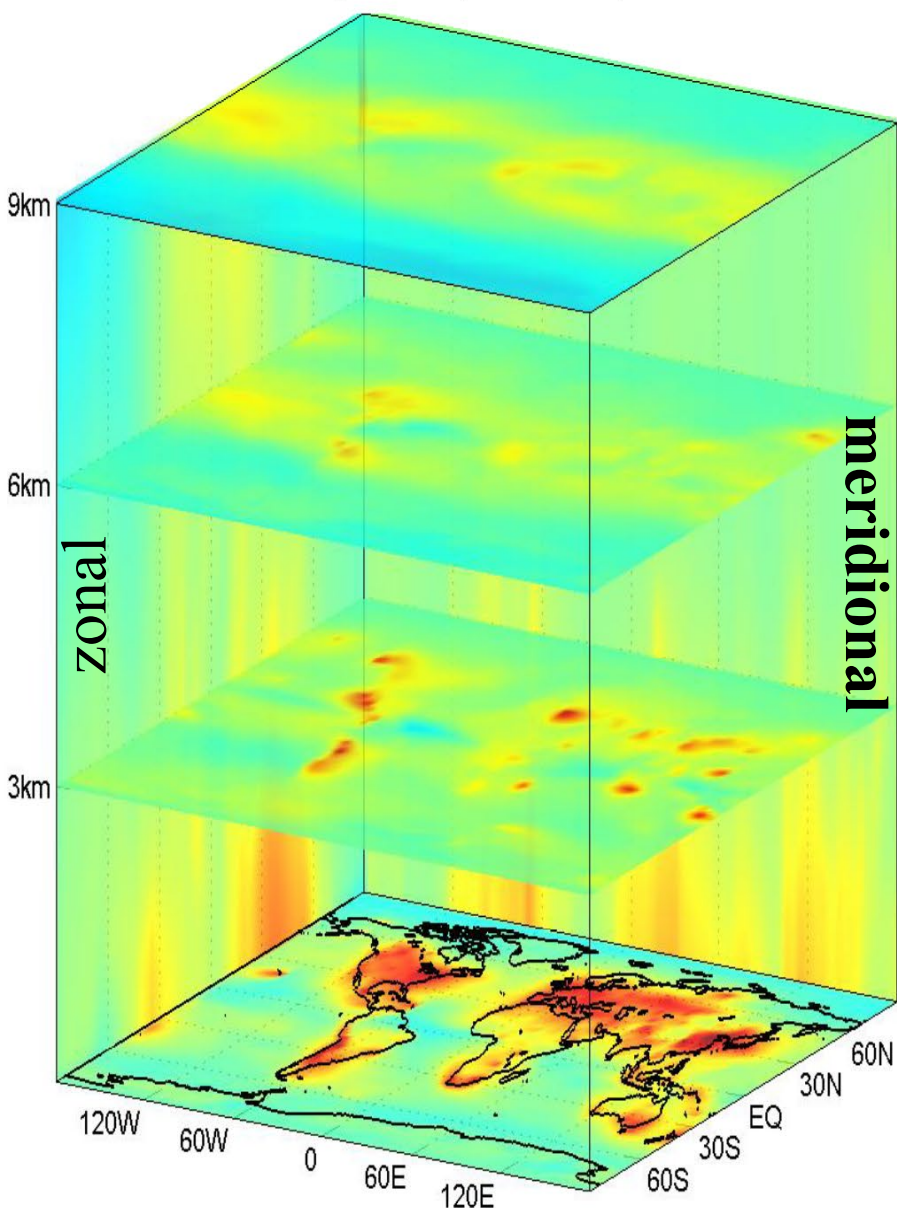
(b) Simulated versus observed CCN0.4



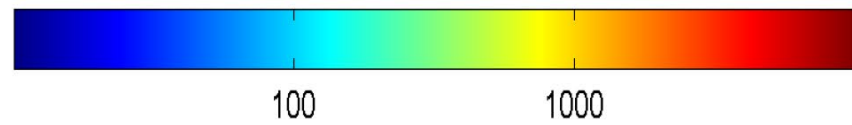
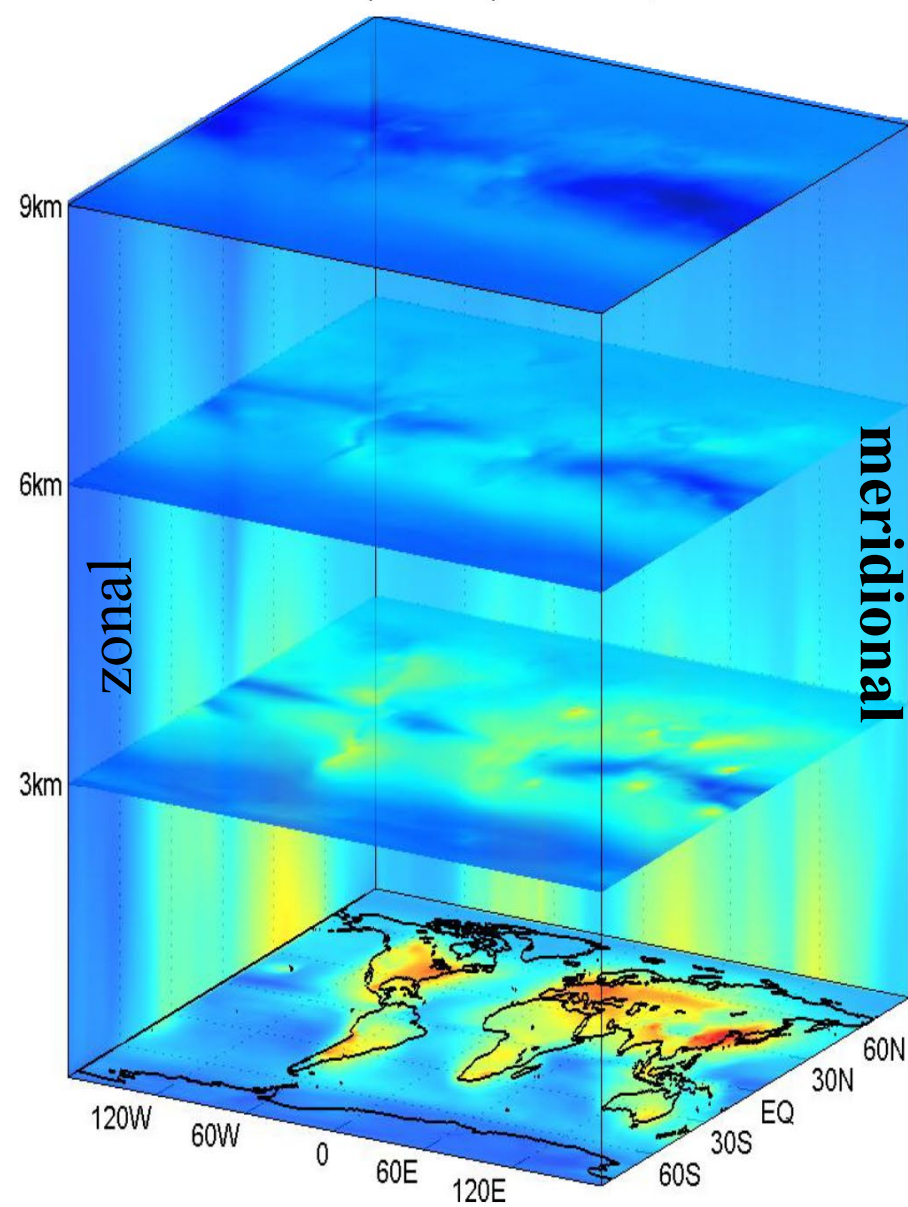
Yu et al., ACP, 2012.



CN10 ( $\# \text{ cm}^{-3}$ ): Annual, 2006

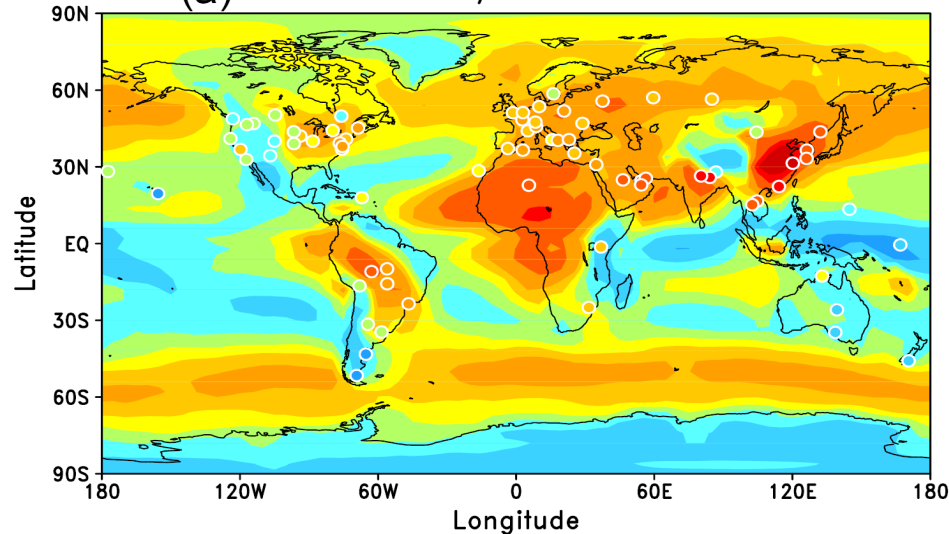


CCN0.4 ( $\# \text{ cm}^{-3}$ ): Annual, 2006

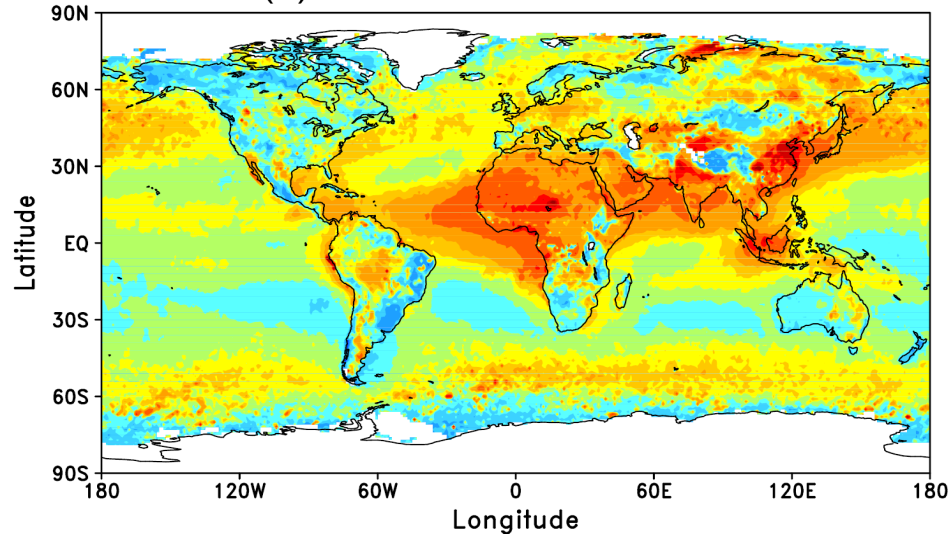


# Comparison with AOD measurements

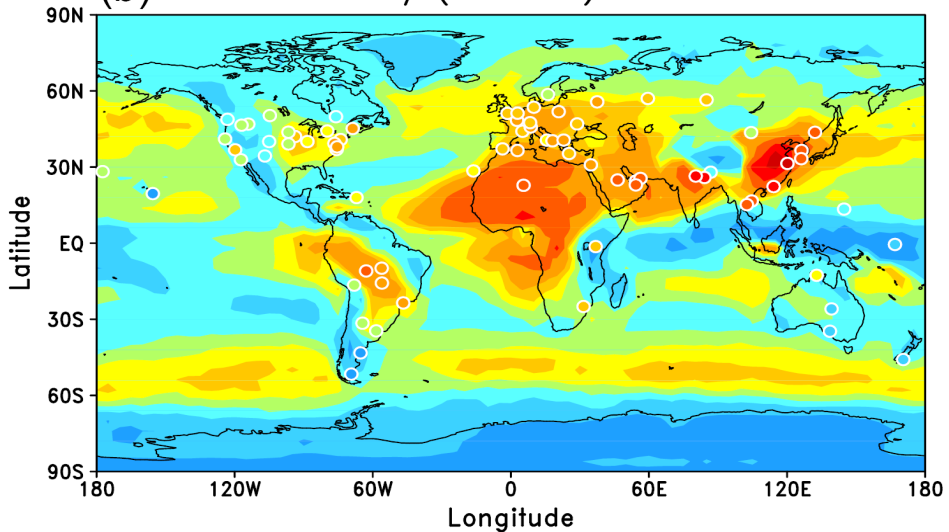
(a) 2006 all sky AOD @500 nm



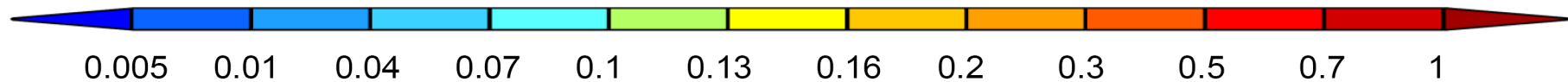
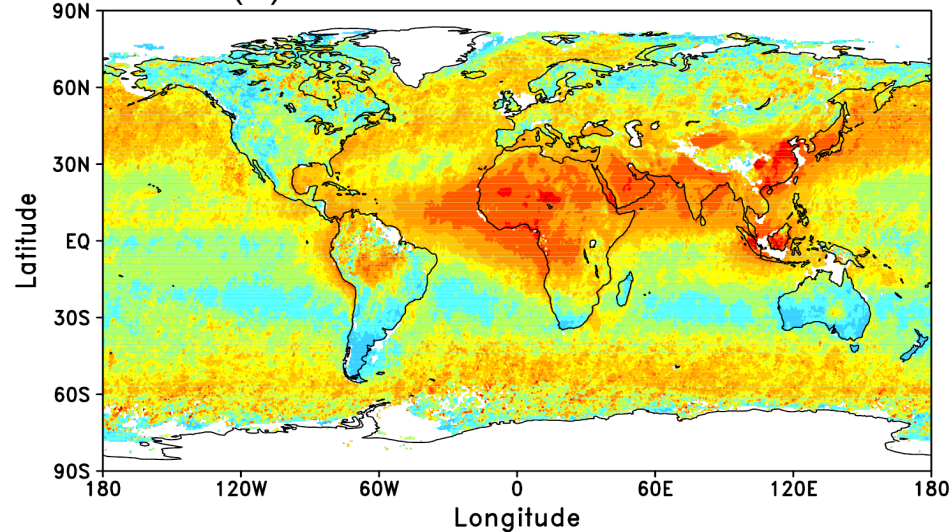
(c) 2006 MODIS 1°x1° AOD



(b) 2006 clear sky (CF<50%) AOD @500 nm

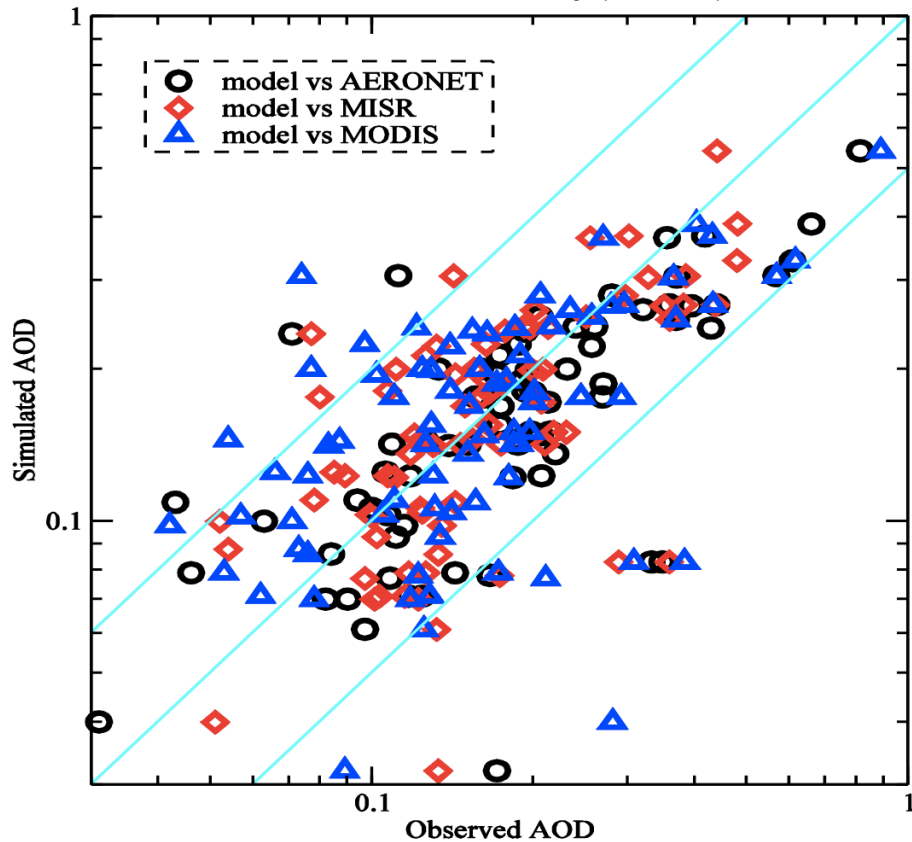


(d) 2006 MISR 0.5°x0.5° AOD

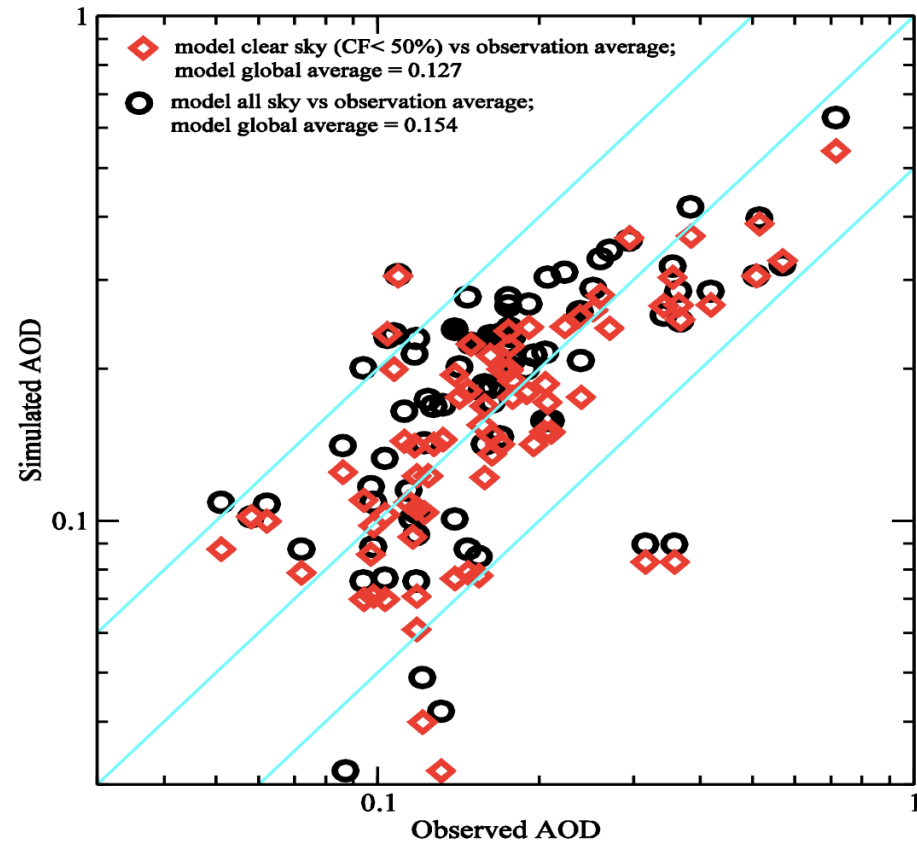


# Comparison with AOD measurements

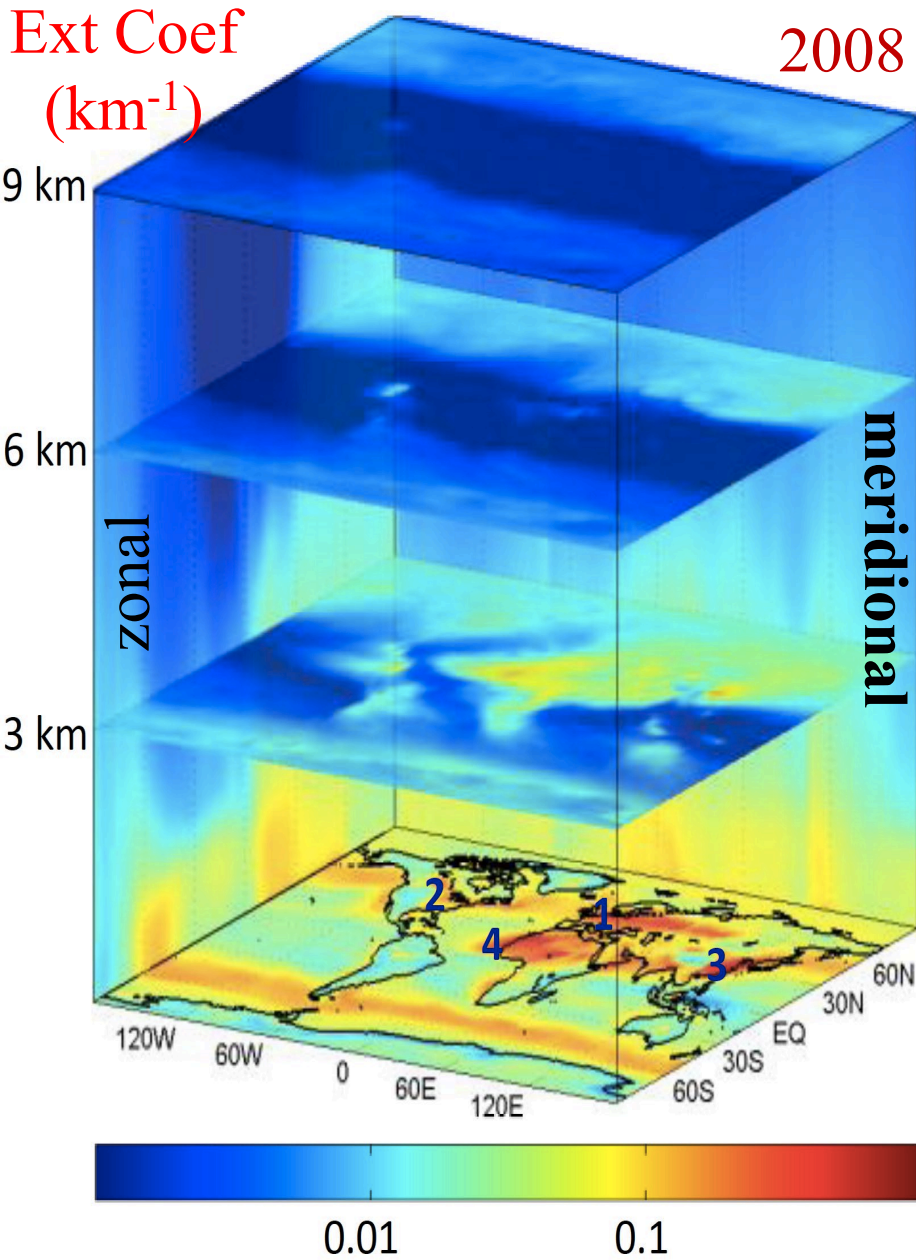
2006, model 4x5, clear sky (CF<50%)



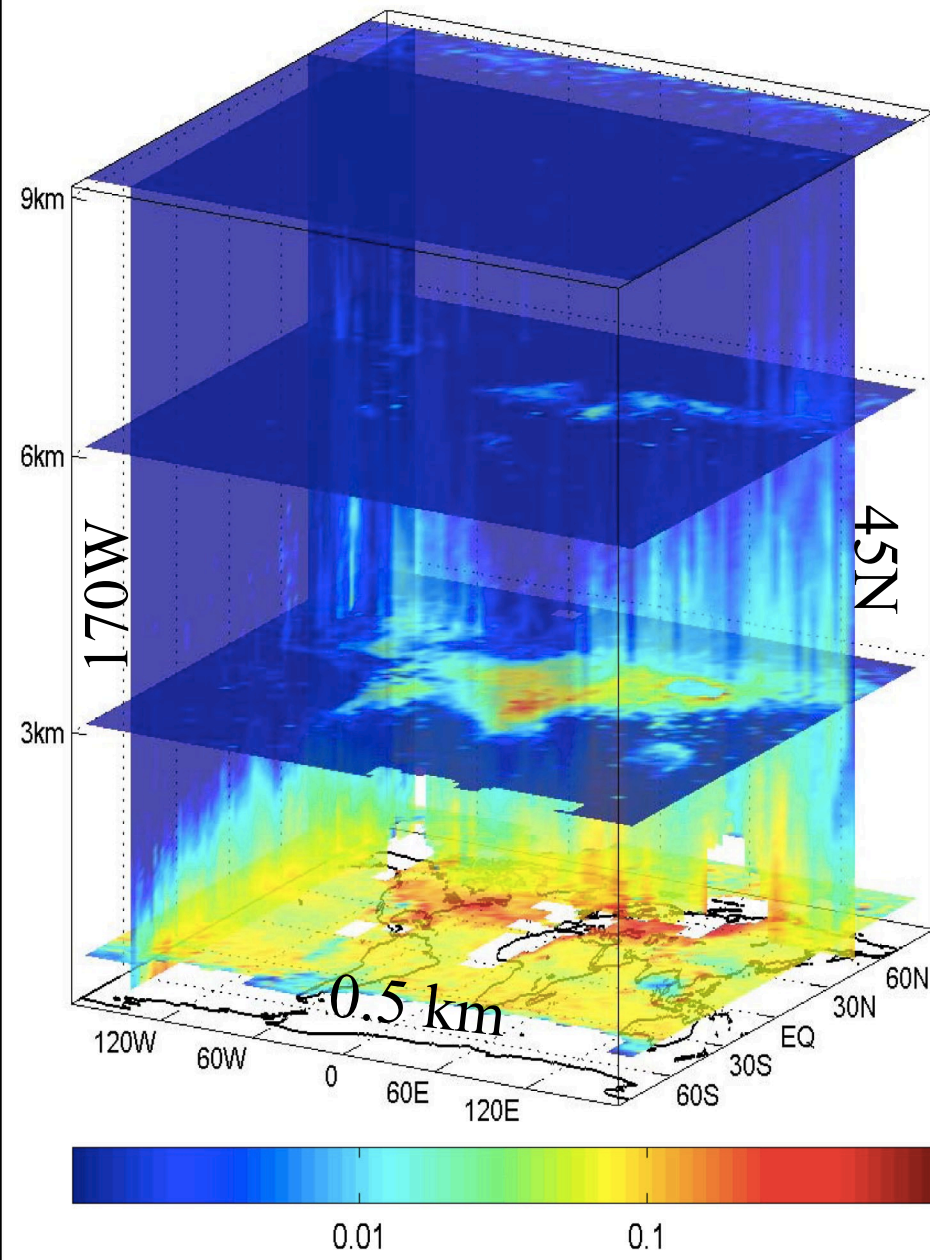
2006, model 4x5





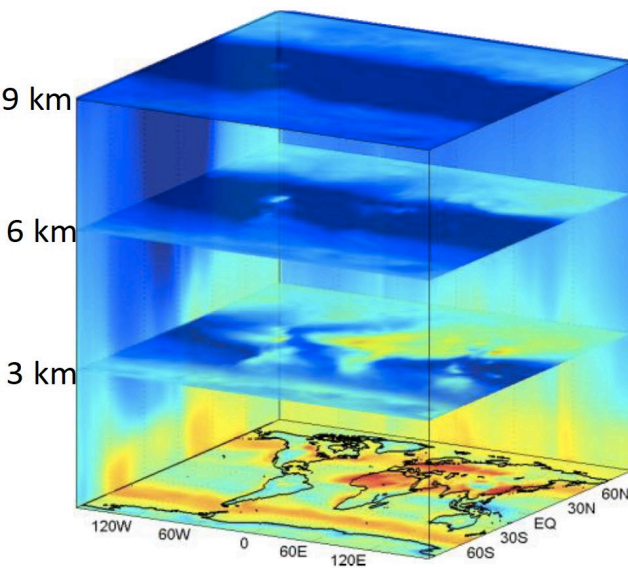


Model: All sky, annual average  
Vertical sigma coordinate

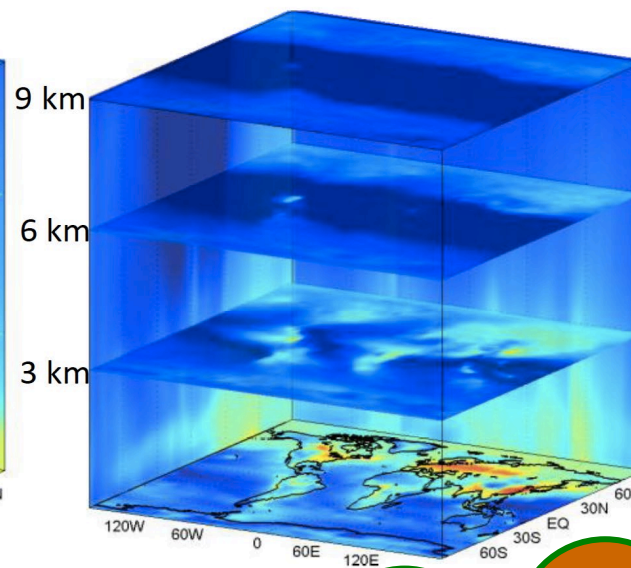


CALIOP: night time all sky, annual,  
Vertical asl coordinate

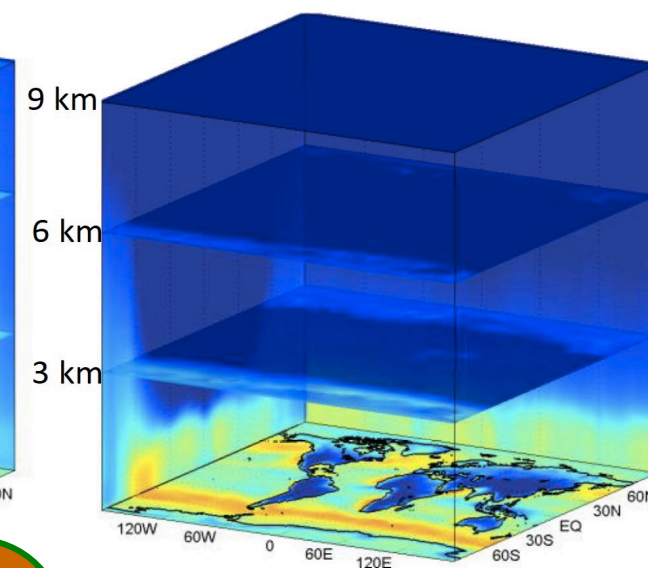
(a) Total aerosol extinction coefficient ( $\text{km}^{-1}$ )



(b) SP extinction coefficient ( $\text{km}^{-1}$ )

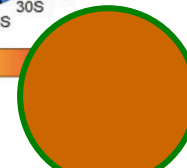
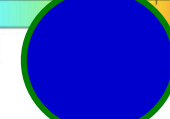
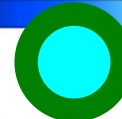


(c) Sea salt extinction coefficient ( $\text{km}^{-1}$ )

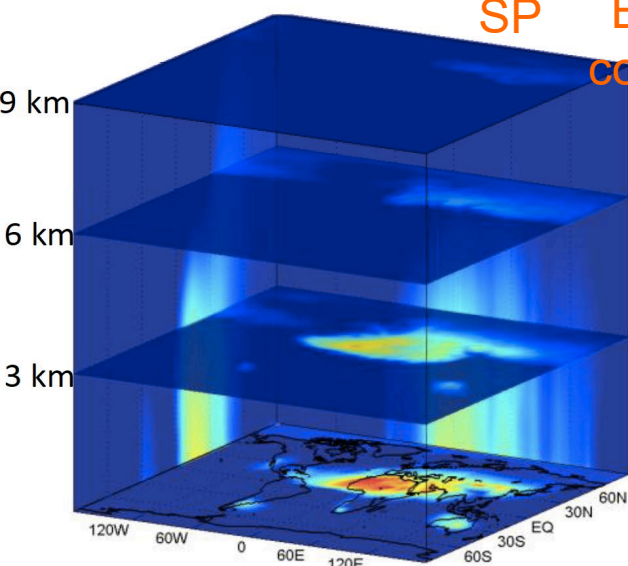


0.01

0.1



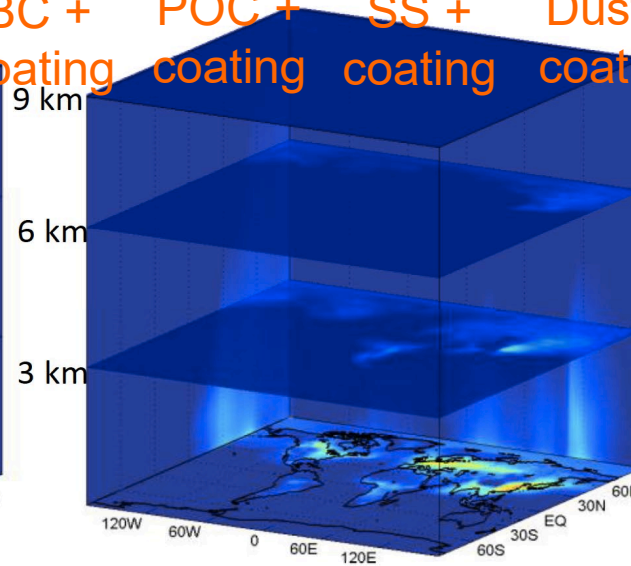
(d) Dust extinction coefficient ( $\text{km}^{-1}$ )



0.01

0.1

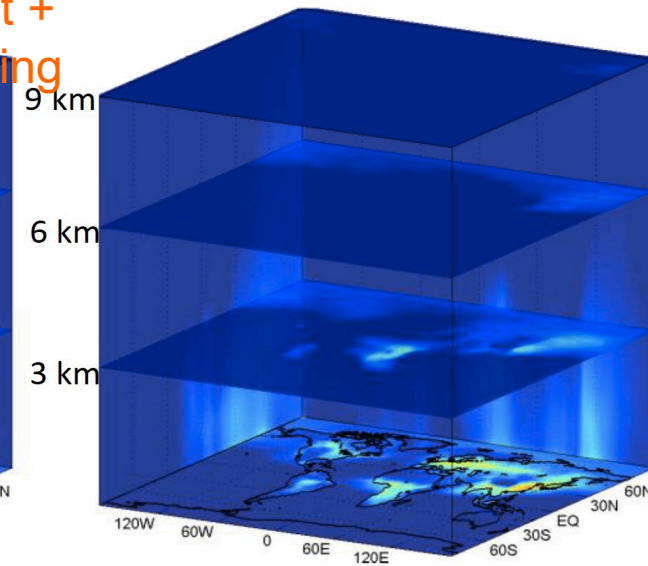
(e) Coated BC extinction coefficient ( $\text{km}^{-1}$ )



0.01

0.1

(f) Coated POC extinction coefficient ( $\text{km}^{-1}$ )



0.01

0.1

SP

BC +

POC +

SS +

Dust +

coating

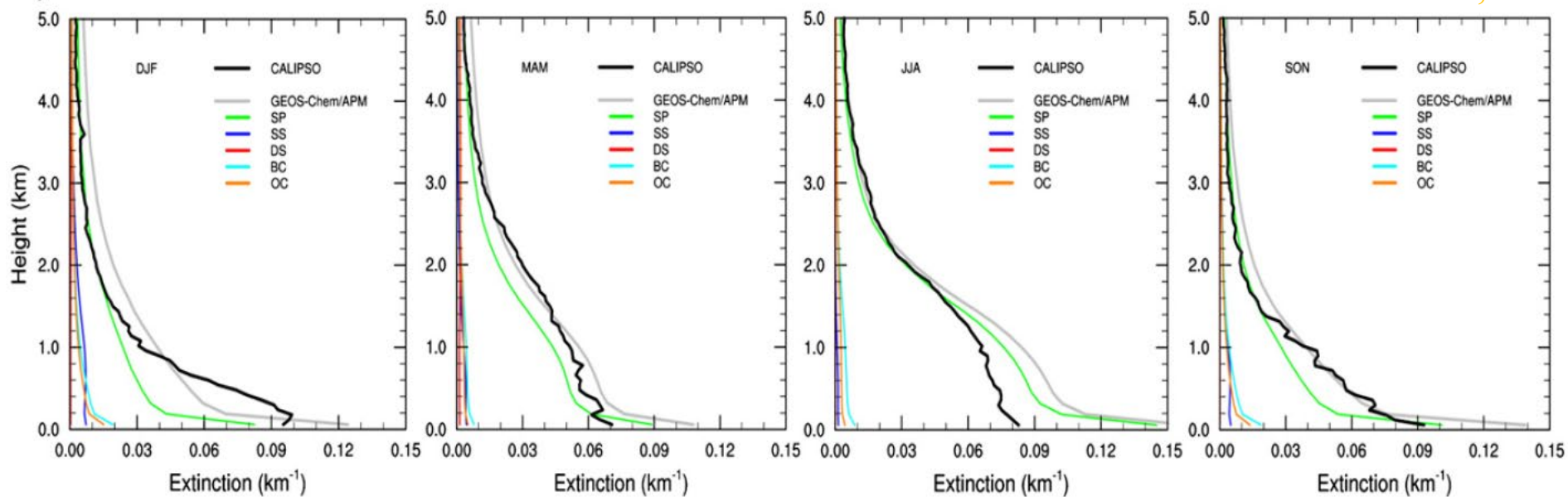
coating

coating

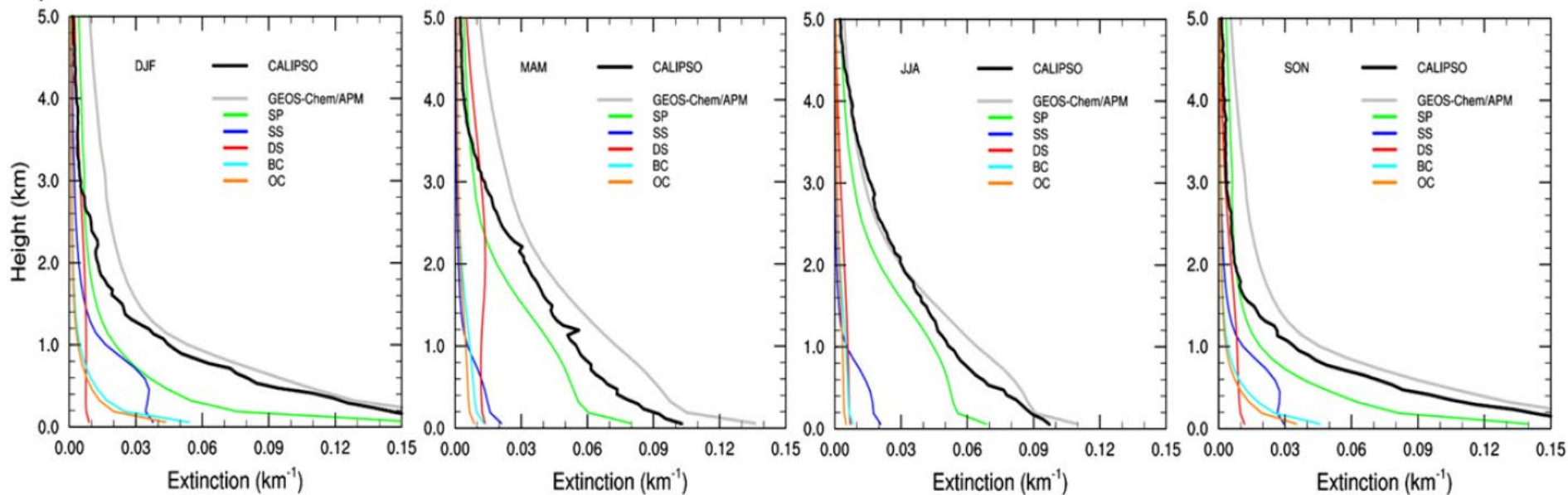
coating



a) EUS



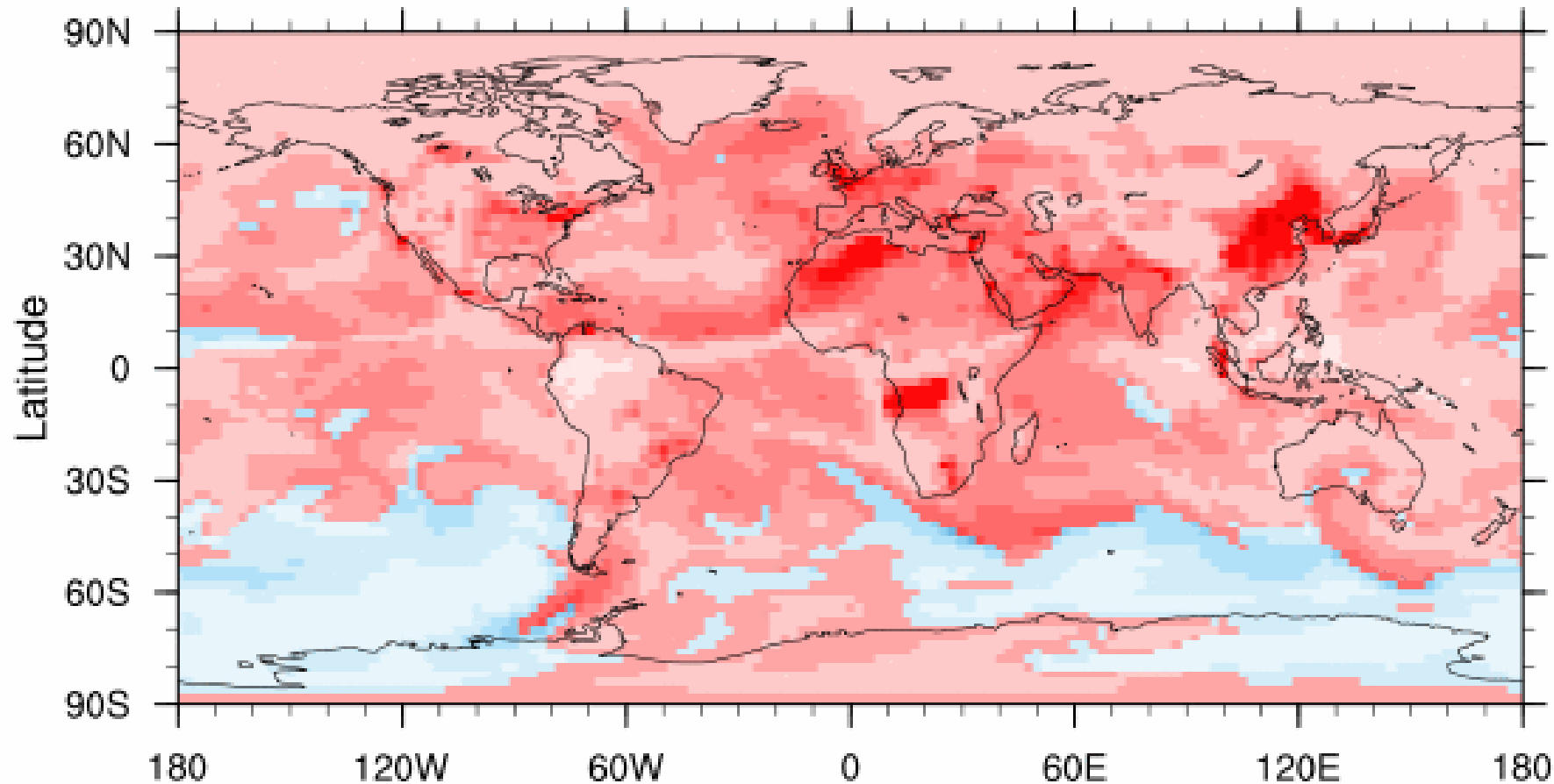
b) WEU



**Fig. 5.** Seasonal mean (DJF, MAM, JJA, and SON) extinction profiles from all aerosols and each species simulated from the GEOS-Chem/APM model, along with CALIPSO observations, over EUS (a) and WEU (b).

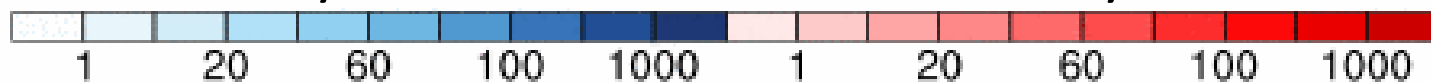
20060601 CCN L1-7

$\text{\#}/\text{cm}^{-3}$



Primary Particles

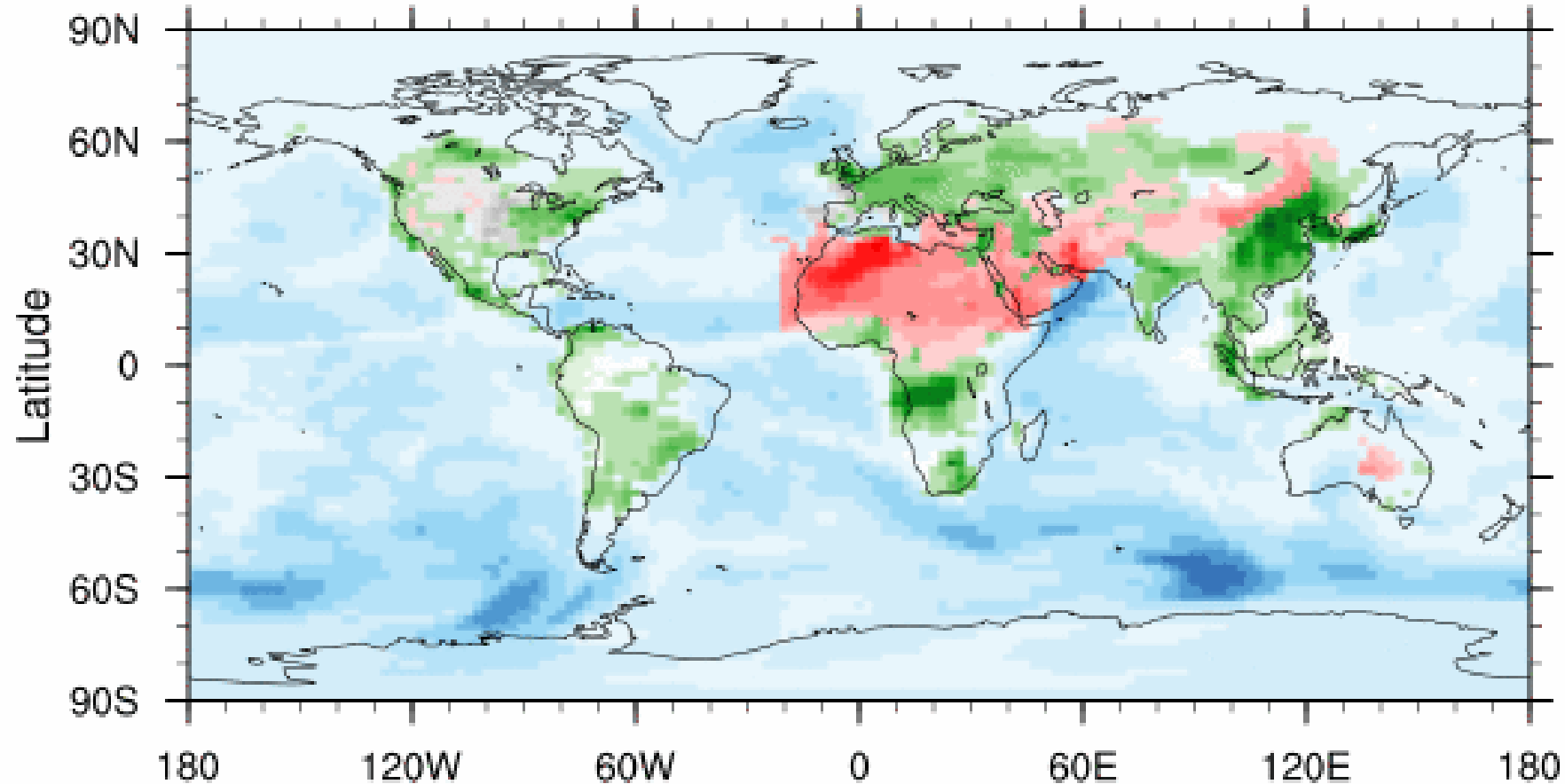
Secondary Particles



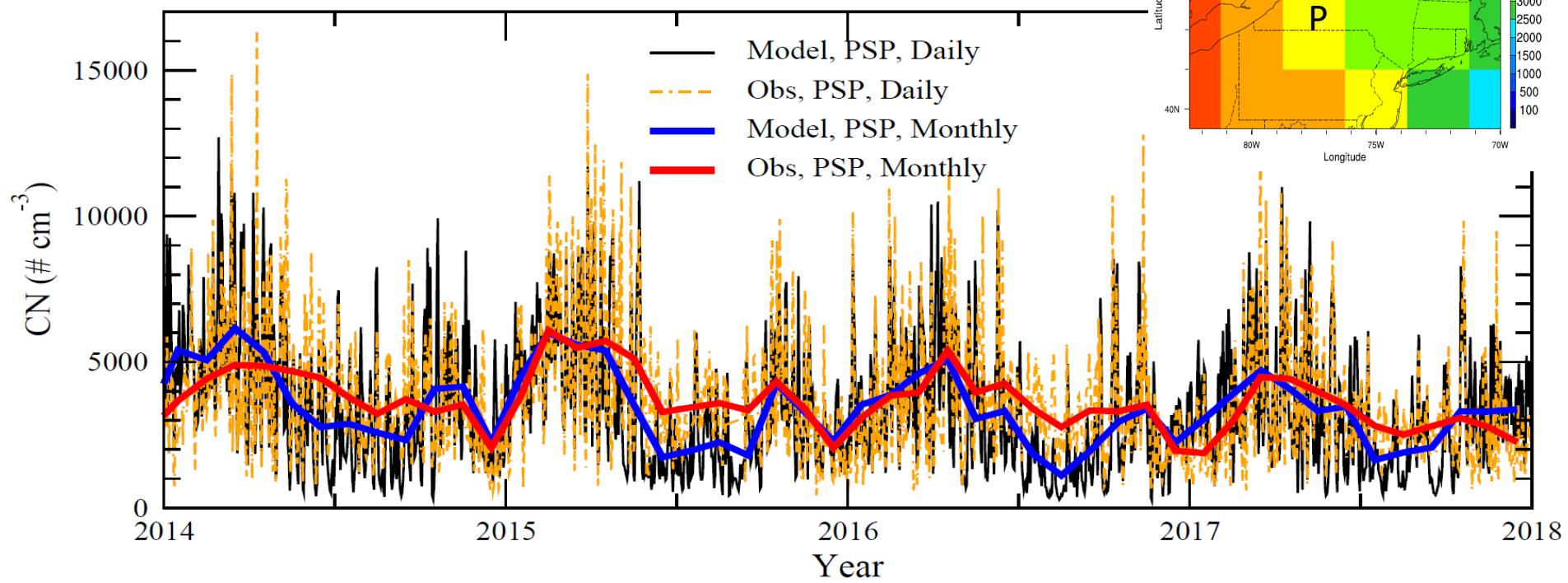
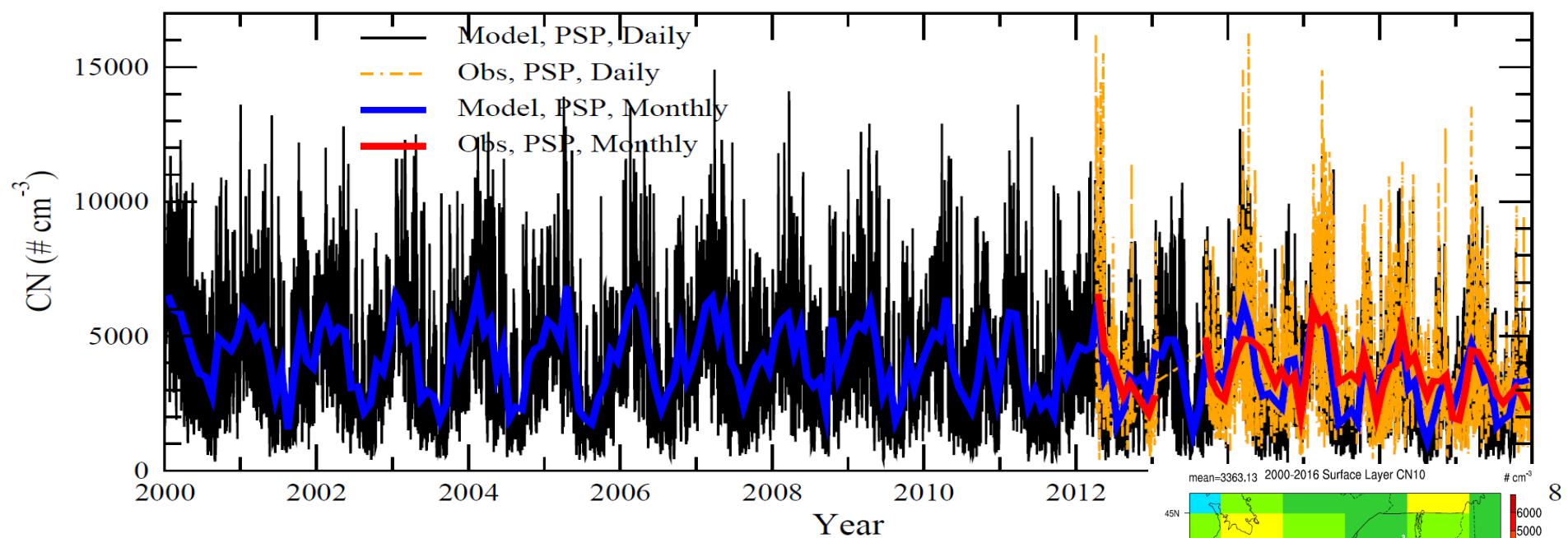
Longitude

20060601 CCN L1-7

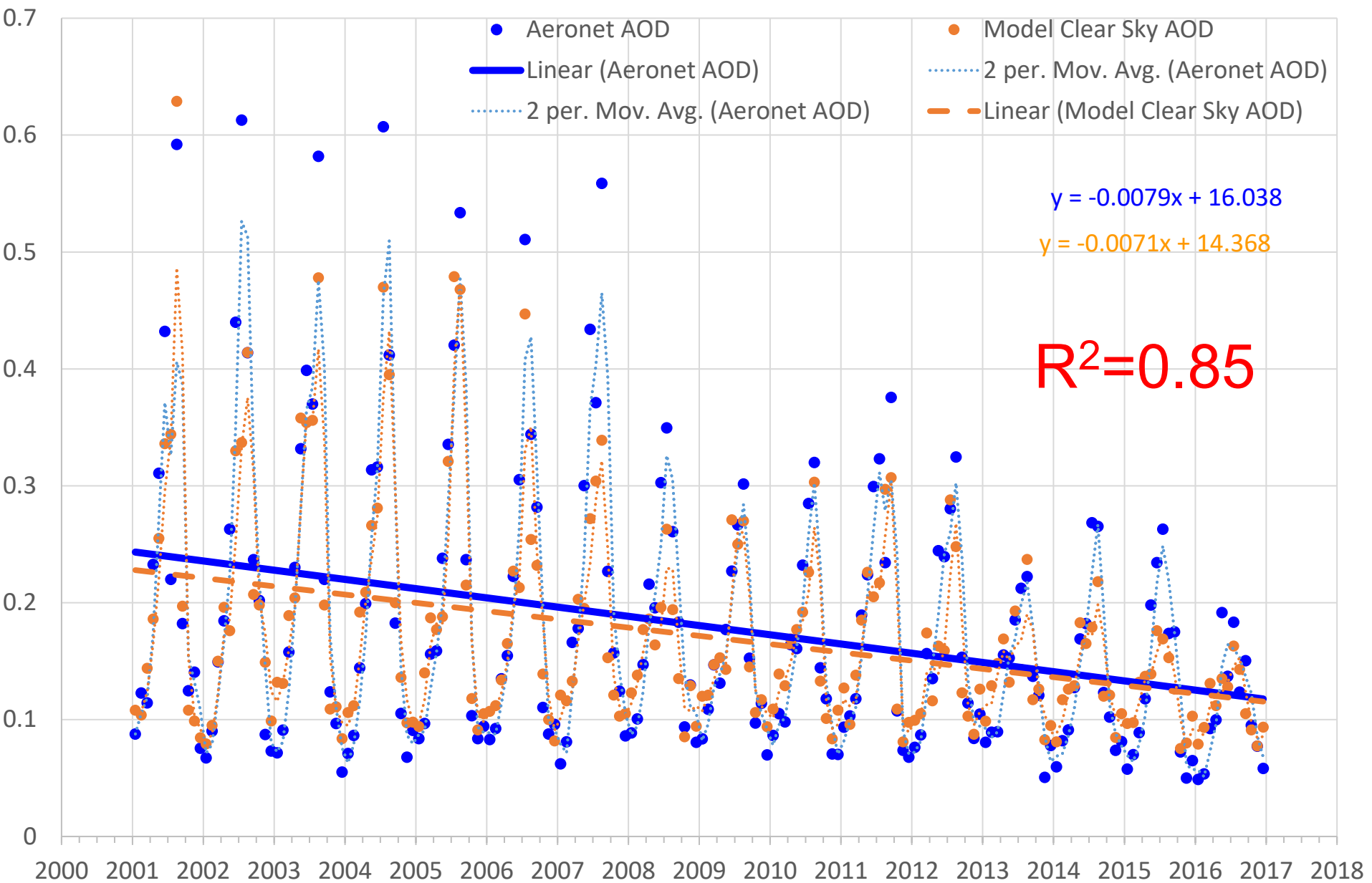
$\text{\#}/\text{cm}^{-3}$



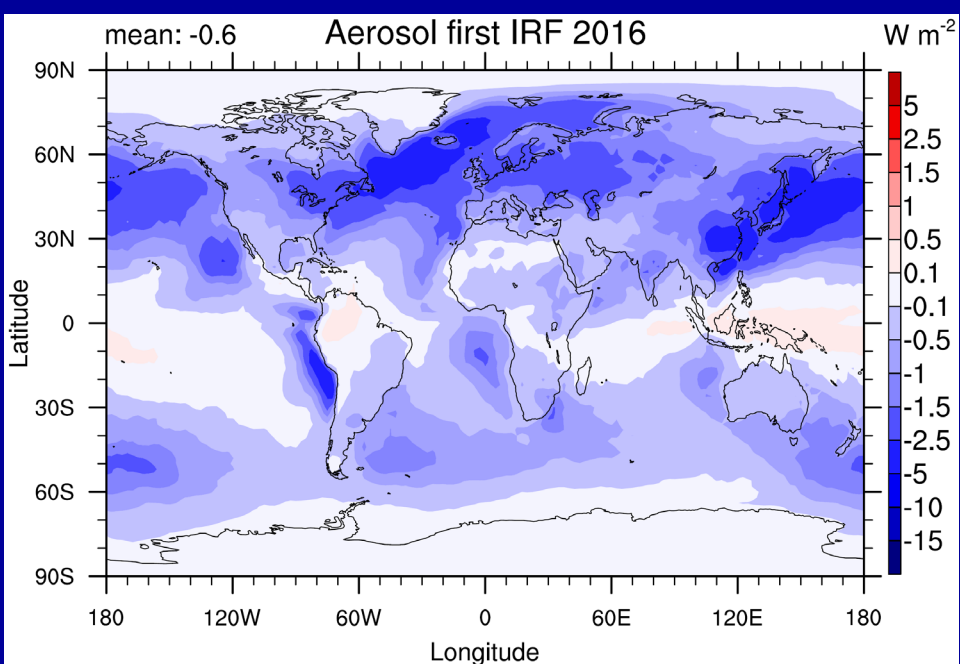
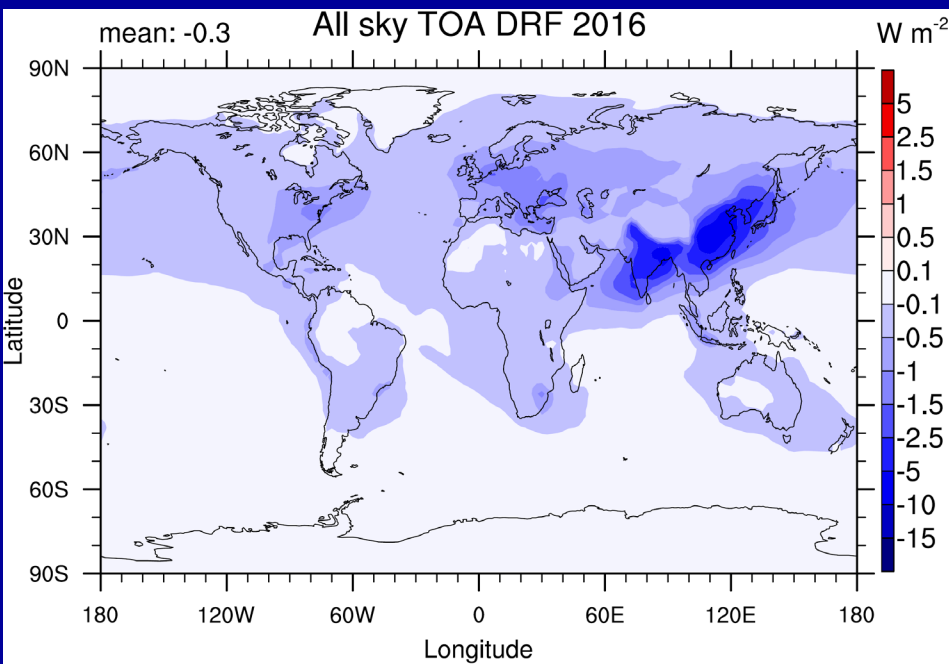
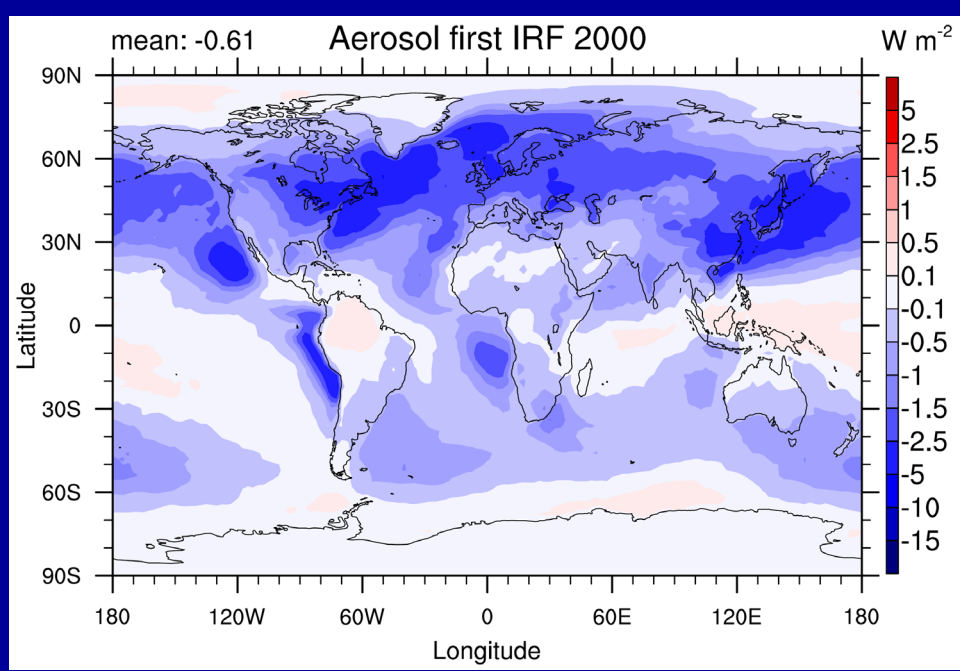
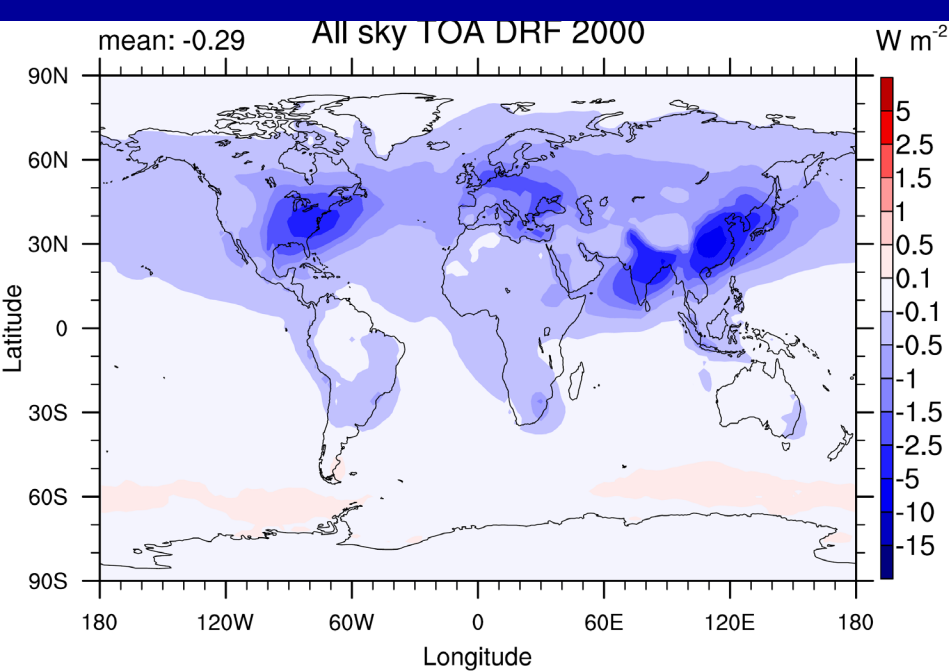
Longitude



# Long term trends of observed and modeled AOD at GSFC AERONET site







WRF-Chem-APM

# WRF-Chem-APM simulations

**Time periods:** April 5-21, 2009; May 5 – 21, 2012

**Horizontal resolution:** 27km x 27 km

**# of grid boxes:** 180 X 126 X 30

**Computing cost** (Intel Xeon, 28 cores):

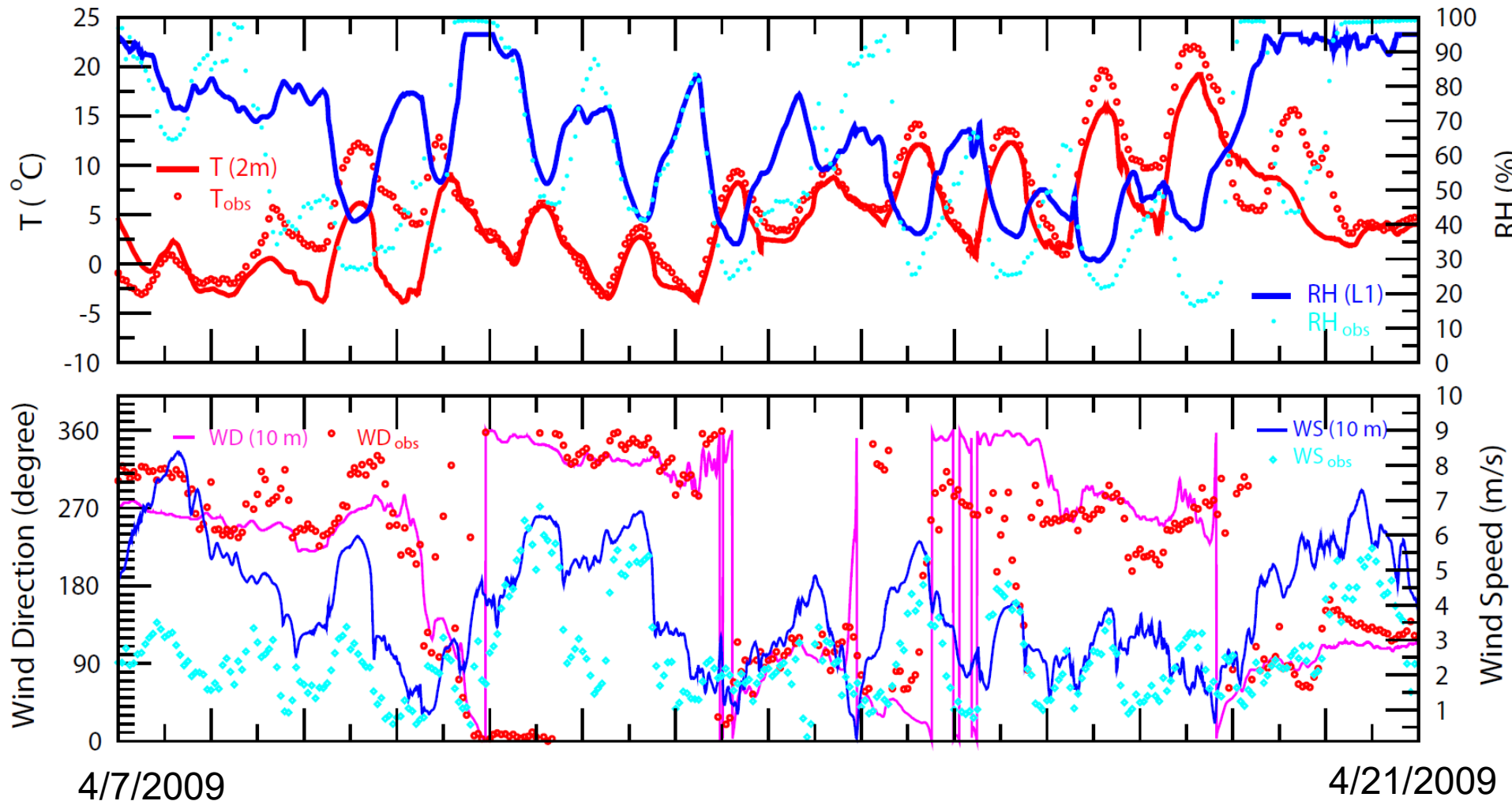
**1 hour** of wall clock for **1-day** simulation

## **Nucleation schemes:**

**Baseline:** Ion-mediated nucleation (Yu, 2010)

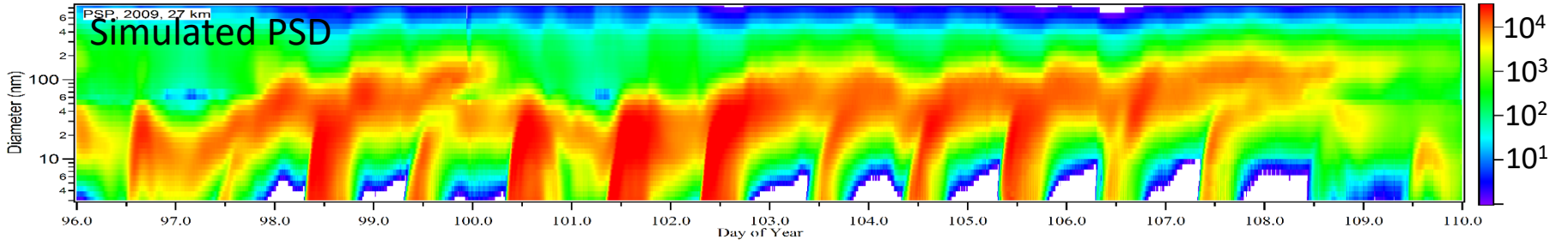
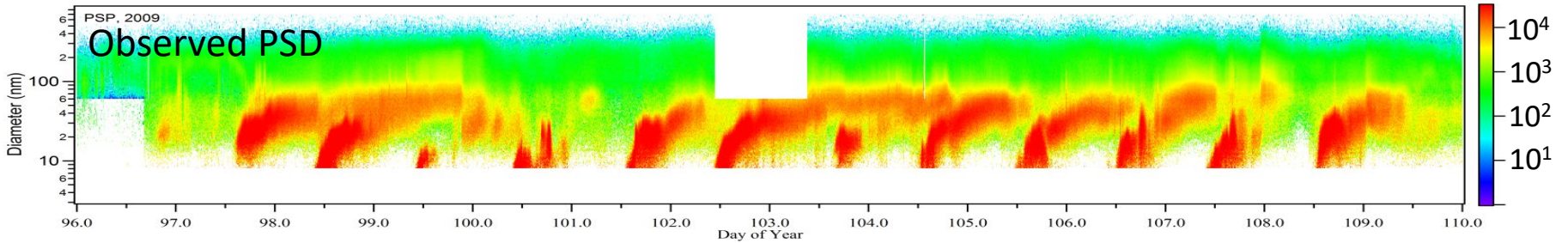
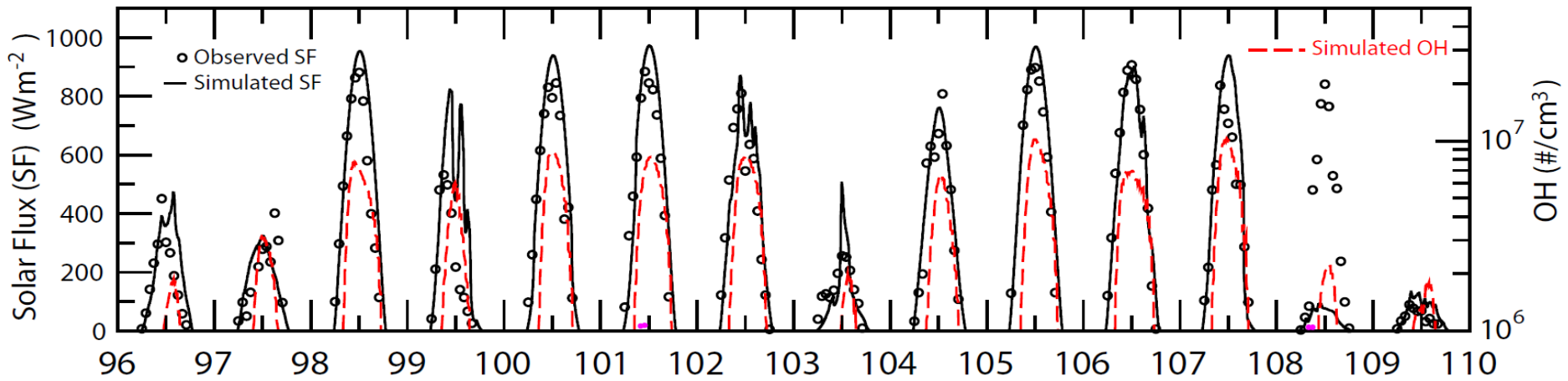
**Sensitivity study:** Organics-mediated nucleation  
(Riccobono et al., 2014)

# Comparison of simulated T, RH, Wind direction, and wind speed with observations: Overall reasonable



April 7-21, 2009

# Model captures 10 out 11 strong NPF events



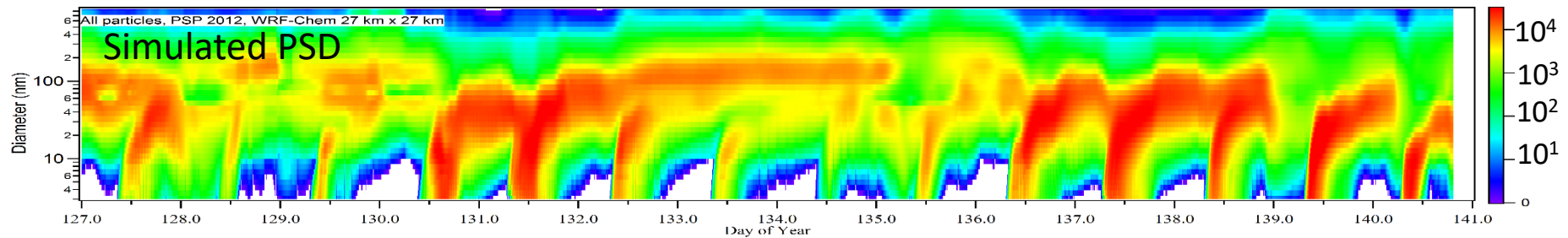
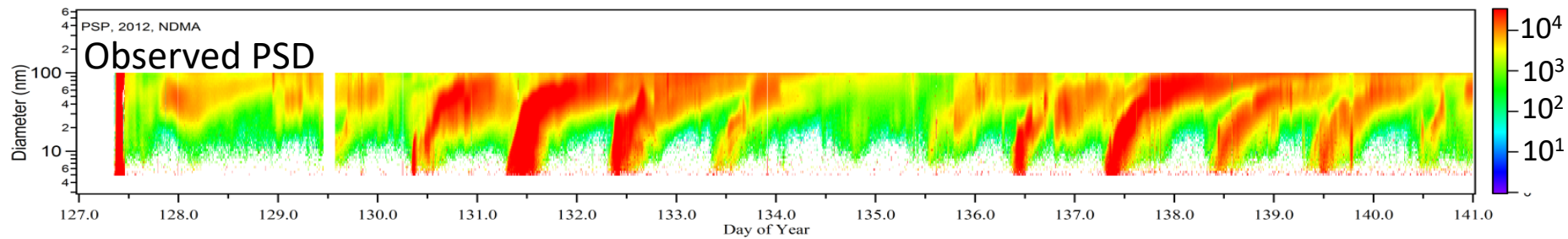
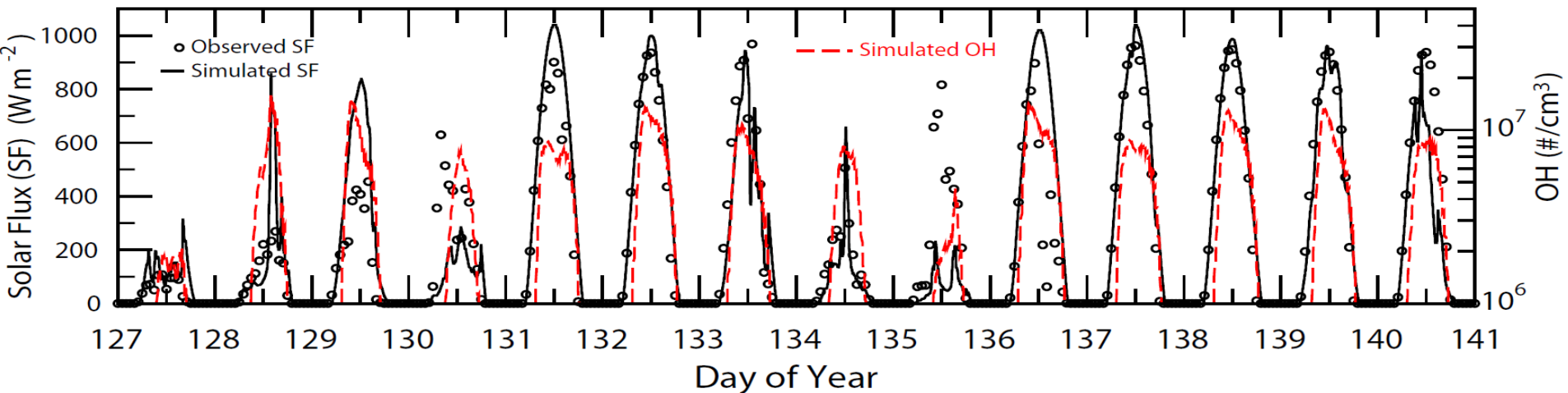
4/7/2009

4/21/2009



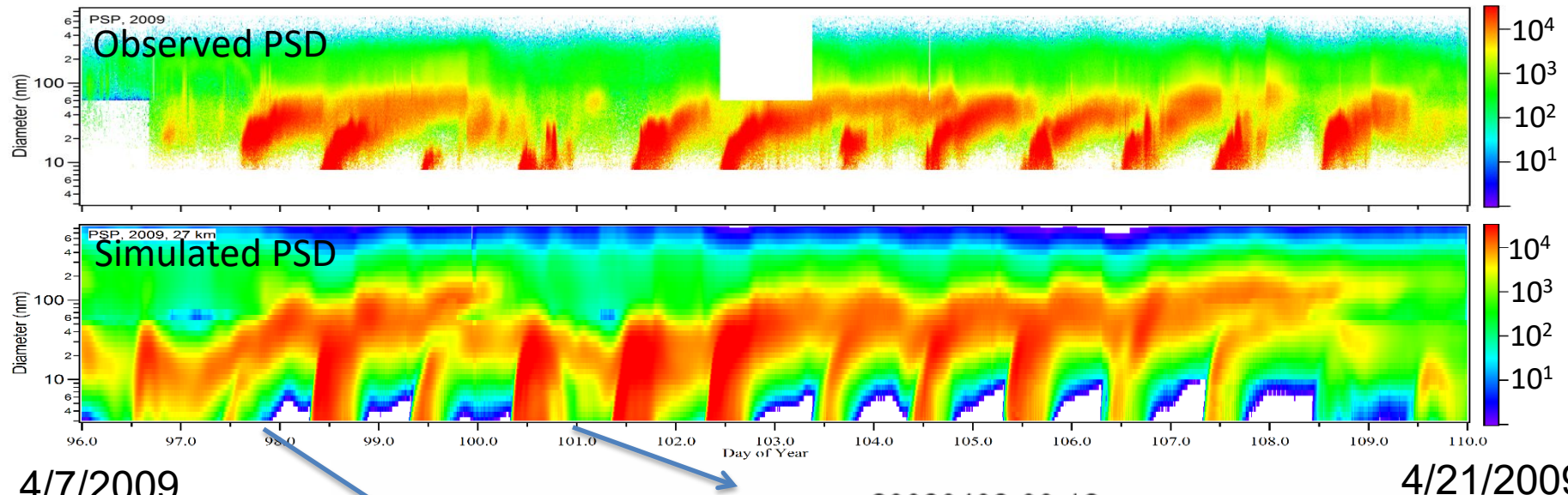
May 7-21, 2012

Model captures 7 out of 7 strong NPF events



5/7/2012

5/21/2012



**Particle  
formation  
and growth  
and  
contribution  
to CCN**

