

# Progress in the radiative modeling of ice clouds and dust aerosols for MODIS-based remote sensing

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TEXAS A&M  
UNIVERSITY

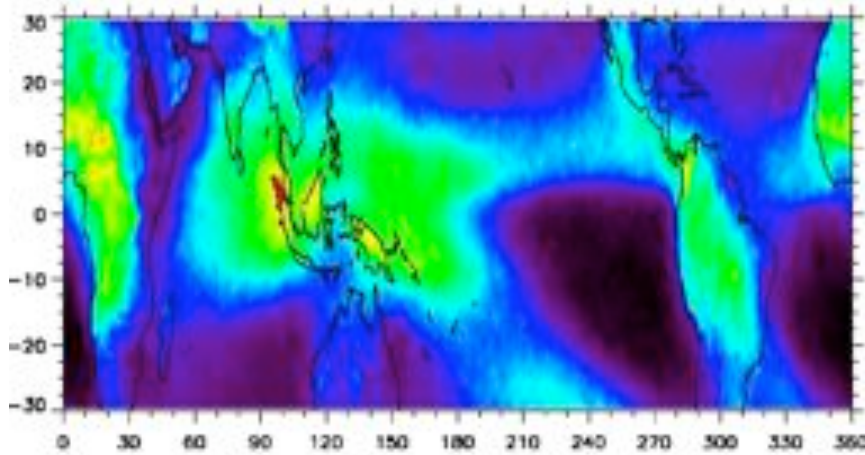
**The MODIS cloud property products provide an unprecedented opportunity to**

- **develop the climatologies of cloud microphysical and optical properties from a global perspective**
- **assess the performance of climate models**
  - **Data: GSFC-MODIS and LaRC-MODIS Aqua level 3 (1°×1°) daytime only cloud property products**
  - **Range: July 2002 to June 2007, 60°N to 60°S**
  - **CAM3: T42 (128 by 64), 26 vertical levels**
  - **Use observed monthly mean sea surface temperature and sea ice concentration (Hurrell et al., 2008) to force the climate model**

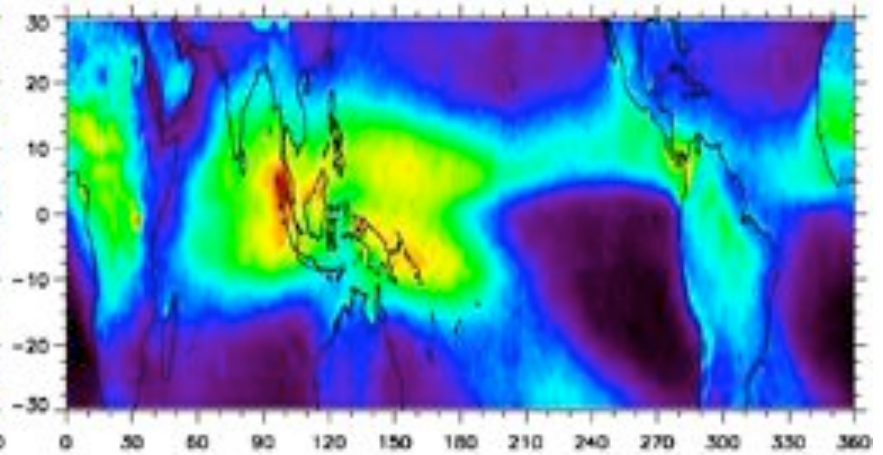
# Geographical Distribution of Cloud Fraction

Terra

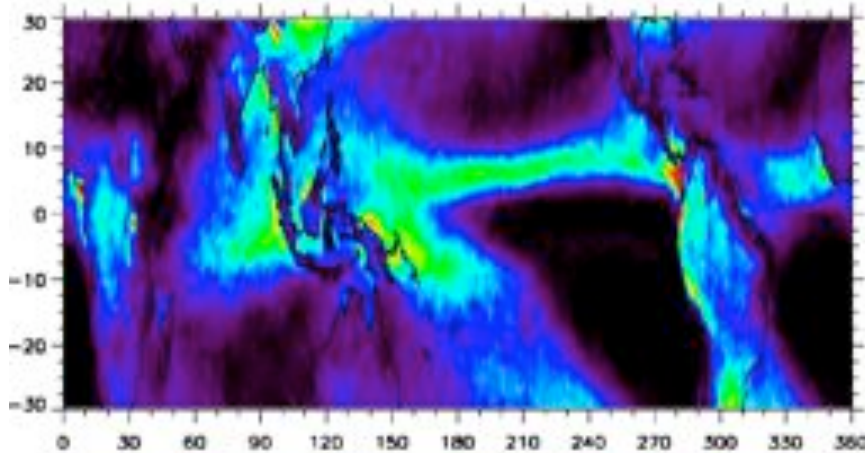
Aqua



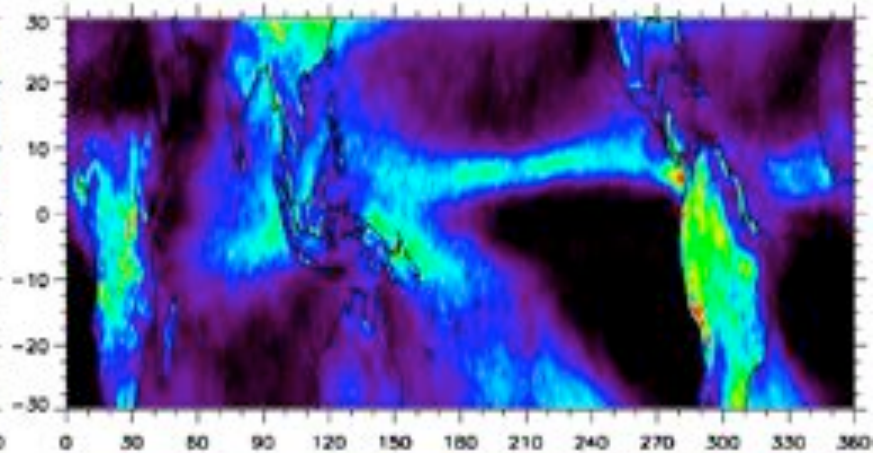
(c) Cirriform Cloud Fraction (%) - Terra



(d) Cirriform Cloud Fraction (%) - Aqua



(e) Deep Convection Fraction (%) - Terra



(f) Deep Convection Fraction (%) - Aqua

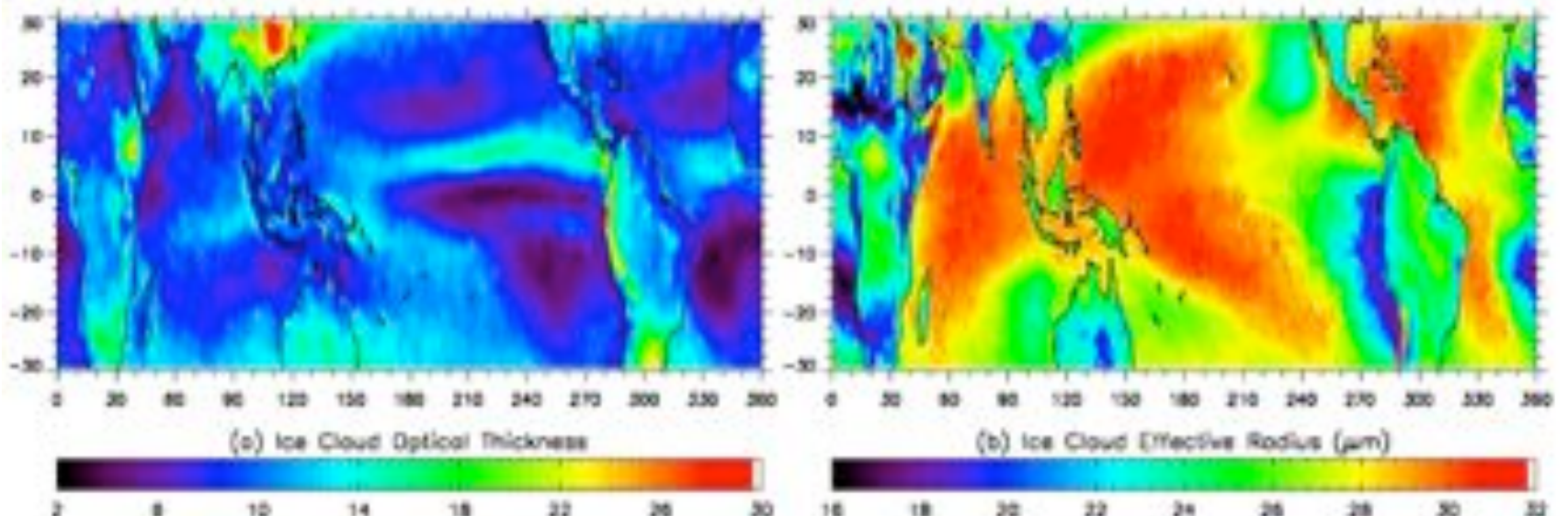


Hong, Yang and co-authors (2007)

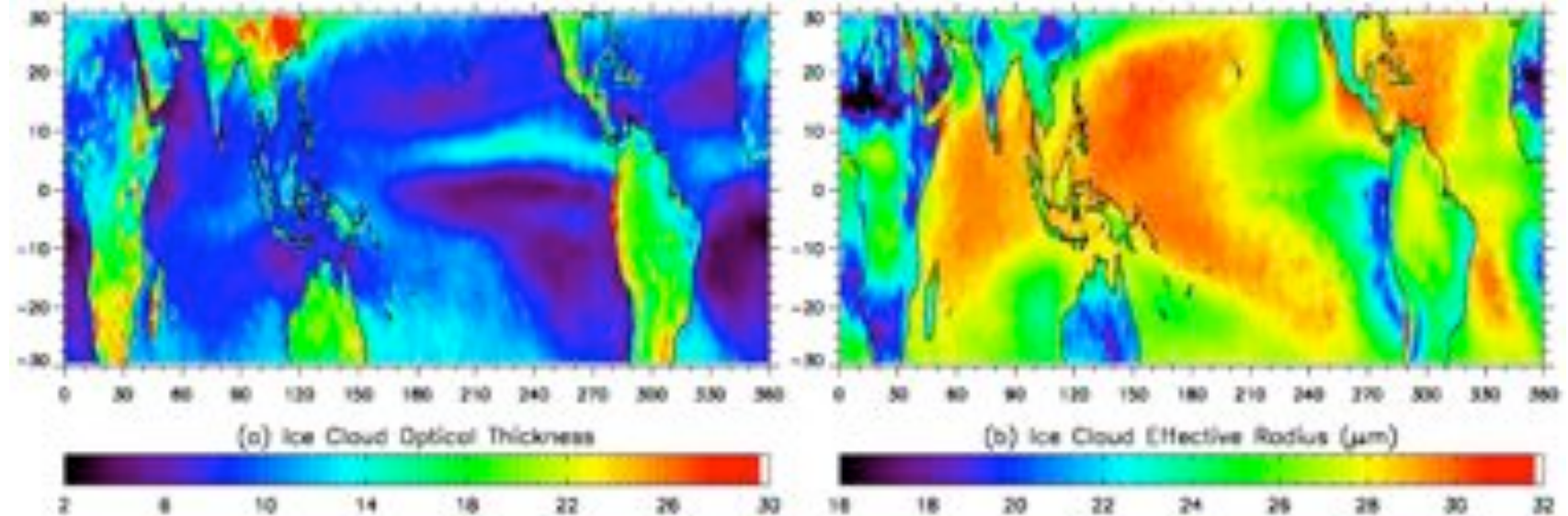


# Geographical Distribution of Cloud Properties

Terra

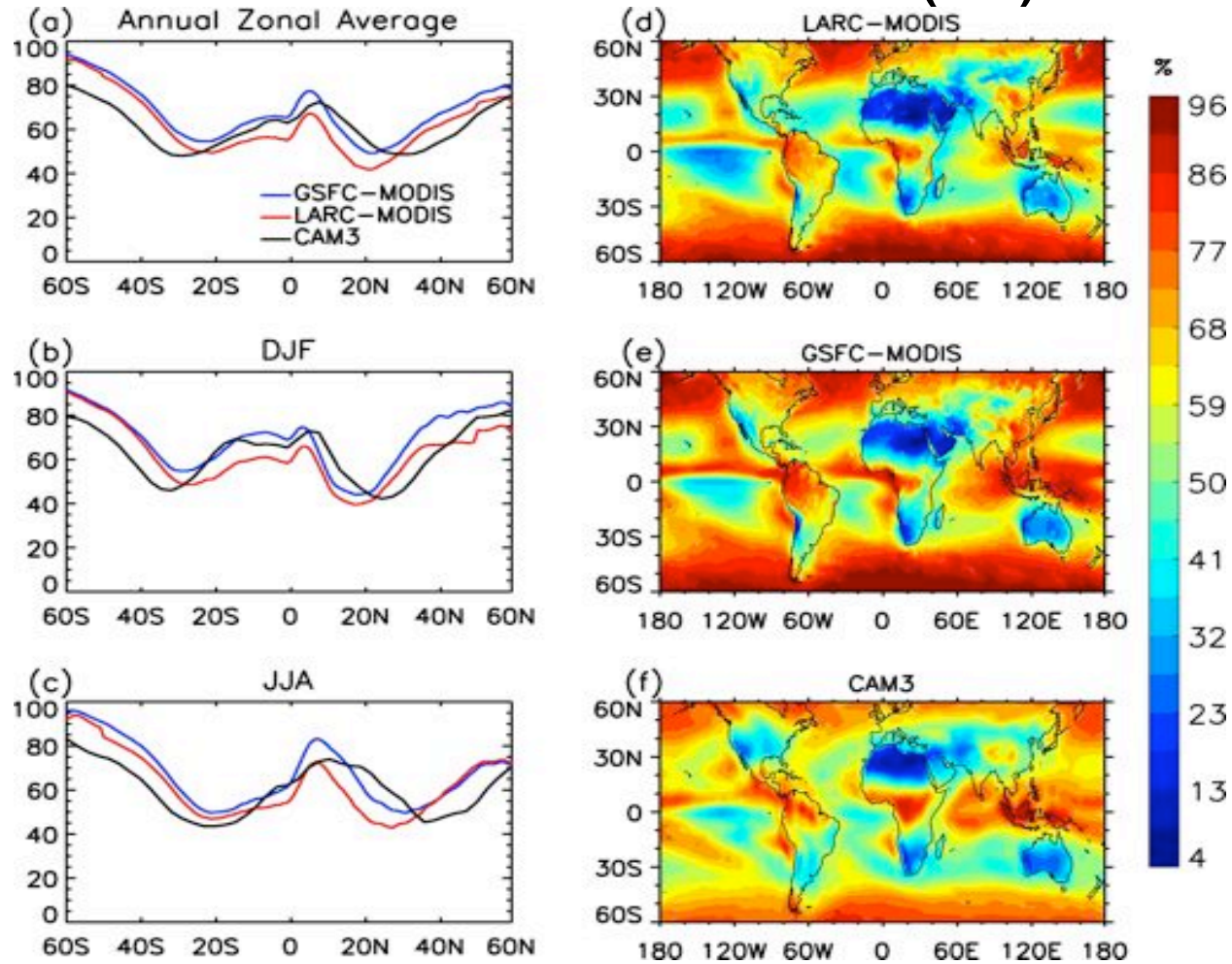


Aqua



Hong, Yang and co-authors (2007)

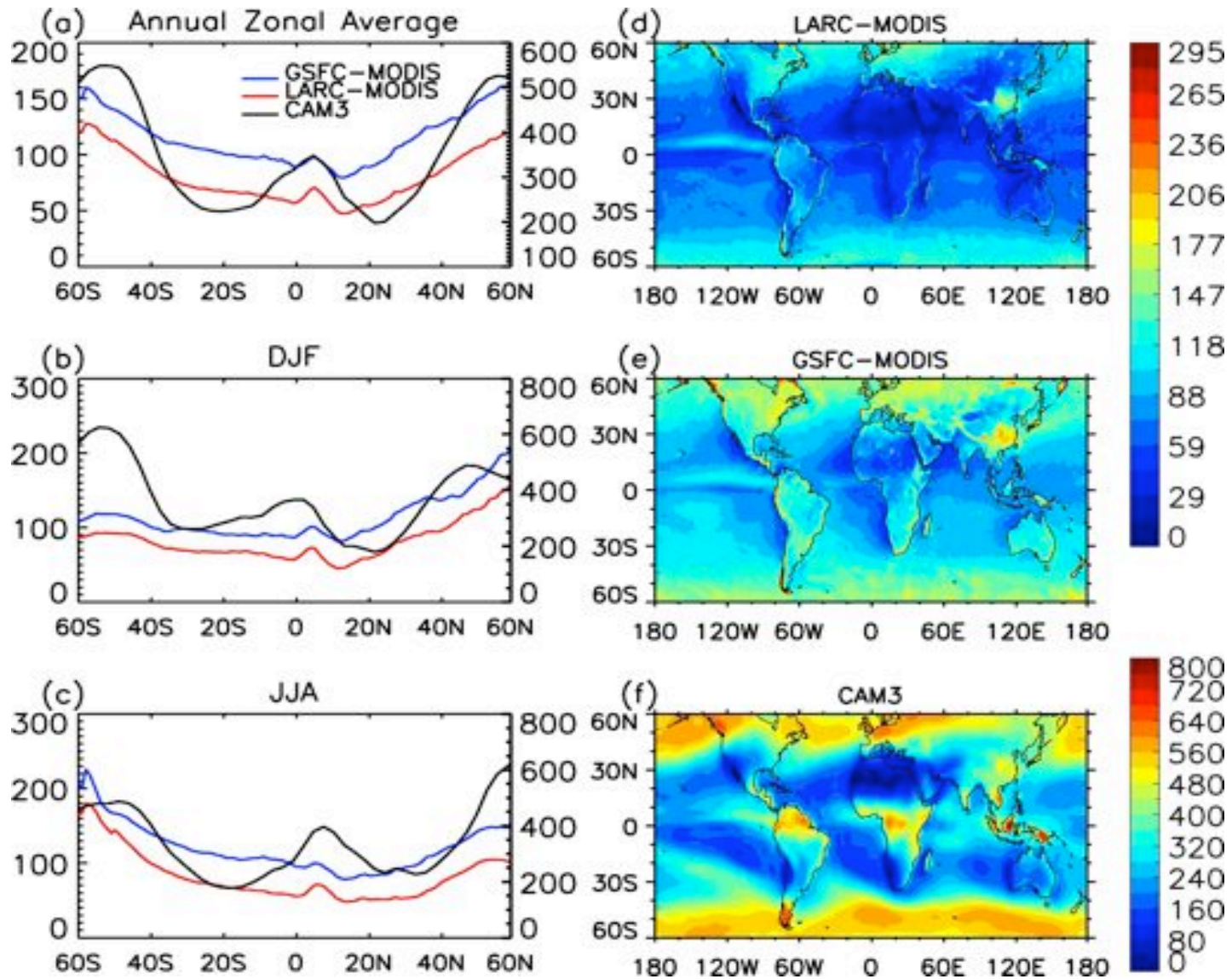
# Total Cloud Fraction (%)



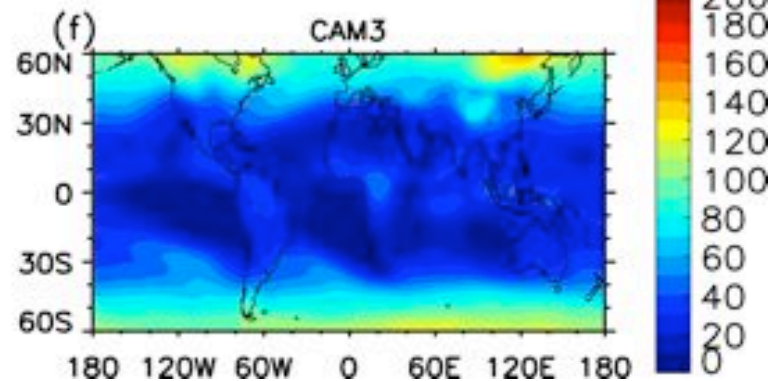
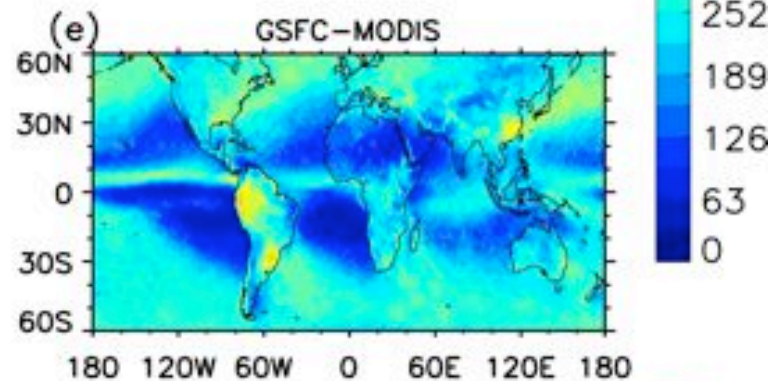
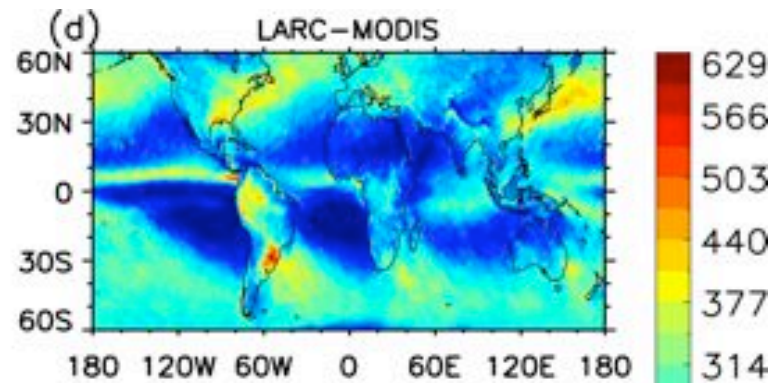
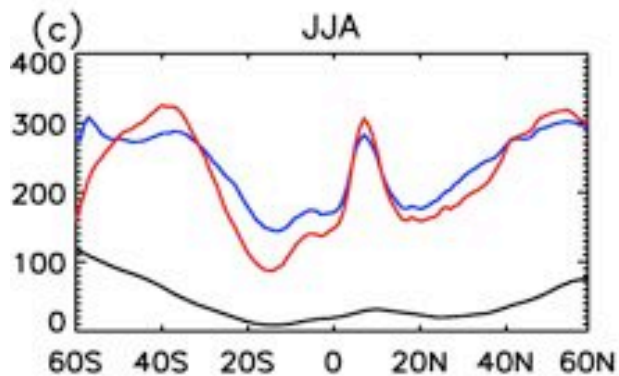
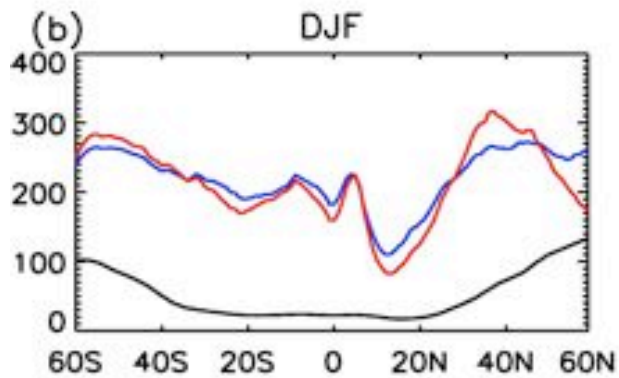
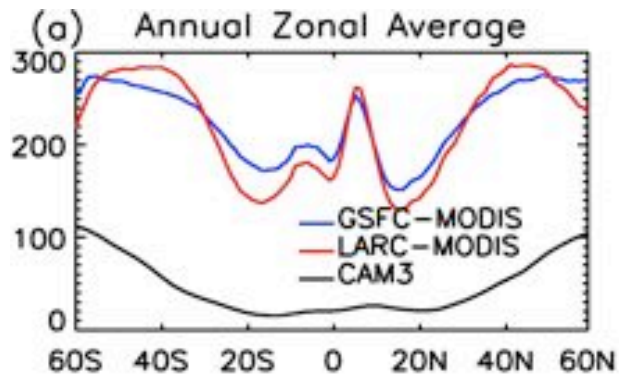
Left column: Zonal distribution of cloud fraction from GSFC-MODIS, LaRC-MODIS and CAM3. Annual average (a), DJF (b) and JJA (c) seasons are plotted separately. Right column: Annual mean cloud fraction distributions from LaRC-MODIS (d), GSFC-MODIS (e) and CAM3 (f).



# Cloud Liquid Water Path ( $gm^{-2}$ )



# Cloud Ice Water Path ( $gm^{-2}$ )



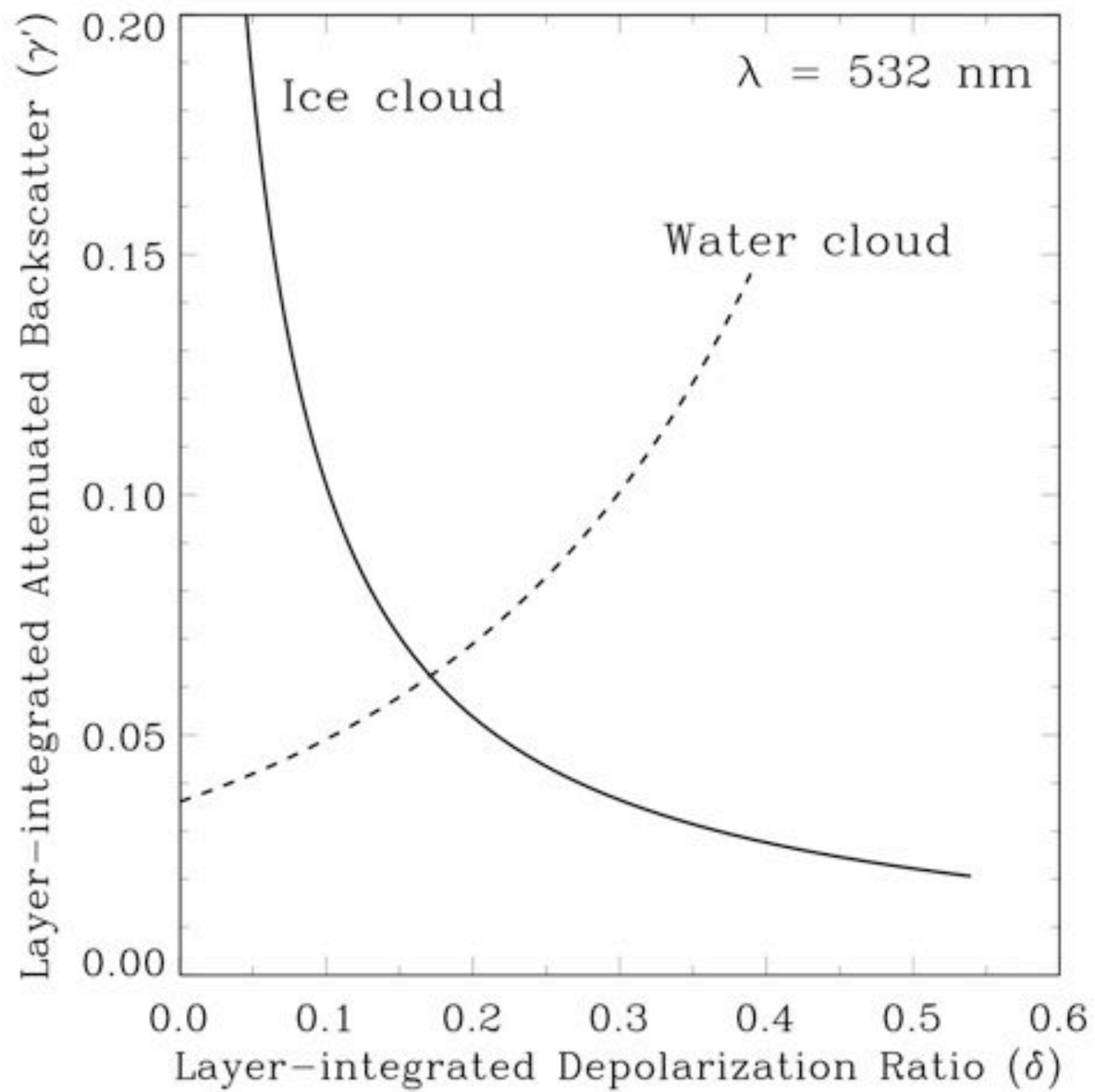
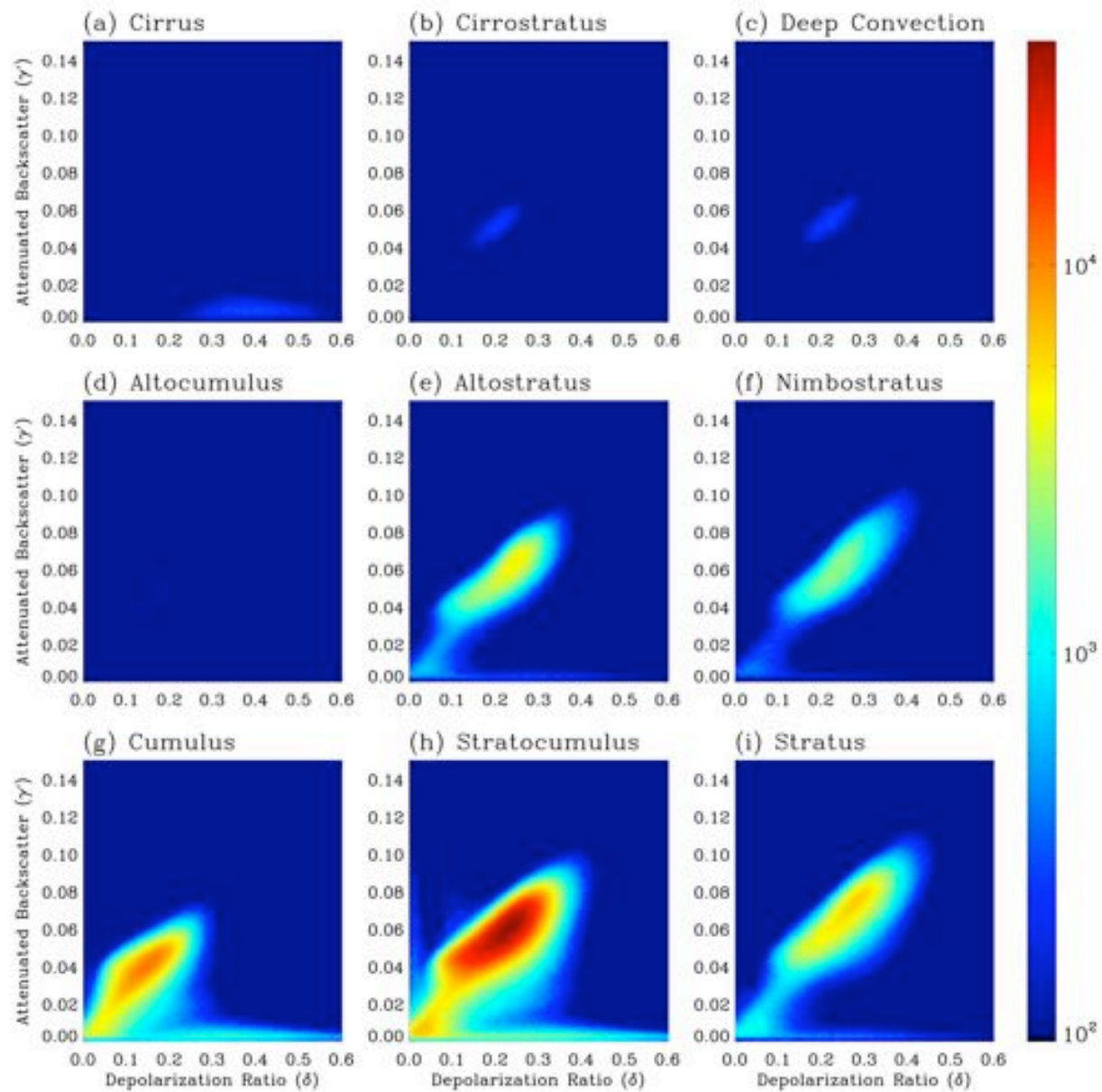


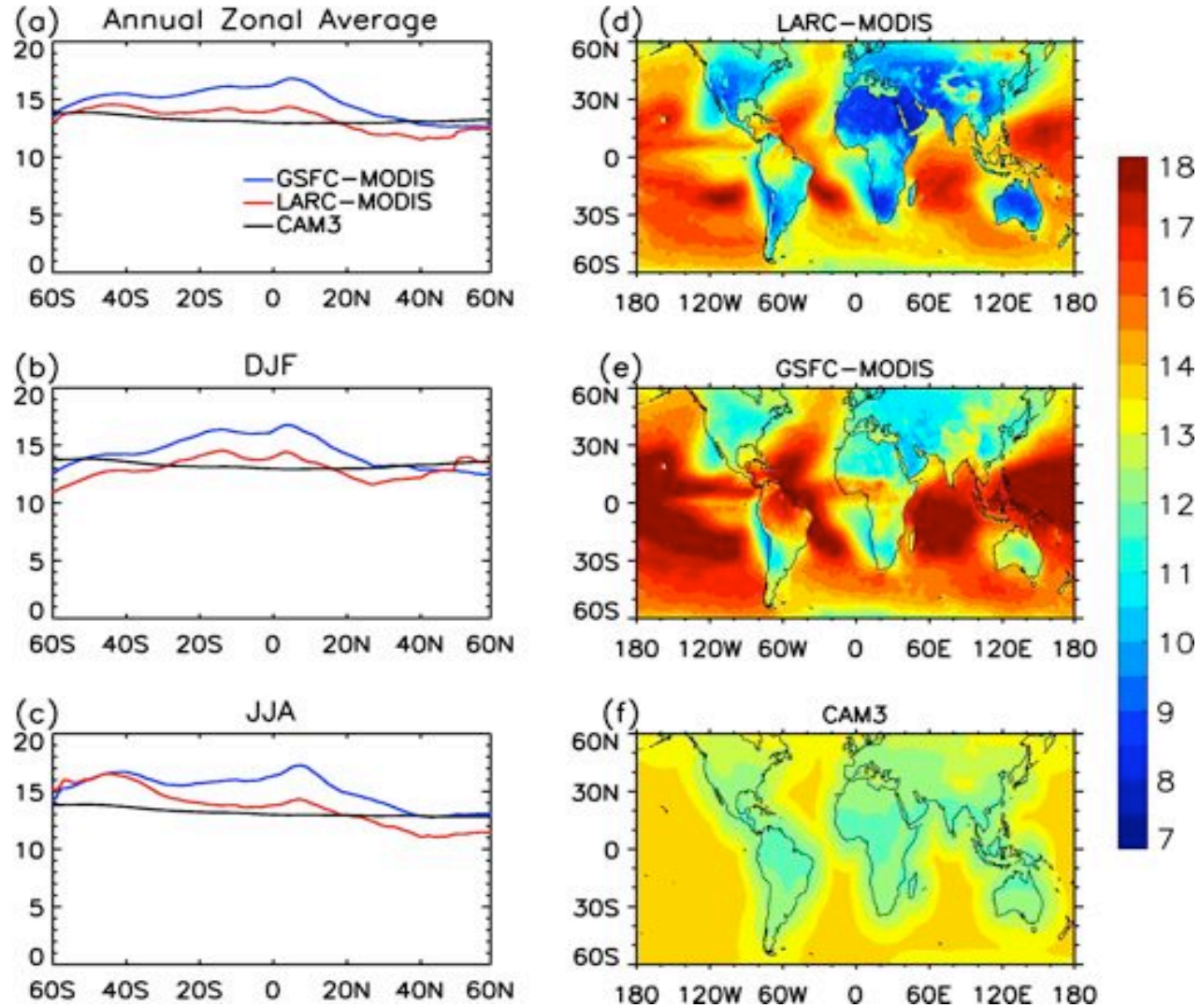
Fig. 1. Schematic curves showing the relationships (Hu et al. [8]) between the layer-integrated depolarization ratio and layer-integrated attenuated backscatter coefficient for ice clouds (solid line) and water clouds (dashed line).



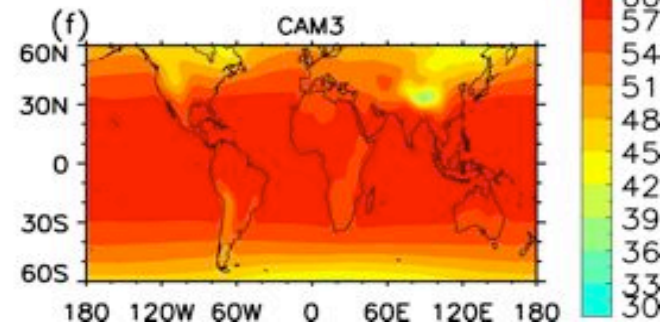
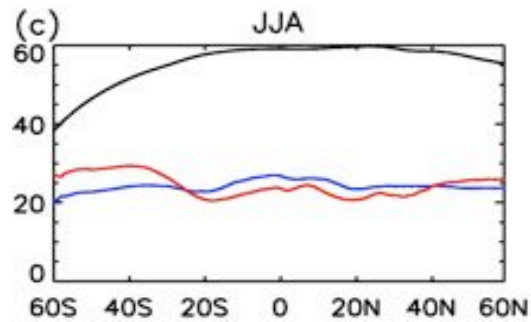
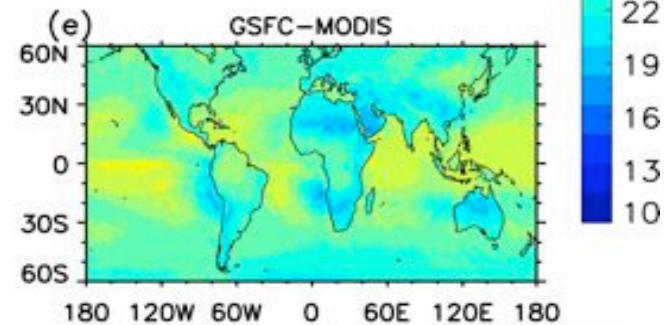
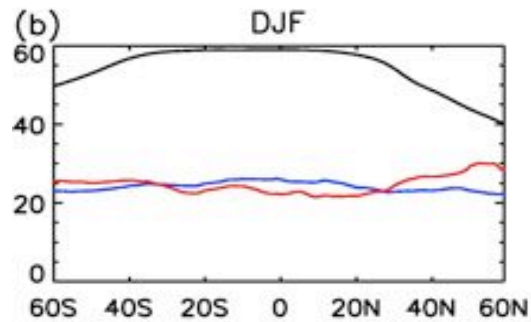
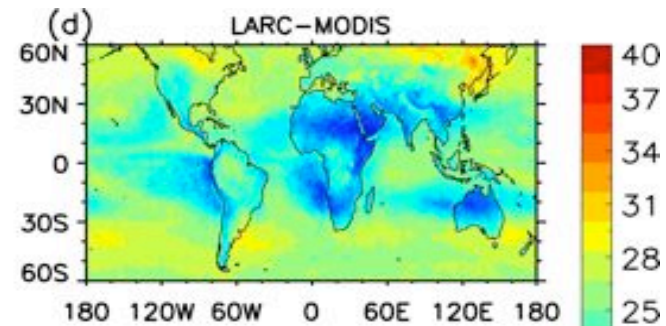
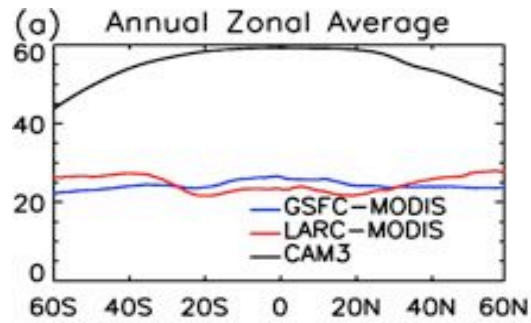


The  $\delta - \gamma'$  relationships for the clouds flagged as in water-phase by the MODIS IR cloud-phase determination algorithm .

# Liquid Particle Effective Radius ( $\mu m$ )

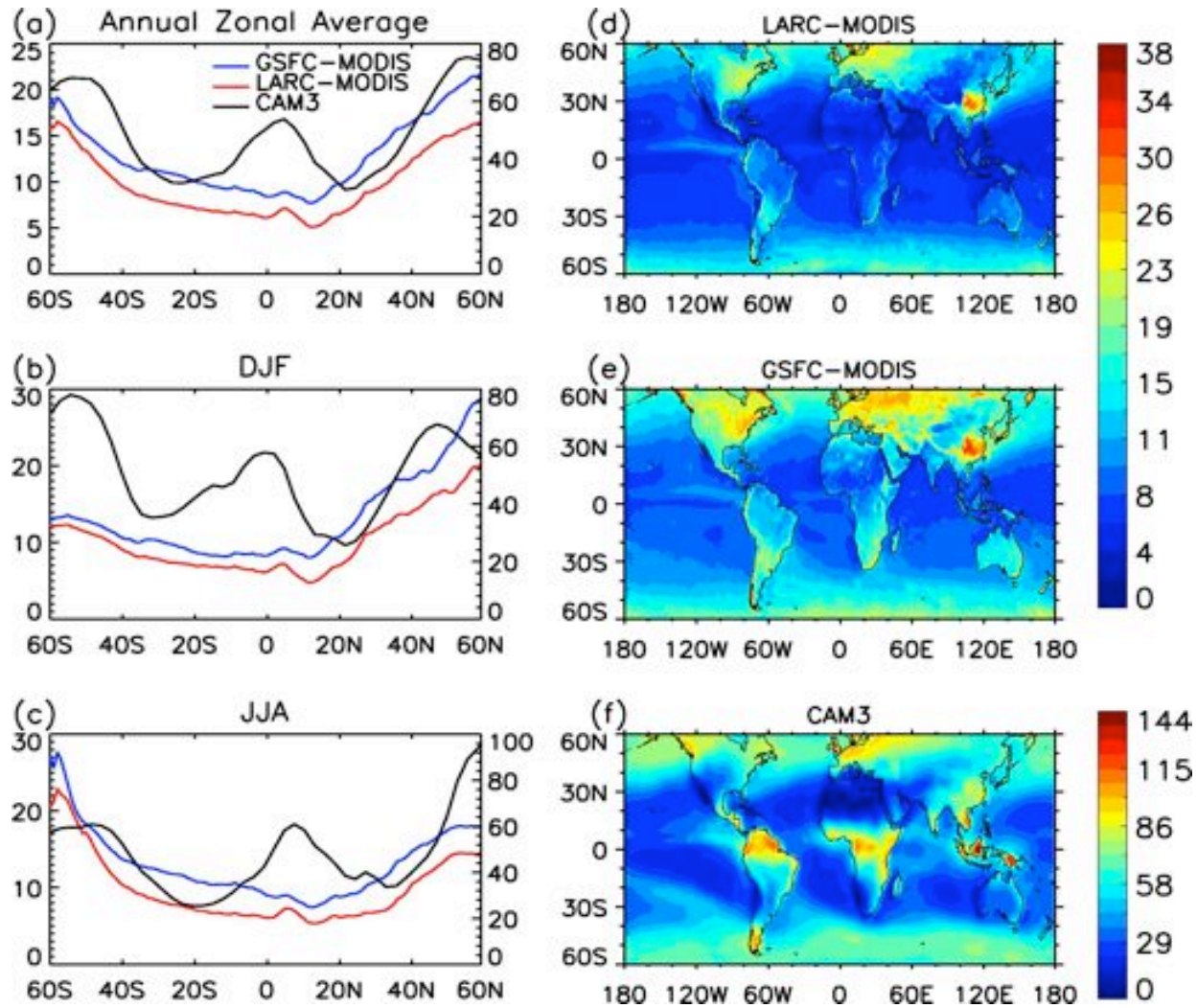


# Ice Particle Effective Radius ( $\mu m$ )

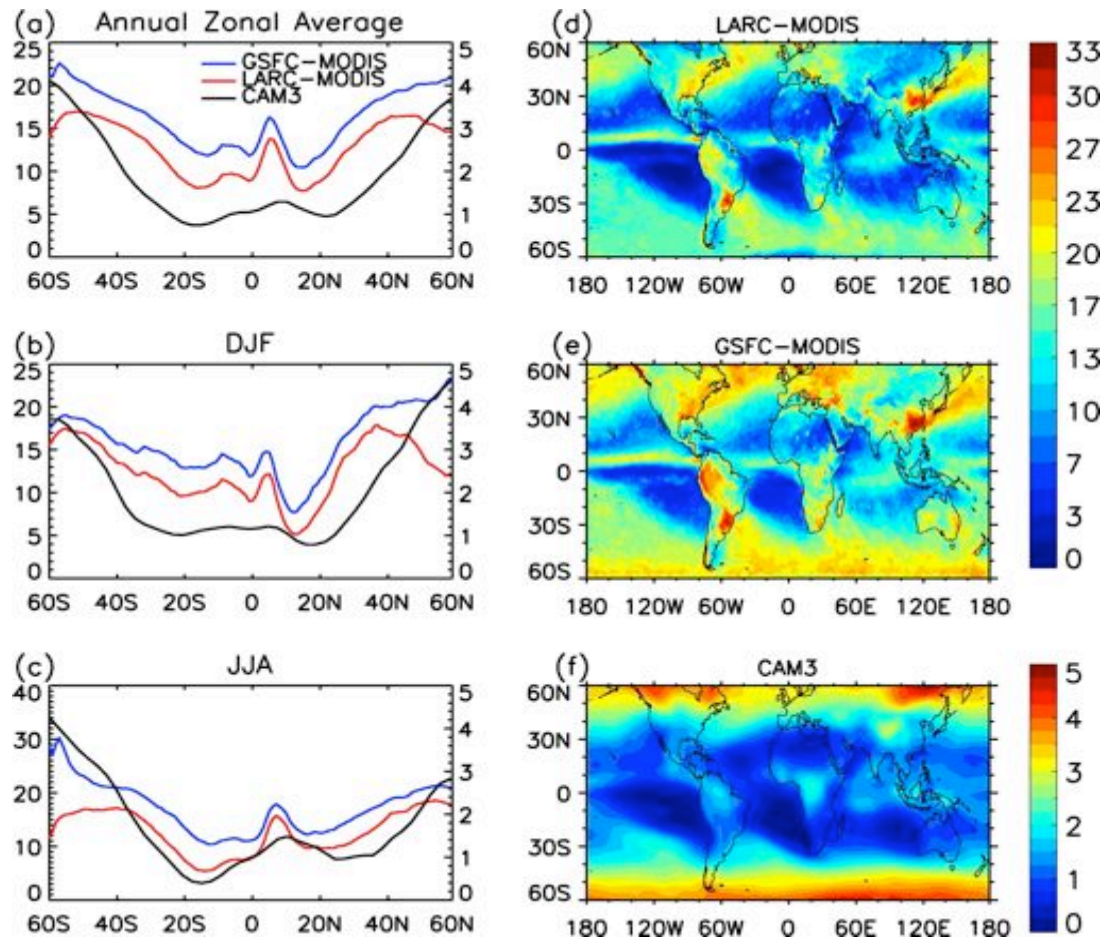




# Water Cloud Optical Depth



# Ice Cloud Optical Depth



# Equatorial Wave Spectrum

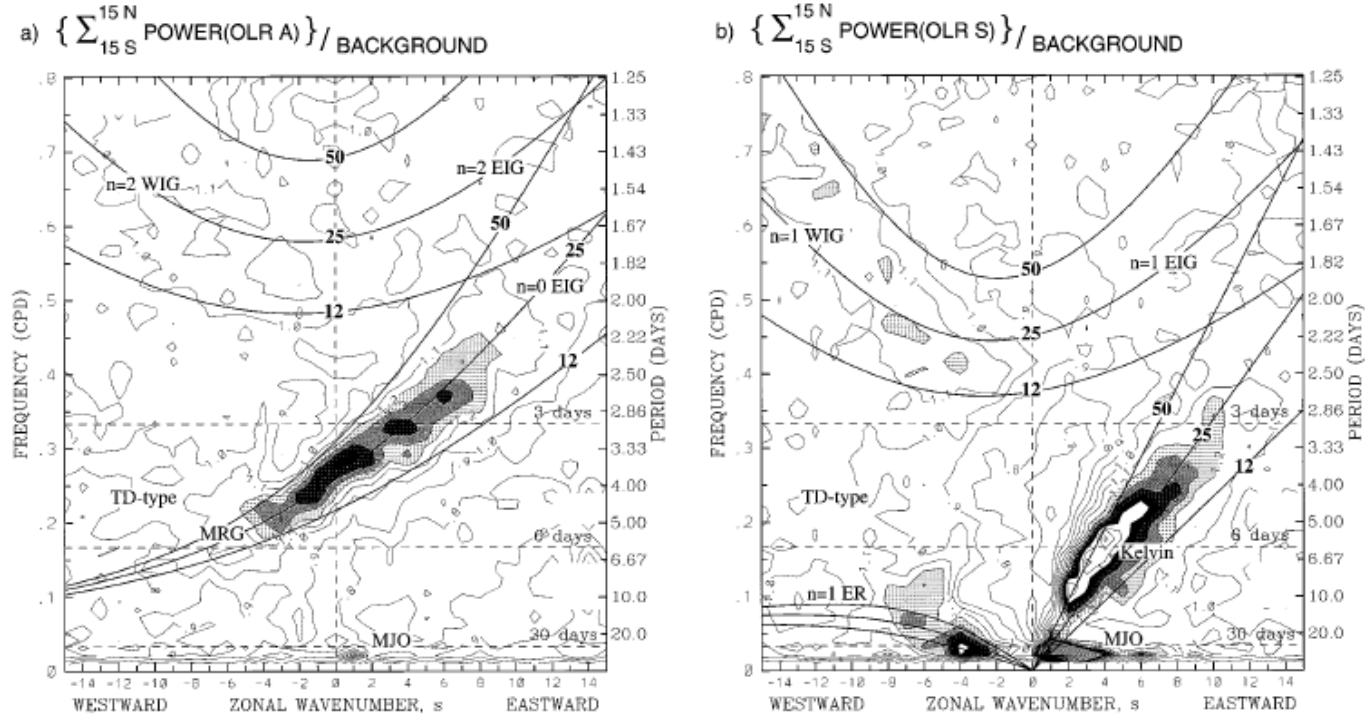
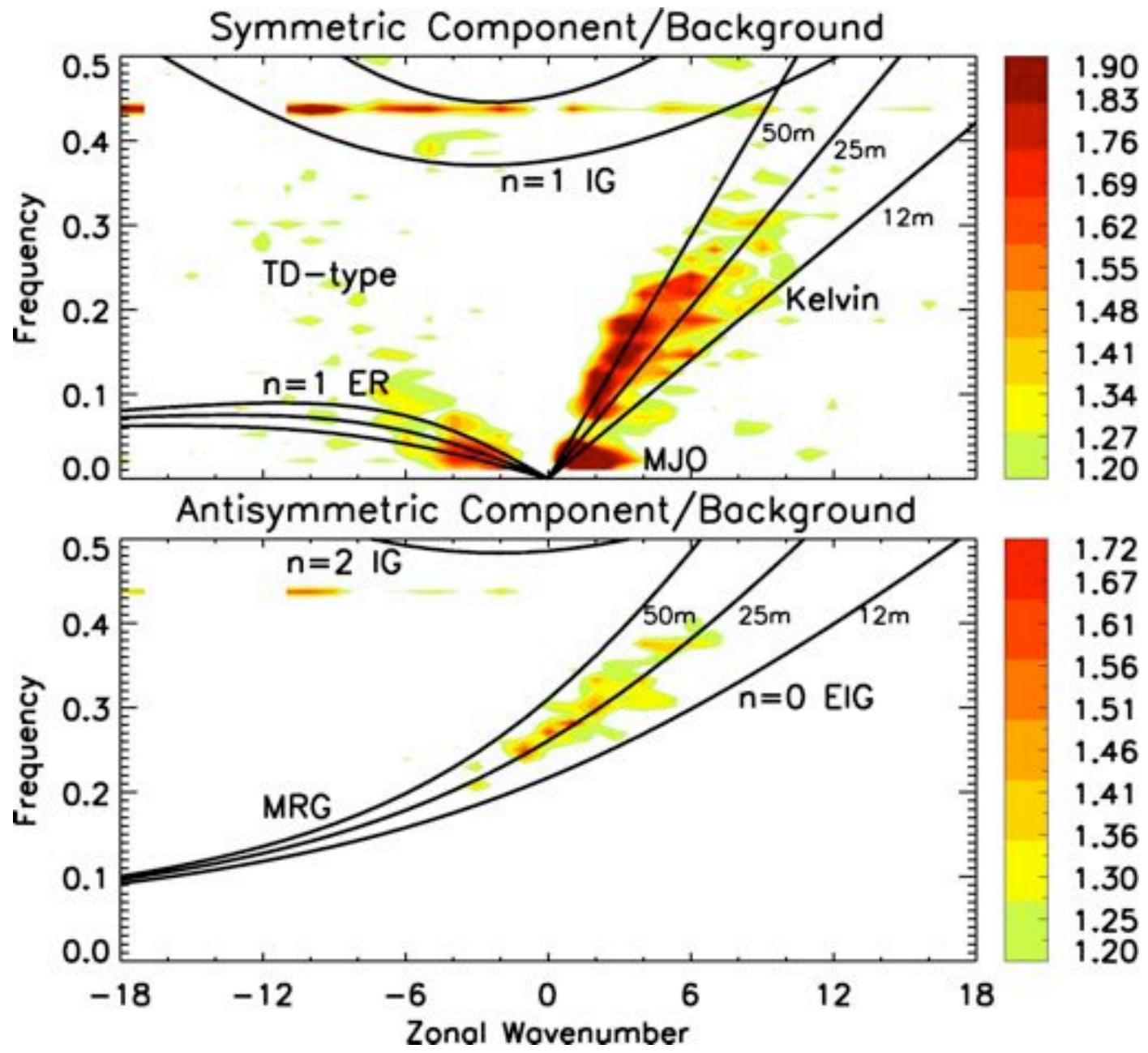


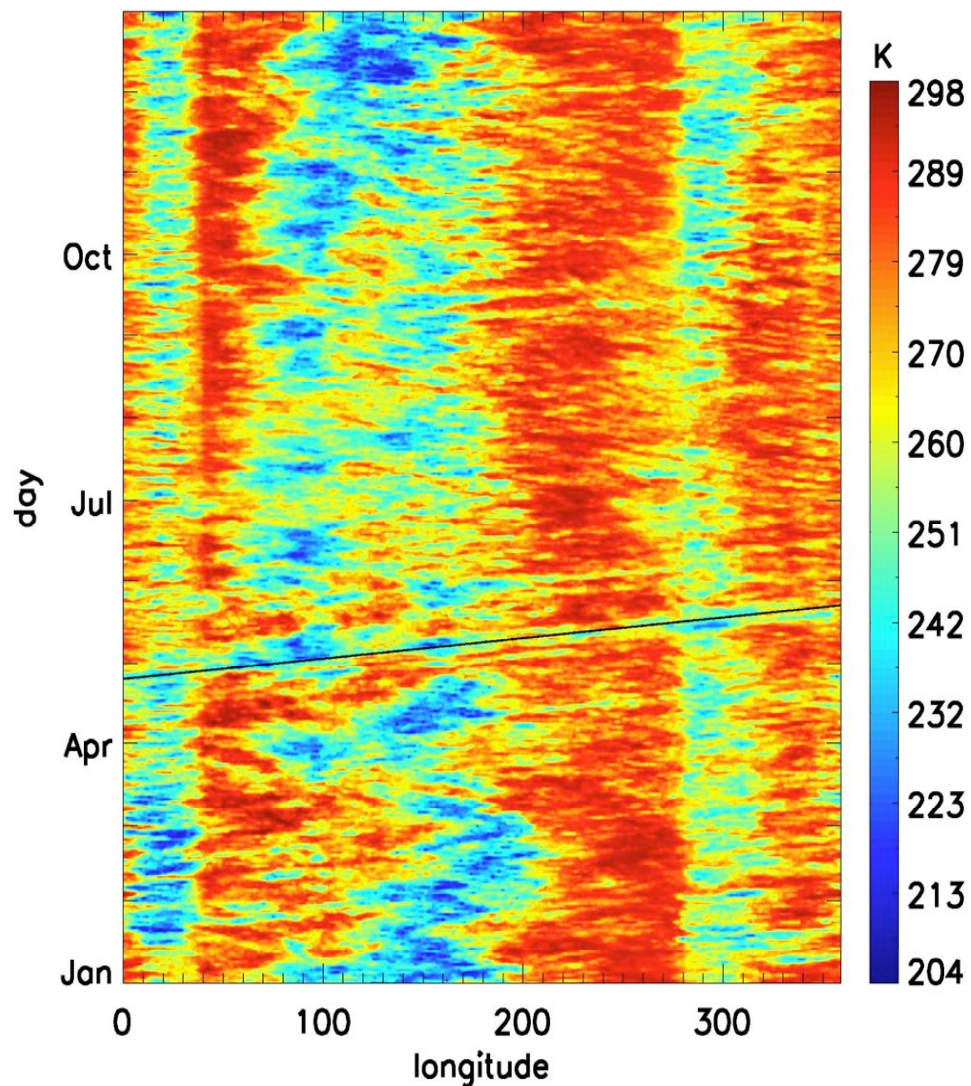
FIG. 3. (a) The antisymmetric OLR power of Fig. 1a divided by the background power of Fig. 2. Contour interval is 0.1, and shading begins at a value of 1.1 for which the spectral signatures are statistically significantly above the background at the 95% level (based on 500 dof). Superimposed are the dispersion curves of the even meridional mode-numbered equatorial waves for the three equivalent depths of  $h = 12, 25,$  and  $50$  m. (b) Same as in panel a except for the symmetric component of OLR of Fig. 1b and the corresponding odd meridional mode-numbered equatorial waves. Frequency spectral bandwidth is  $1/96$  cpd.

Wheeler and Kiladis, 1999

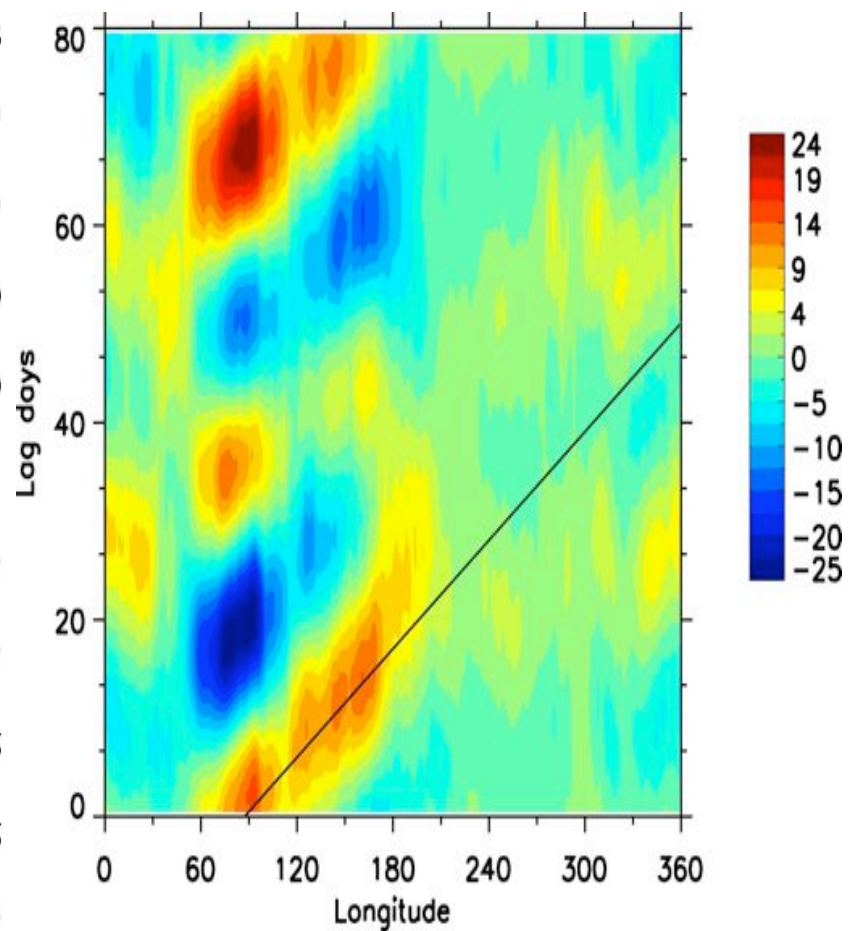




Raw 2005 Aqua CTT



Left panel: Hovmöller Diagram of raw CTT averaged between 15°N and 15°S of year 2005 from MODIS Aqua data. The thick line corresponds to phase speed of 15 ms<sup>-1</sup>

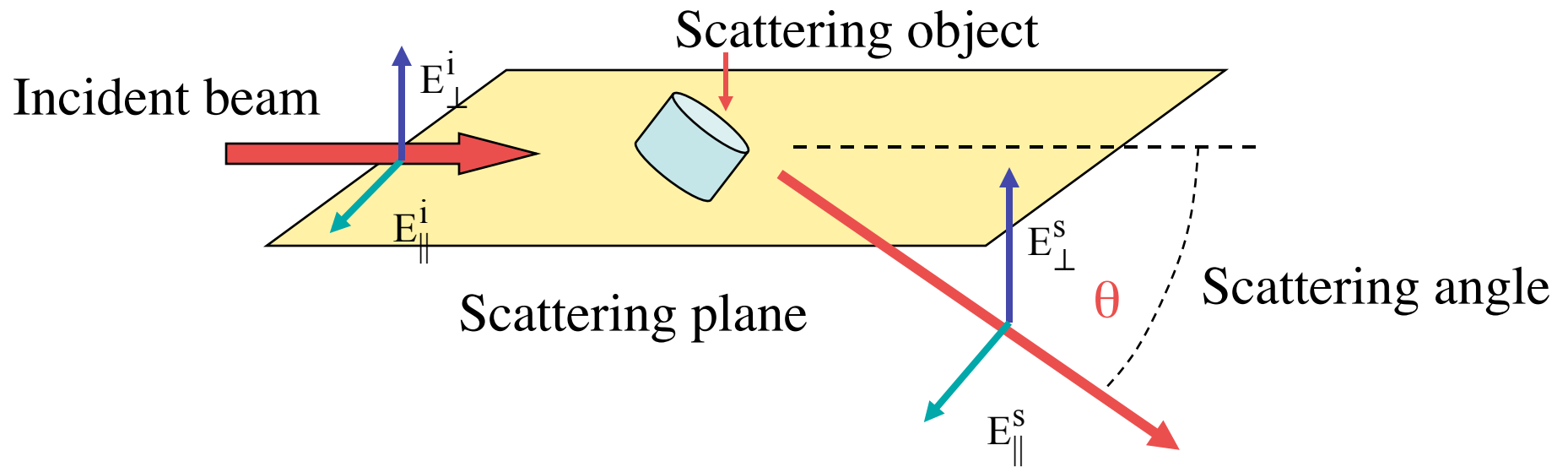


Right panel: Longitude-lagday cross section of EEOF 5 of CTT averaged between 5°N and 5°S. Units are arbitrary. The thick line indicates a phase speed of 7 ms<sup>-1</sup>

Light scattering and radiative transfer simulations are fundamental to the retrieval of cloud and aerosol properties from MODIS measurements



# Scattering Geometry



Amplitude scattering matrix

$$\begin{pmatrix} E_{\parallel}^s \\ E_{\perp}^s \end{pmatrix} = \frac{e^{ikr}}{-ikr} \begin{pmatrix} S_2 & S_3 \\ S_4 & S_1 \end{pmatrix} \begin{pmatrix} E_{\parallel}^i \\ E_{\perp}^i \end{pmatrix}$$

# Stokes vector-Phase matrix/Mueller matrix formulation

The electric field can be resolved into components.  $E_{//}$  and  $E_{\perp}$  are complex oscillatory functions.

$$\mathbf{E} = E_{//} \mathbf{l} + E_{\perp} \mathbf{r}$$

The four component Stokes vector (Stokes, 1852) can now be defined, which are all real numbers.

$$I = E_{//} E_{//}^* + E_{\perp} E_{\perp}^*$$

$$Q = E_{//} E_{//}^* - E_{\perp} E_{\perp}^*$$

$$U = E_{//} E_{\perp}^* + E_{\perp} E_{//}^*$$

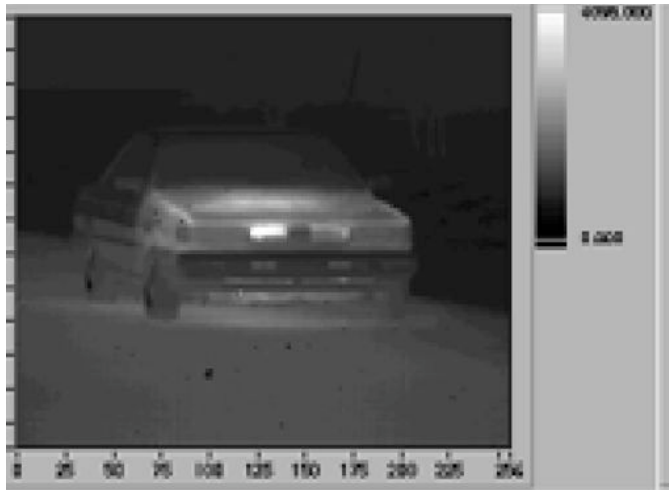
$$V = i(E_{//} E_{\perp}^* - E_{\perp} E_{//}^*)$$

**Ellipticity**= Ratio of semiminor to semimajor axis of polarization ellipse=b/a

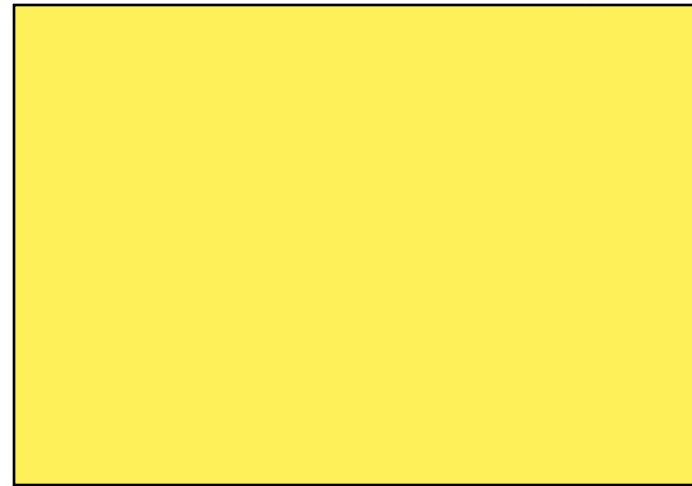
$$= \tan[(\sin^{-1}(V/I))/2]$$

# *Nissan car viewed in mid-wave infrared*

I



Ellipticity



*This data was collected using an Amber MWIR InSb imaging array 256x256. The polarization optics consisted of a rotating quarter wave plate and a linear polarizer. Images were taken at eight different positions of the quarter wave plate (22.5 degree increments) over 180 degrees. The data was reduced to the full Stokes vector using a Fourier transform data reduction technique. Courtesy of Brume Blume, Nicholls Co.*



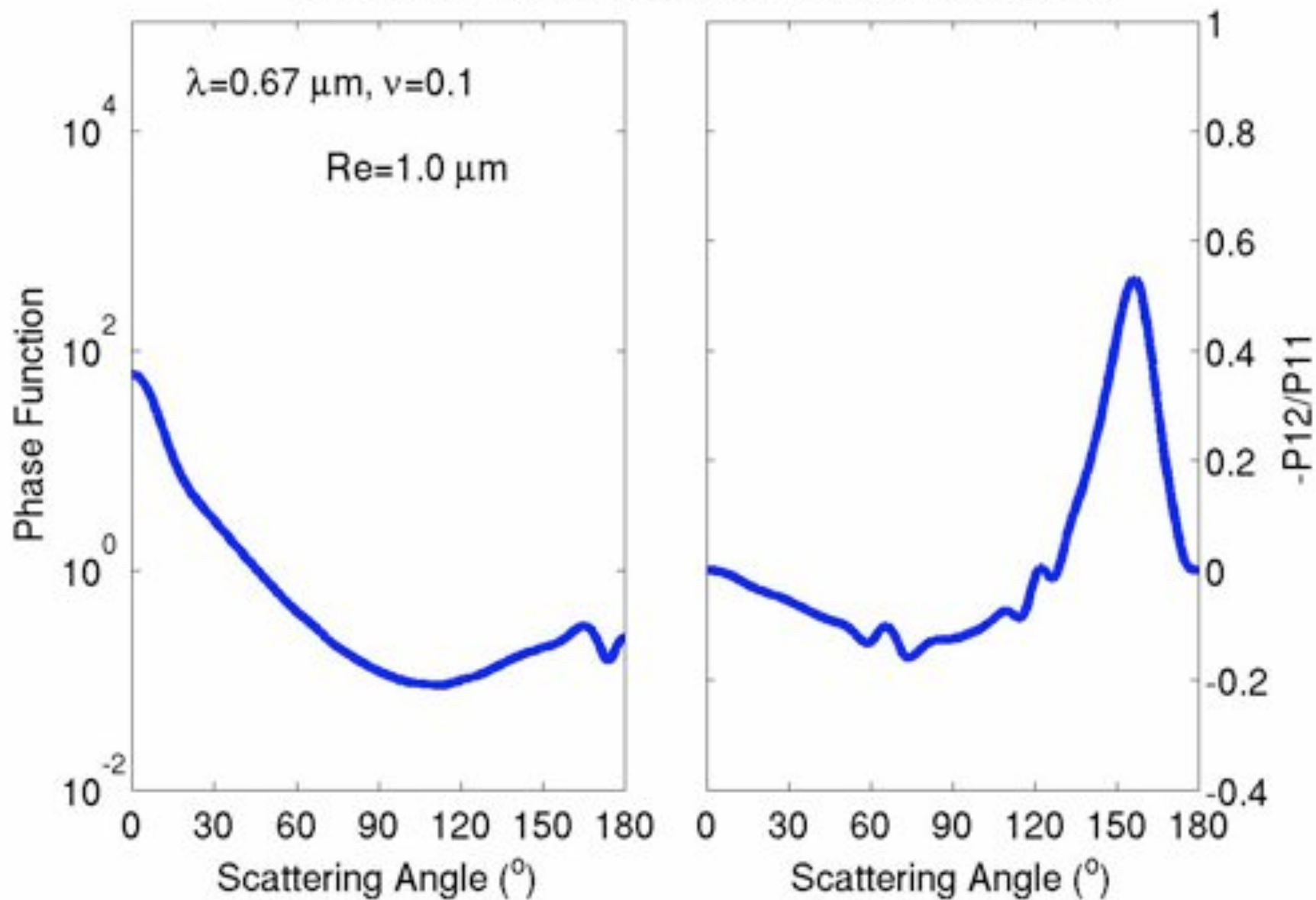
# Phase matrix

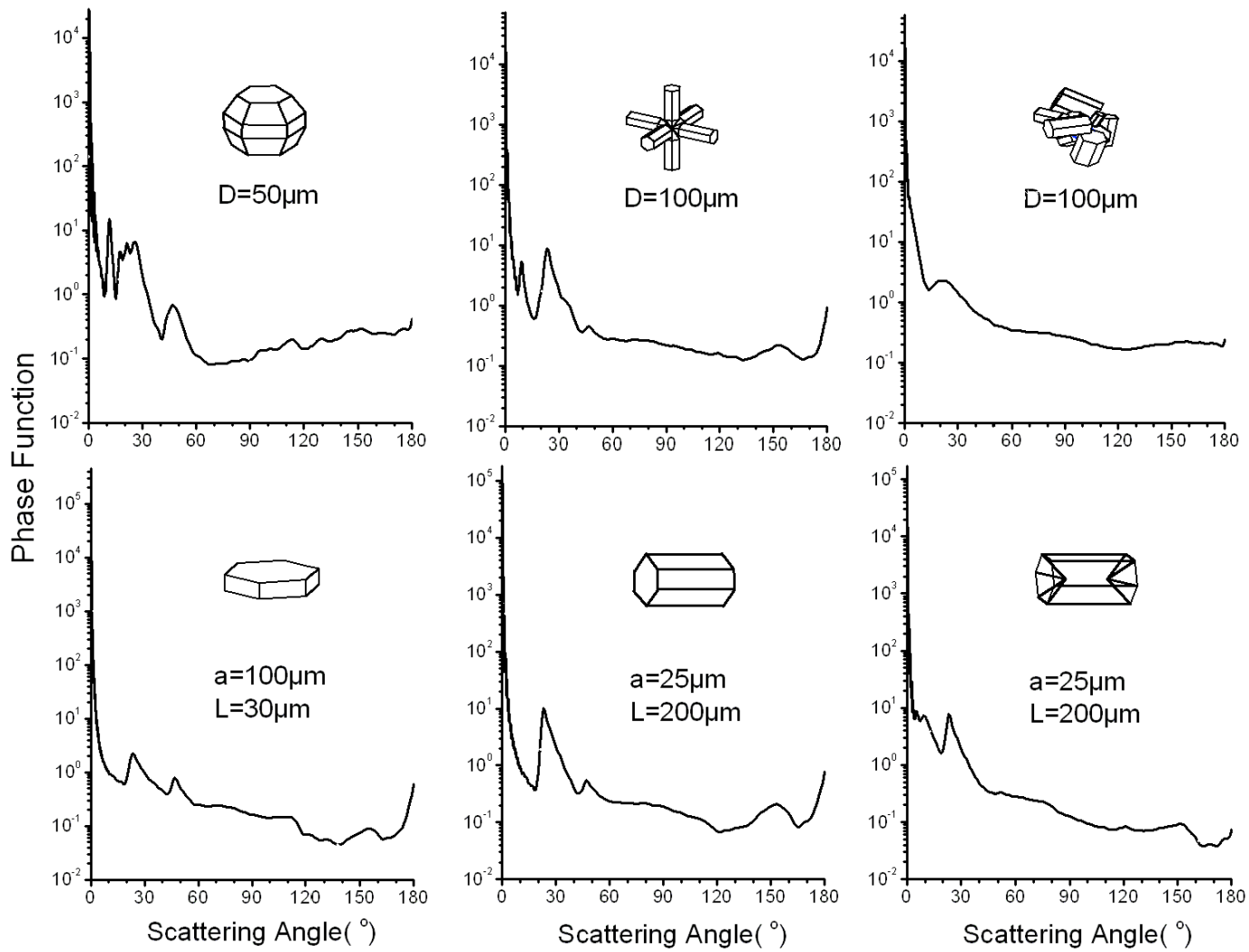
The phase matrix, **P**, relates the incident and scattered Stokes vectors. The first element of the phase matrix is called the phase function that describes the angular distribution of scattered energy.

For an ensemble of cloud particles with their mirror positions in equal number and in random orientation, the mean phase matrix has six independent elements.

$$\begin{pmatrix} I_s \\ Q_s \\ U_s \\ V_s \end{pmatrix} = \frac{\sigma_s}{4\pi k^2 r^2} \begin{pmatrix} P_{11} & P_{12} & 0 & 0 \\ P_{12} & P_{22} & 0 & 0 \\ 0 & 0 & P_{33} & P_{34} \\ 0 & 0 & -P_{34} & P_{44} \end{pmatrix} \begin{pmatrix} I_i \\ Q_i \\ U_i \\ V_i \end{pmatrix}$$

### Scattering Properties are Sensitive to Particle Size

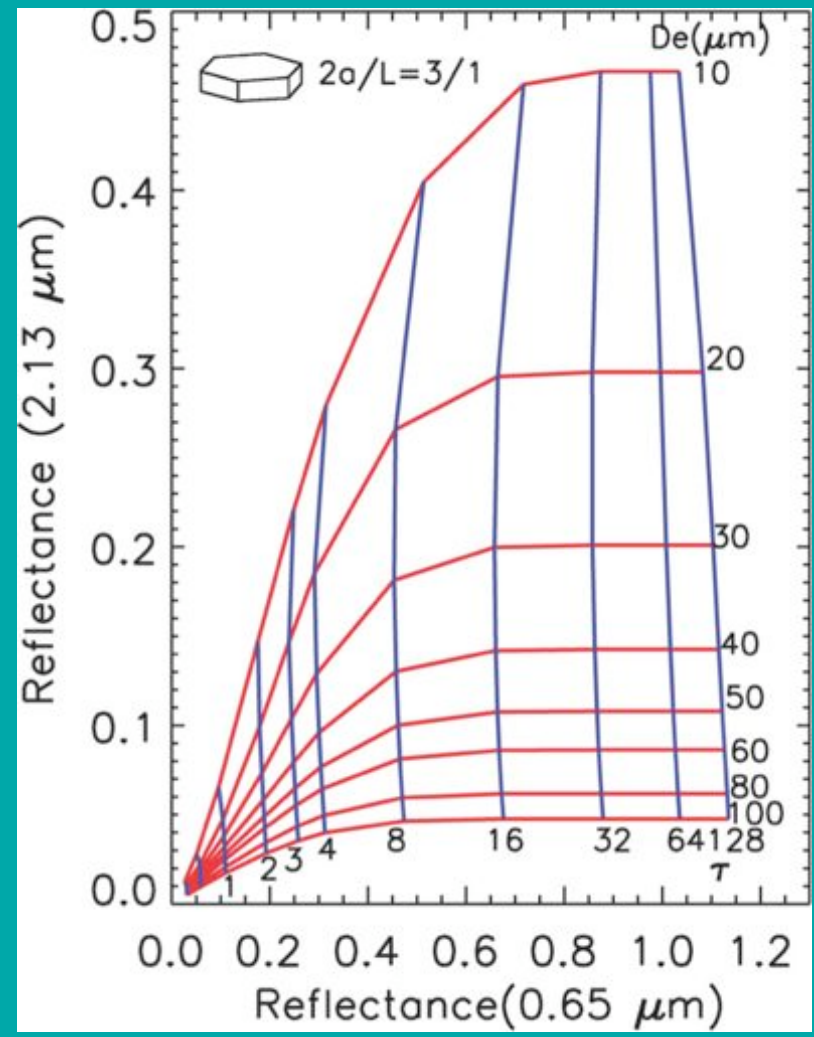
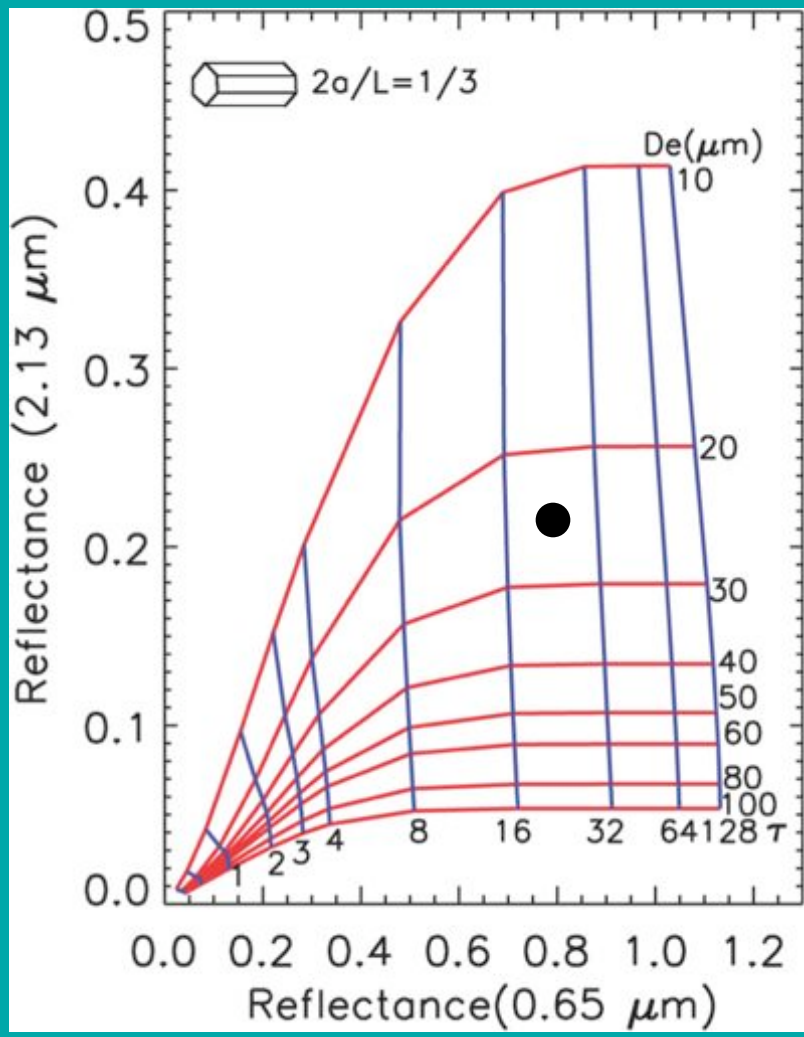




Yang, P. and K. N. Liou, 2006: Light Scattering and Absorption by Nonspherical Ice Crystals, in *Light Scattering Reviews: Single and Multiple Light Scattering*, Ed. A. Kokhanovsky, Springer-Praxis Publishing, Chichester, UK, 31-71.

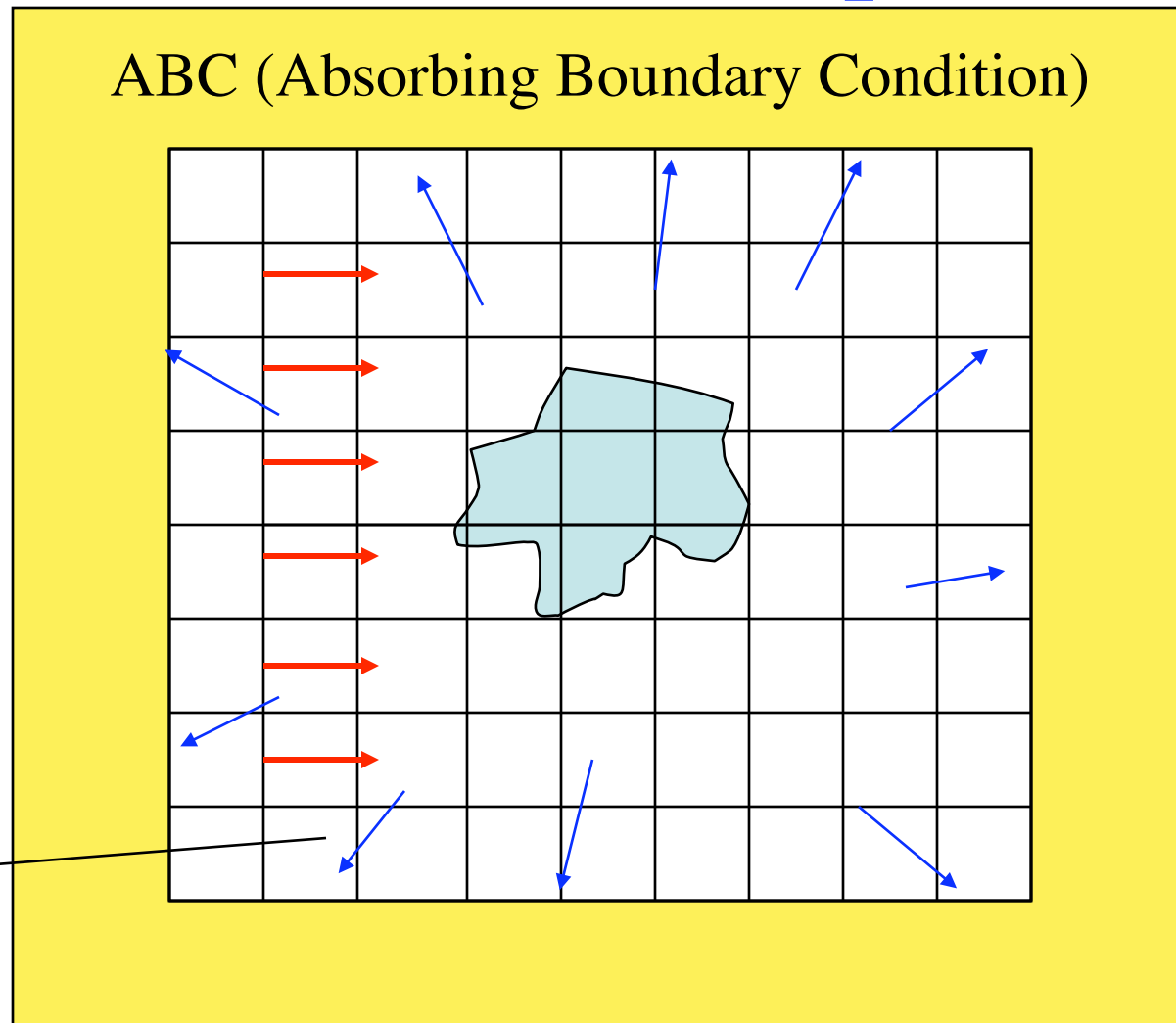


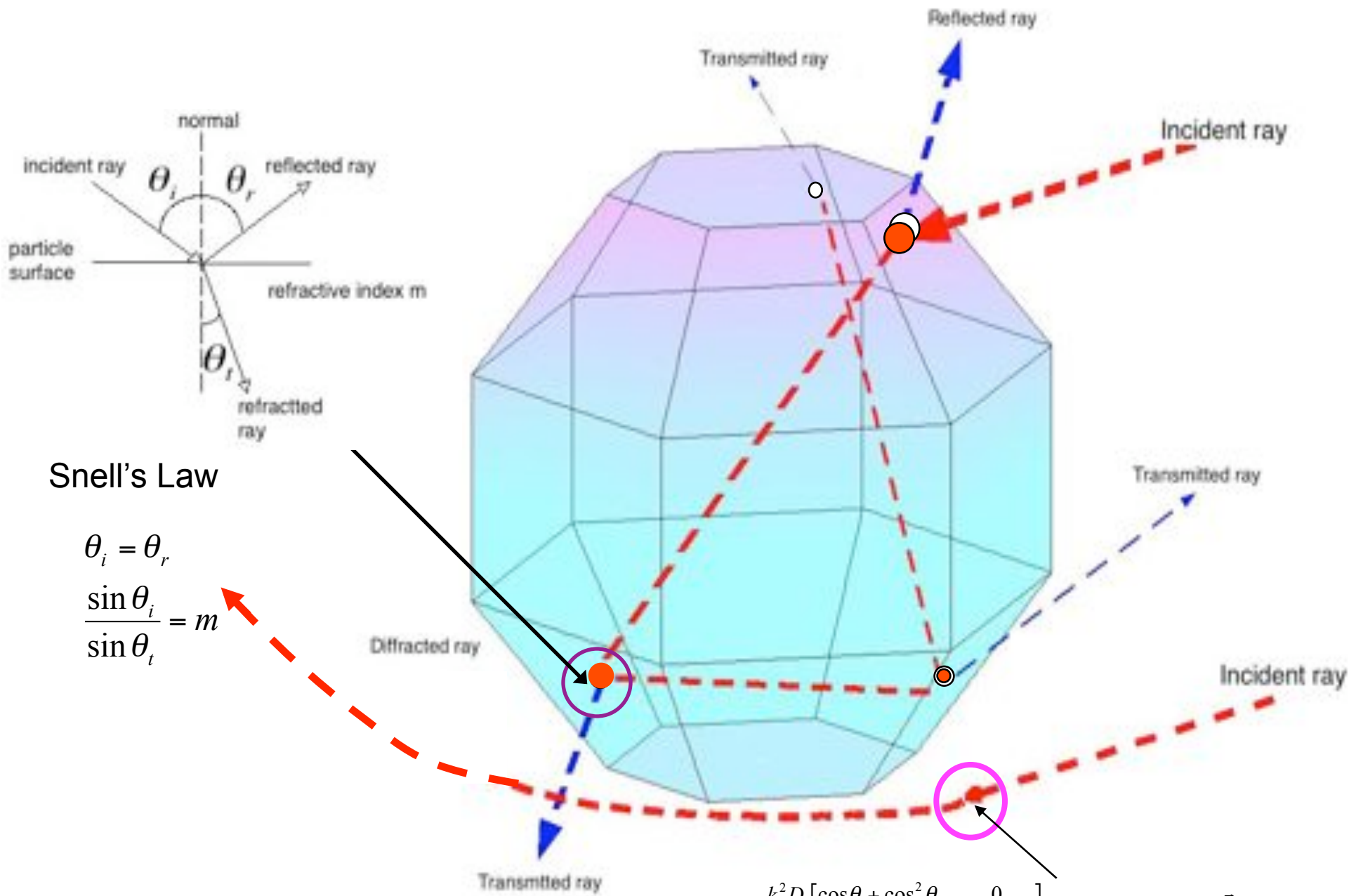
# Simultaneous retrieval of cloud optical thickness and effective particle size (the Nakajima-King algorithm)



# Finite-difference time domain (FDTD) simulation process

Plane parallel  
Incident light is  
applied on a  
surface which  
encloses the  
particle





Snell's Law

$$\theta_i = \theta_r$$

$$\frac{\sin \theta_i}{\sin \theta_t} = m$$

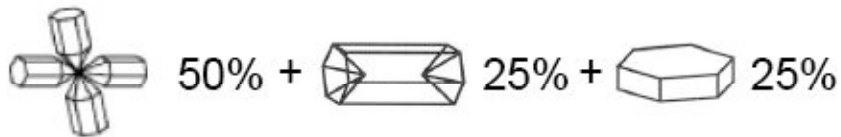
$$S_d = \frac{k^2 D}{4\pi} \begin{bmatrix} \cos\theta + \cos^2\theta & 0 \\ 0 & 1 + \cos\theta \end{bmatrix} \quad D = \iint_P \exp(ik\hat{r}_s \cdot \bar{\xi}) d^2\xi$$



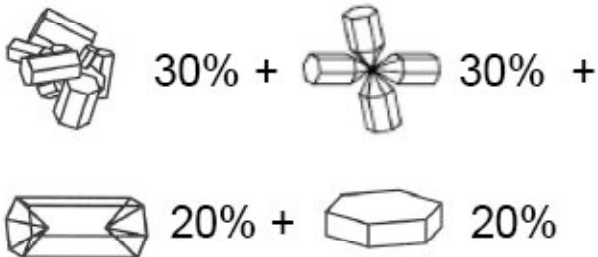
# Ice cloud models: MODIS Collection 004 vs 005

## Mixing schemes for ice cloud particles MODIS Collection 4 *(King et al., 2004)*

Particle's maximum dimension  $D < 70 \mu\text{m}$



$70 \mu\text{m} < D$

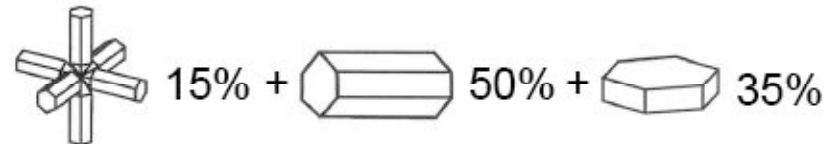


## Mixing schemes for ice cloud particles MODIS Collection 5 *(Baum et al. 2005; King et al., 2007)*

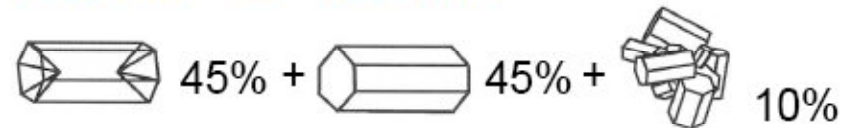
Particle's maximum dimension  $D < 60 \mu\text{m}$



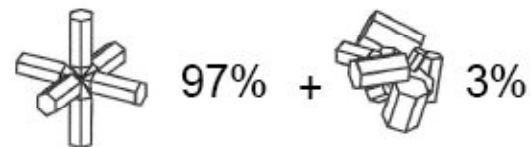
$60 \mu\text{m} < D < 1000 \mu\text{m}$



$1000 \mu\text{m} < D < 2500 \mu\text{m}$

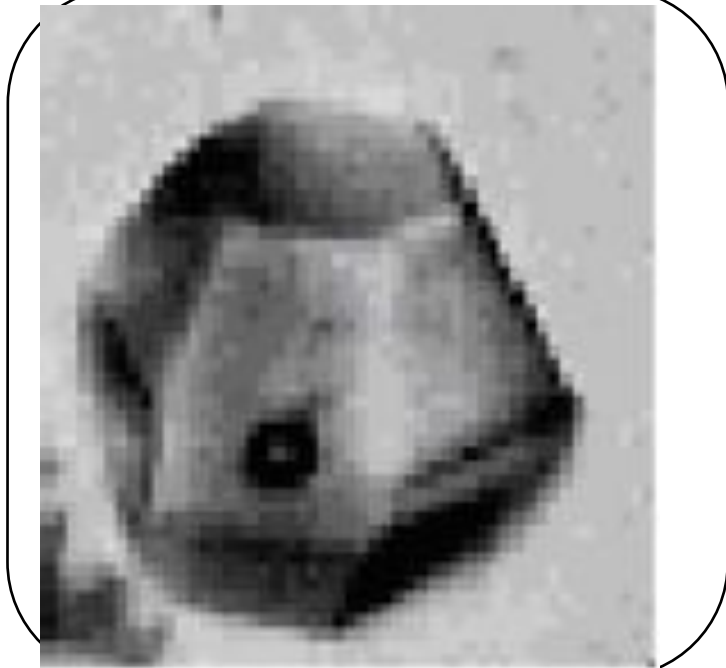
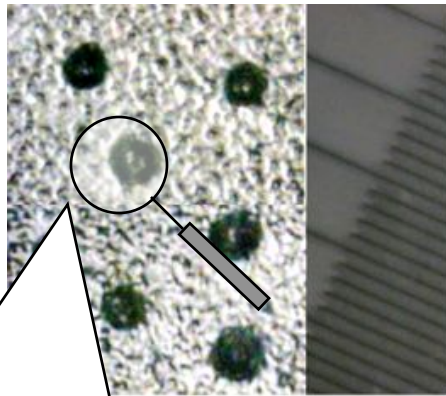


$2500 \mu\text{m} < D$

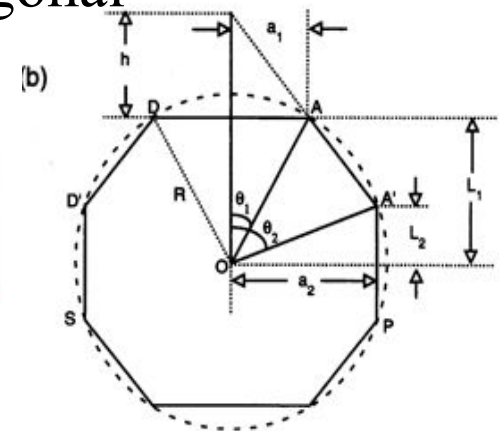
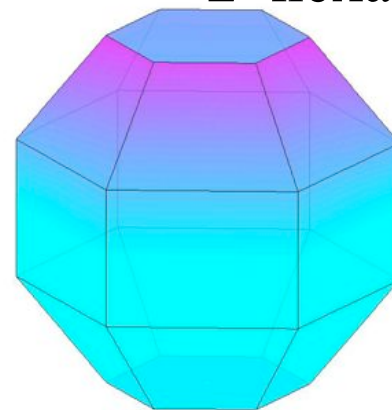


# New habit: Droxtal

Courtesy of Andy Heymsfield



- Predominant in the uppermost portions of cirrus clouds
- 20-Faced Polyhedron
  - 12 isosceles trapezoid
  - 6 rectangular
  - 2 hexagonal



Ohtake (1970)

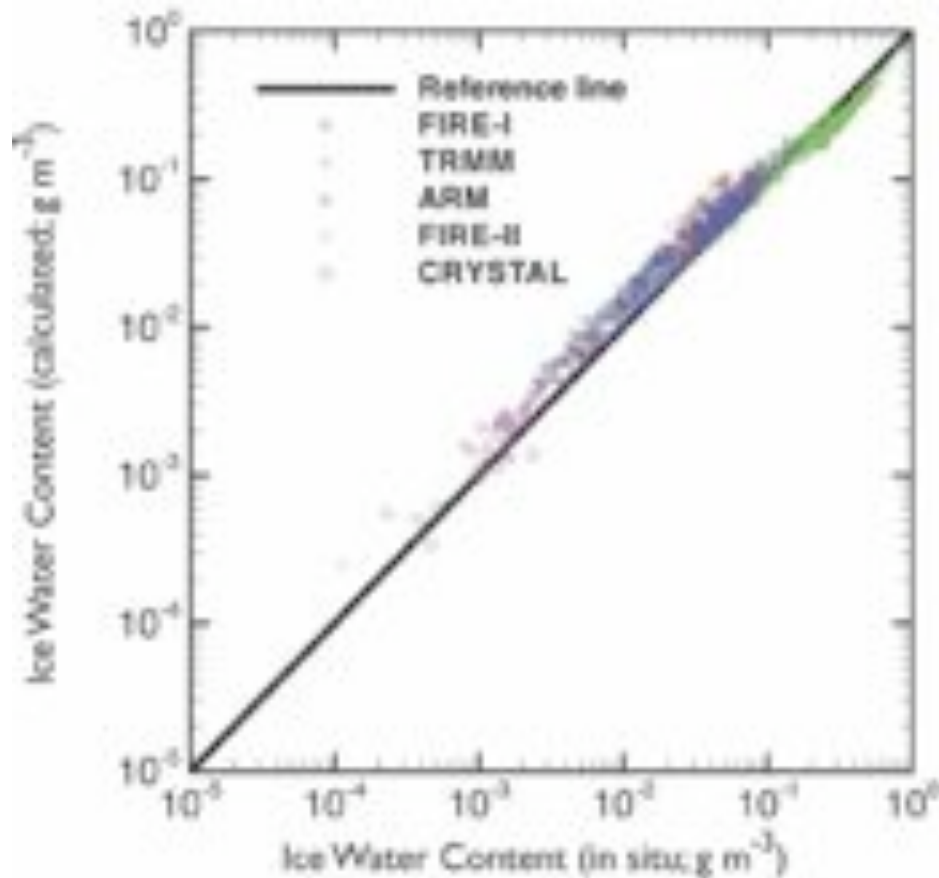
## Field Campaign Information

| Field Campaign      | Location                    | Instruments     | Number of PSDs |
|---------------------|-----------------------------|-----------------|----------------|
| FIRE-1 (1986)       | Madison, WI                 | 2D-C, 2D-P      | 246            |
| FIRE-II (1991)      | Coffeyville, KS             | Replicator      | 22             |
| ARM-IOP (2000)      | Lamont, OK                  | 2D-C, 2D-P, CPI | 390            |
| TRMM KWAJEX (1999)  | Kwajalein, Marshall Islands | 2D-C, HVPS, CPI | 418            |
| CRYSTAL-FACE (2002) | Off coast of Nicaragua      | 2D-C, VIPS      | 41             |

Probe size ranges are: 2D-C, 40-1000  $\mu\text{m}$ ; 2D-P, 200-6400  $\mu\text{m}$ ; HVPS (High Volume Precipitation Spectrometer), 200–6100  $\mu\text{m}$ ; CPI (Cloud Particle Imager), 20-2000  $\mu\text{m}$ ; Replicator, 10-800  $\mu\text{m}$ ; VIPS (Video Ice Particle Sampler): 20-200  $\mu\text{m}$ .



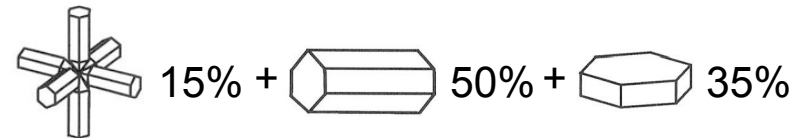
# Ice Cloud Microphysical Model (Baum et al., 2005a)



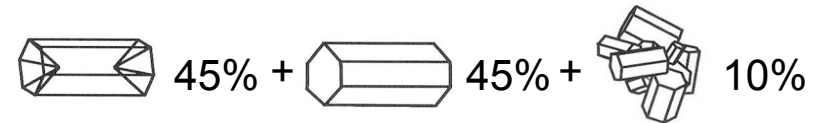
- Particle's maximum dimension  $D < 60 \mu\text{m}$



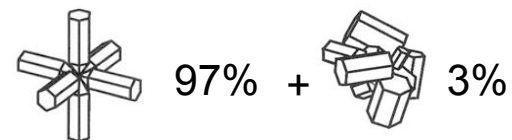
- $60 \mu\text{m} < D < 1000 \mu\text{m}$



- $1000 \mu\text{m} < D < 2500 \mu\text{m}$



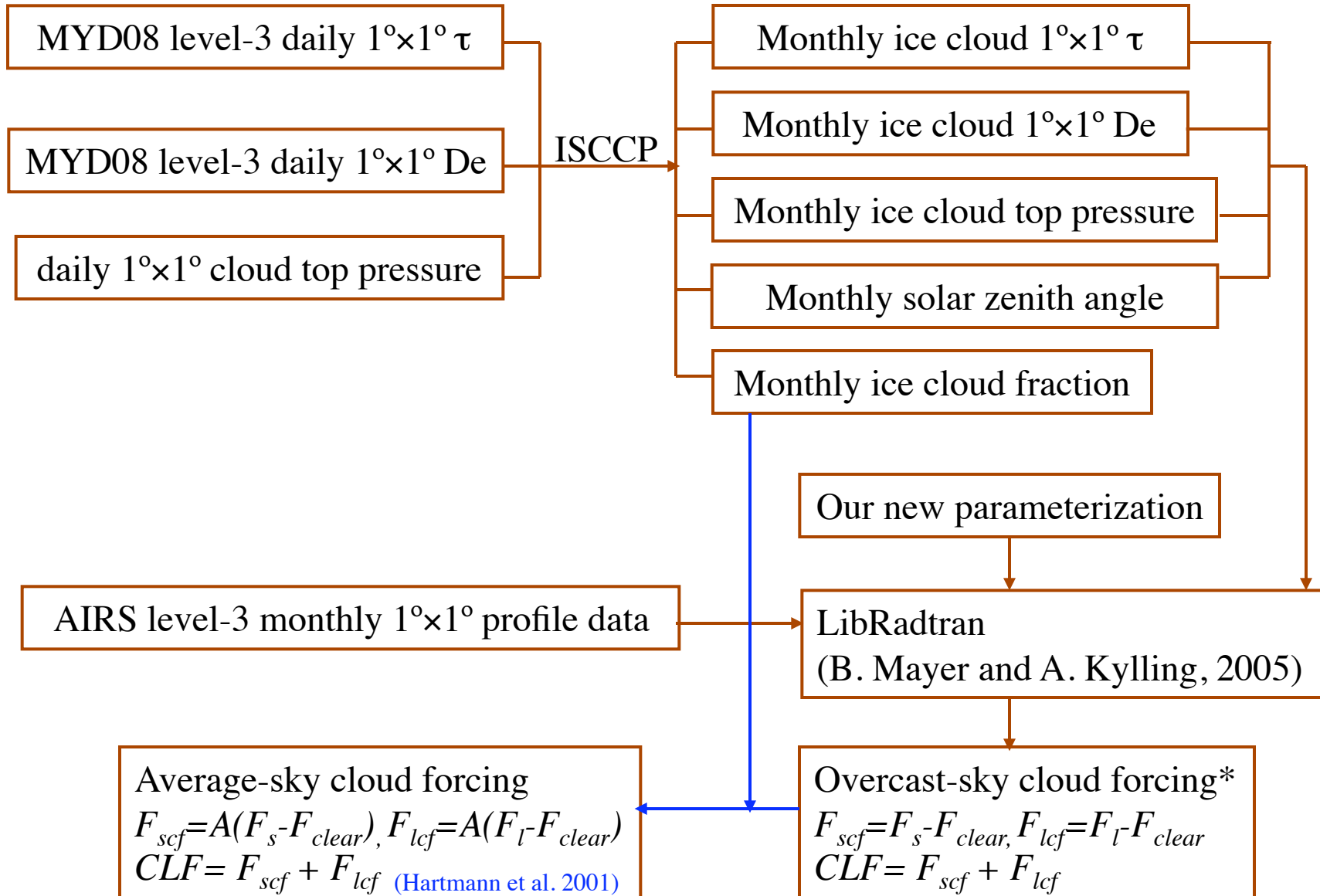
- $2500 \mu\text{m} < D$



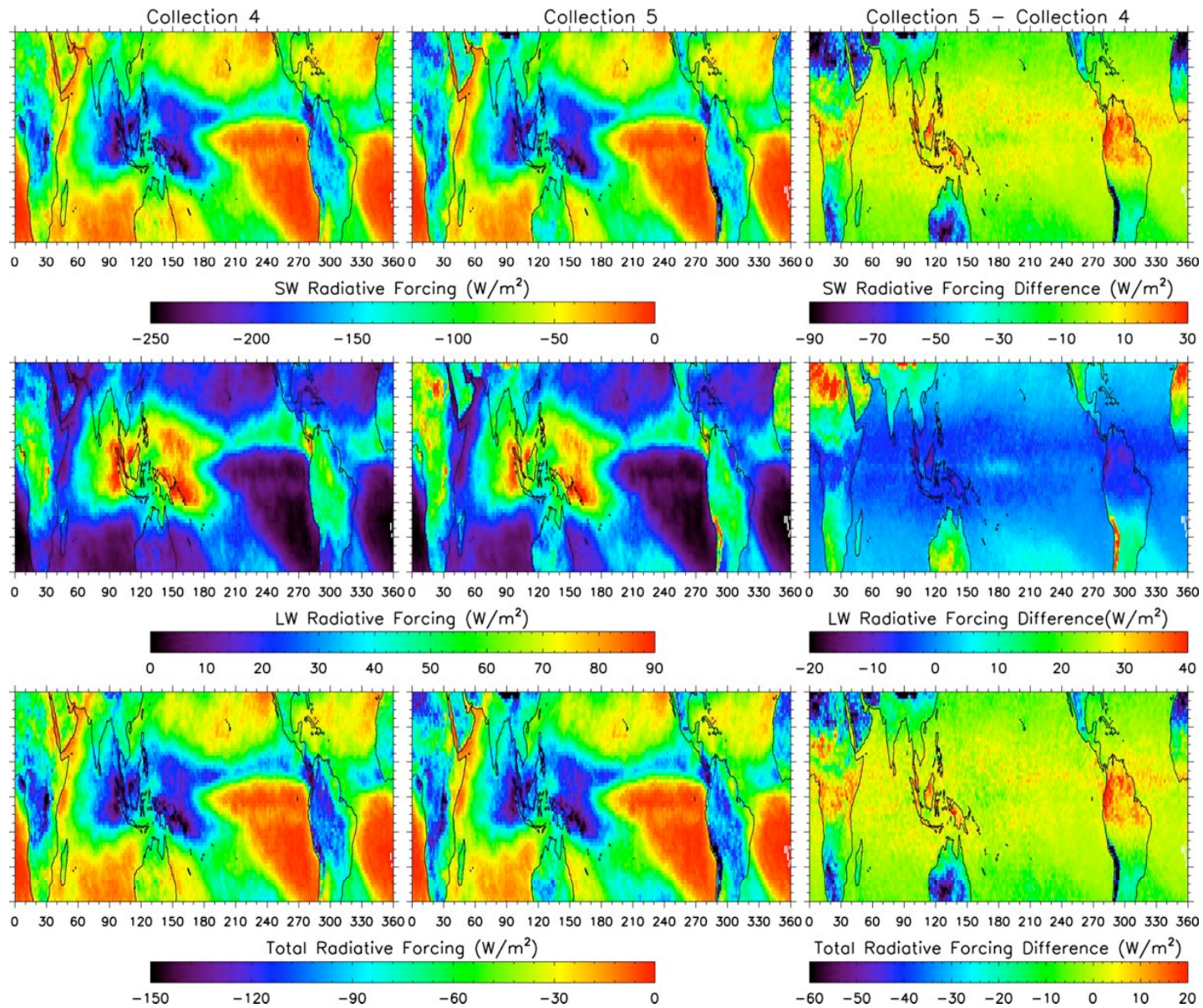
$$IWC = \rho_i \int_{D_{\min}}^{D_{\max}} \left[ \sum_{i=1}^N f_i(D) V_i(D) \right] N(D) dD$$

Mixing schemes for ice cloud particles  
(Baum et al. 2005a)

# Three-year Climatology of Ice Cloud Radiative Forcing



# Ice cloud Radiative Forcing: MODIS Collection 004 vs 005



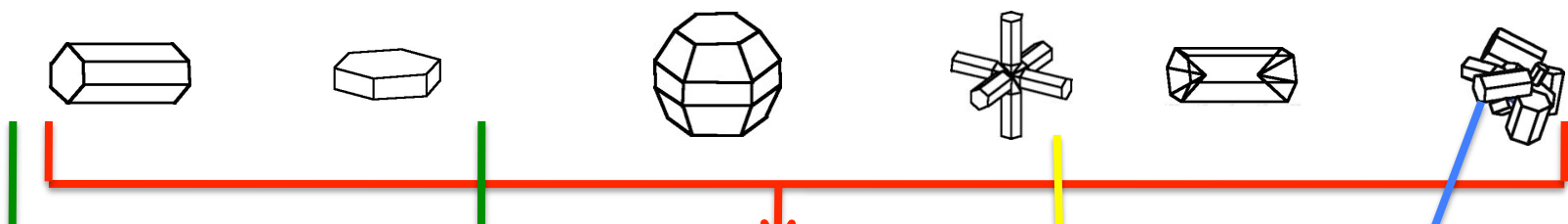
Solar zenith angle  $\theta_0 = 60^\circ$ , Duration of sunlight is assumed to be 12 hours, Tropical standard atmospheric profile

# Improvements to Scattering models

- New treatment of ray-spreading results in the **removal** of the term relating to **delta-transmission** energy at the forward scattering angle.
- **Improved the mapping algorithm**: the single-scattering properties from the new algorithm smoothly transition to those from the conventional geometric optics method at large size parameters.
- **Semi-analytical method** developed to improve the accuracy of the first-order scattering (diffraction and external reflection).
- **Semi-empirical method** is developed to incorporate the edge effect on the extinction efficiency and the above/below-edge effects on the absorption efficiency.



# Progress toward complex particle shapes



Micrographs showing particles with internal inclusions. Scale bars indicate 0.2 mm. Below are 3D models of particles with internal spheres or ellipsoids.

(Tape, 1994; Xie et al., 2009)

Four schematic diagrams of particles with parameters:

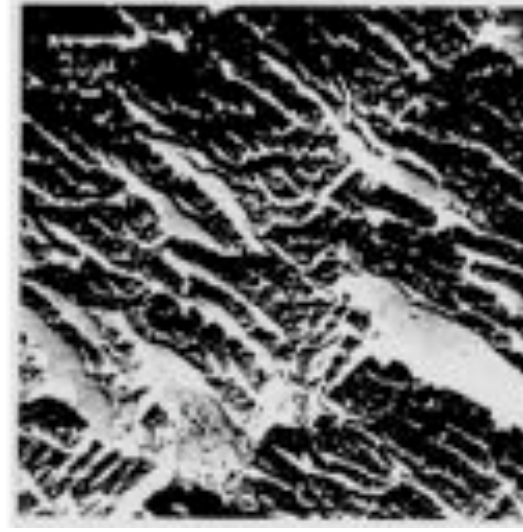
- $a=300 \mu\text{m}$ ,  $\Delta t=20 \mu\text{m}$ ,  $\Delta n=3 \mu\text{m}$
- $a=300 \mu\text{m}$ ,  $\Delta t=20 \mu\text{m}$ ,  $\Delta n=3 \mu\text{m}$
- $a=300 \mu\text{m}$ ,  $\Delta t=10 \mu\text{m}$ ,  $\Delta n=6 \mu\text{m}$
- $a=300 \mu\text{m}$ ,  $\Delta t=10 \mu\text{m}$ ,  $\Delta n=6 \mu\text{m}$

(Yang et al., 2008a)

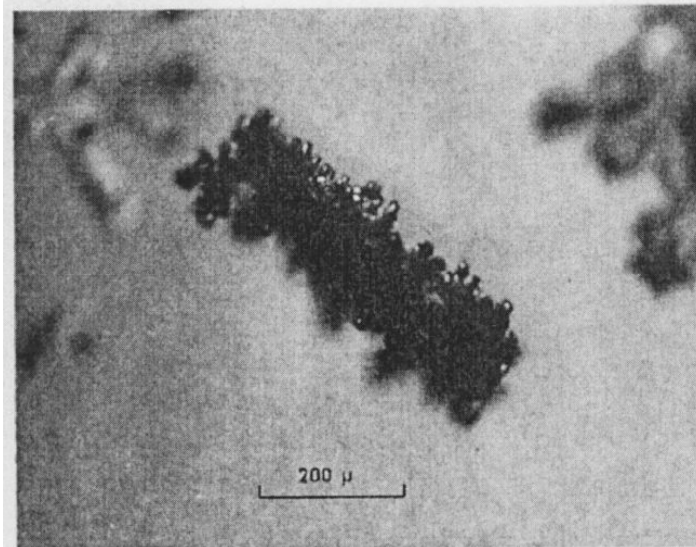
12 3D models showing the evolution of a six-pointed star particle.

(Yang et al., 2008b)

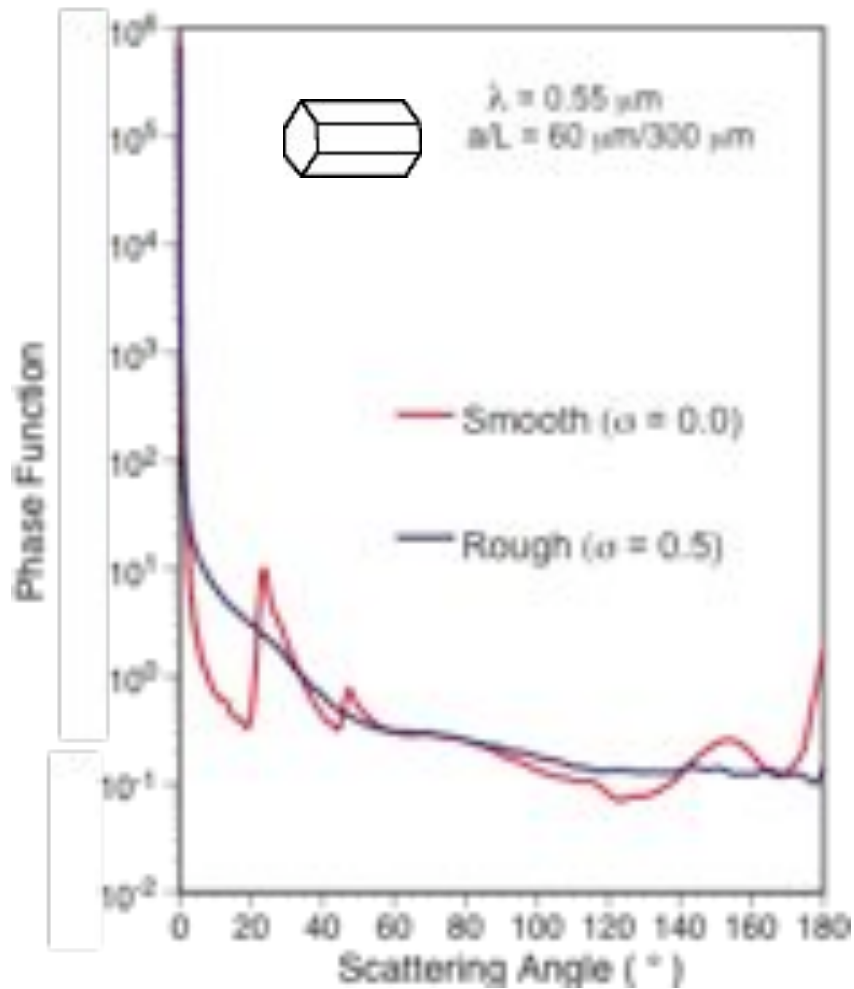
3D models showing various complex, multi-faceted particle shapes.



Surface roughness were observed for single crystals and polycrystalline ice by using an electronic microscope. Images adapted from Cross, 1968

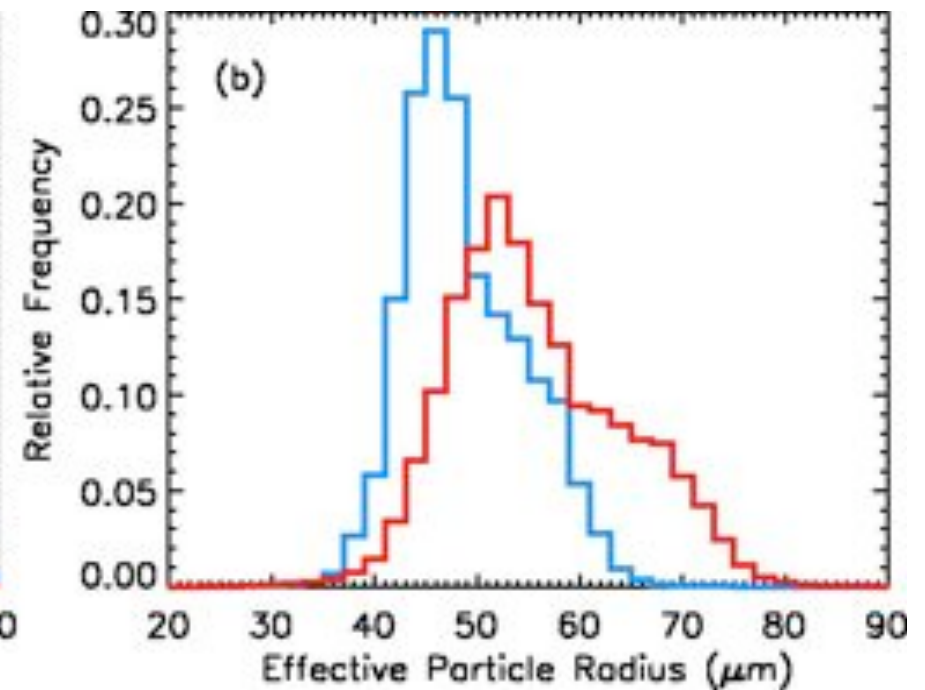
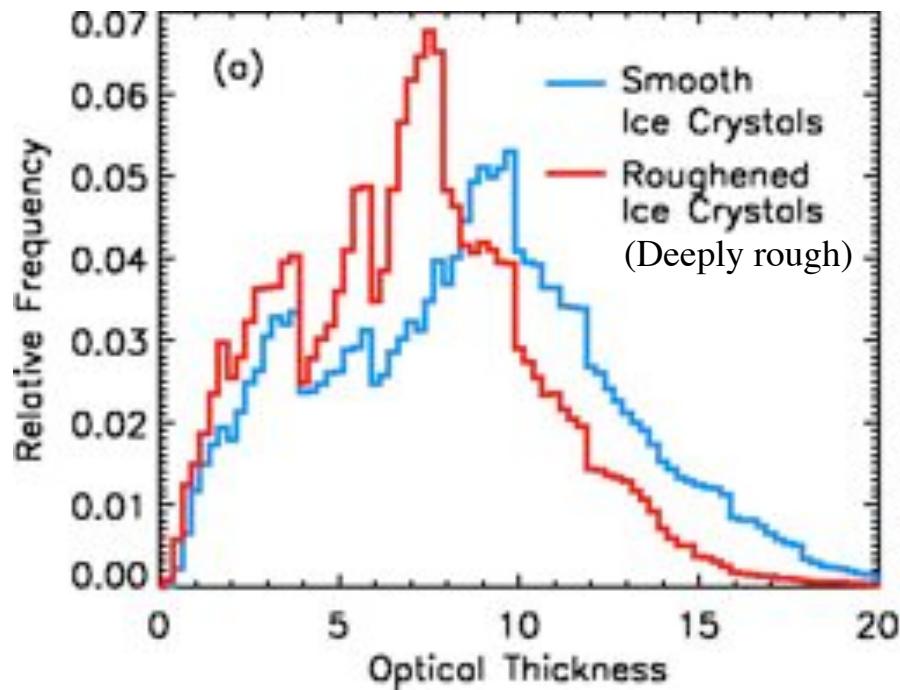


The image of a rimed column ice crystal (adapted from Ono, 1969). The surface roughness of this ice crystal is evident.



As articulated by Mishchenko et al. [1996] on the basis of the observations reported in the literature, halos are not often seen in the atmosphere and the phase functions associated with ice clouds might be featureless with no pronounced halo peaks. One of the mechanisms responsible for the featureless phase function might be the surface distortion or roughness of ice crystals

## Effect of particle surface roughness on retrievals: Ice cloud optical thickness and effective particle size

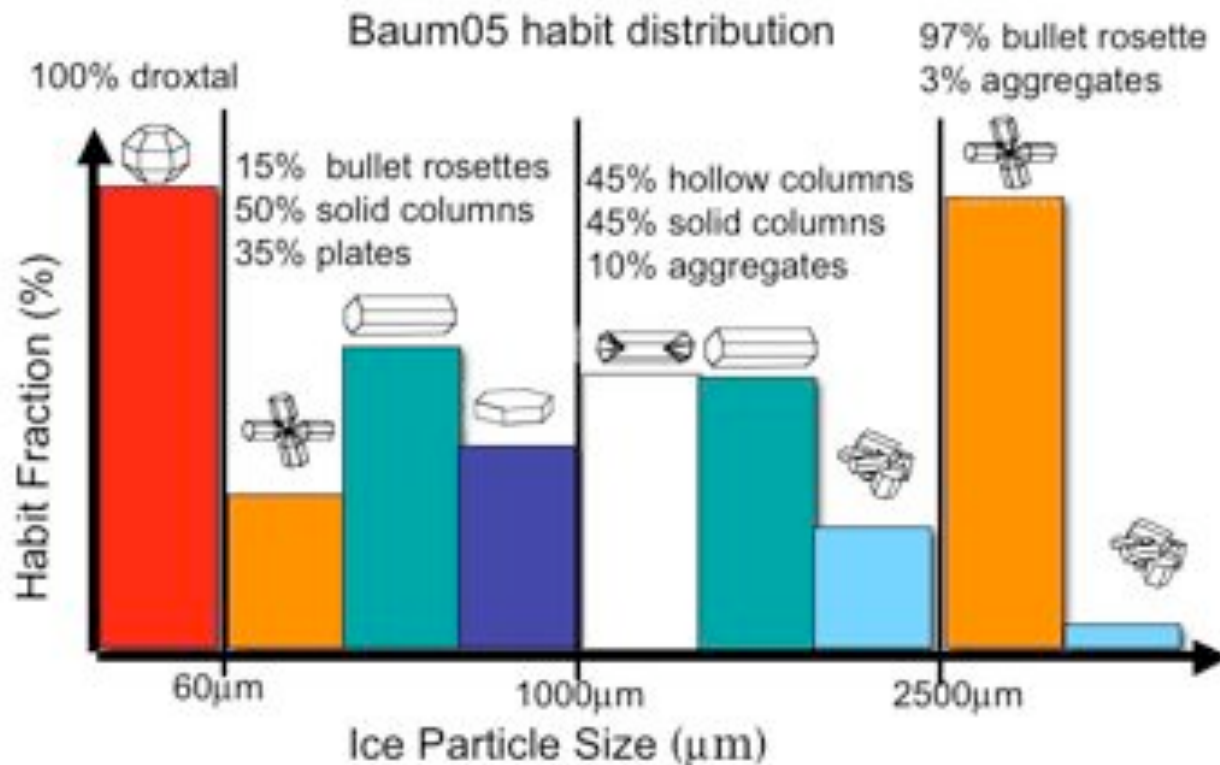




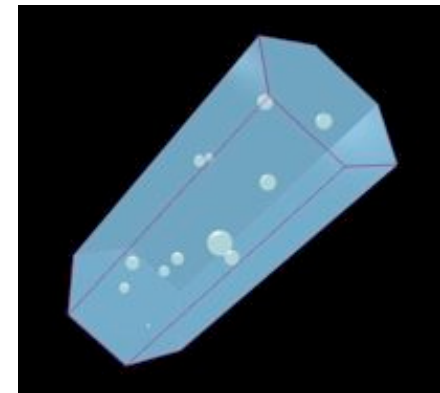
# Differences between the MODIS and POLDER ice cloud models

## Bulk scattering model

- MODIS: Baum05 model (Baum, Yang and co-authors, 2005)
- POLDER: IHM model (C.-Labonnote et al. 2000)

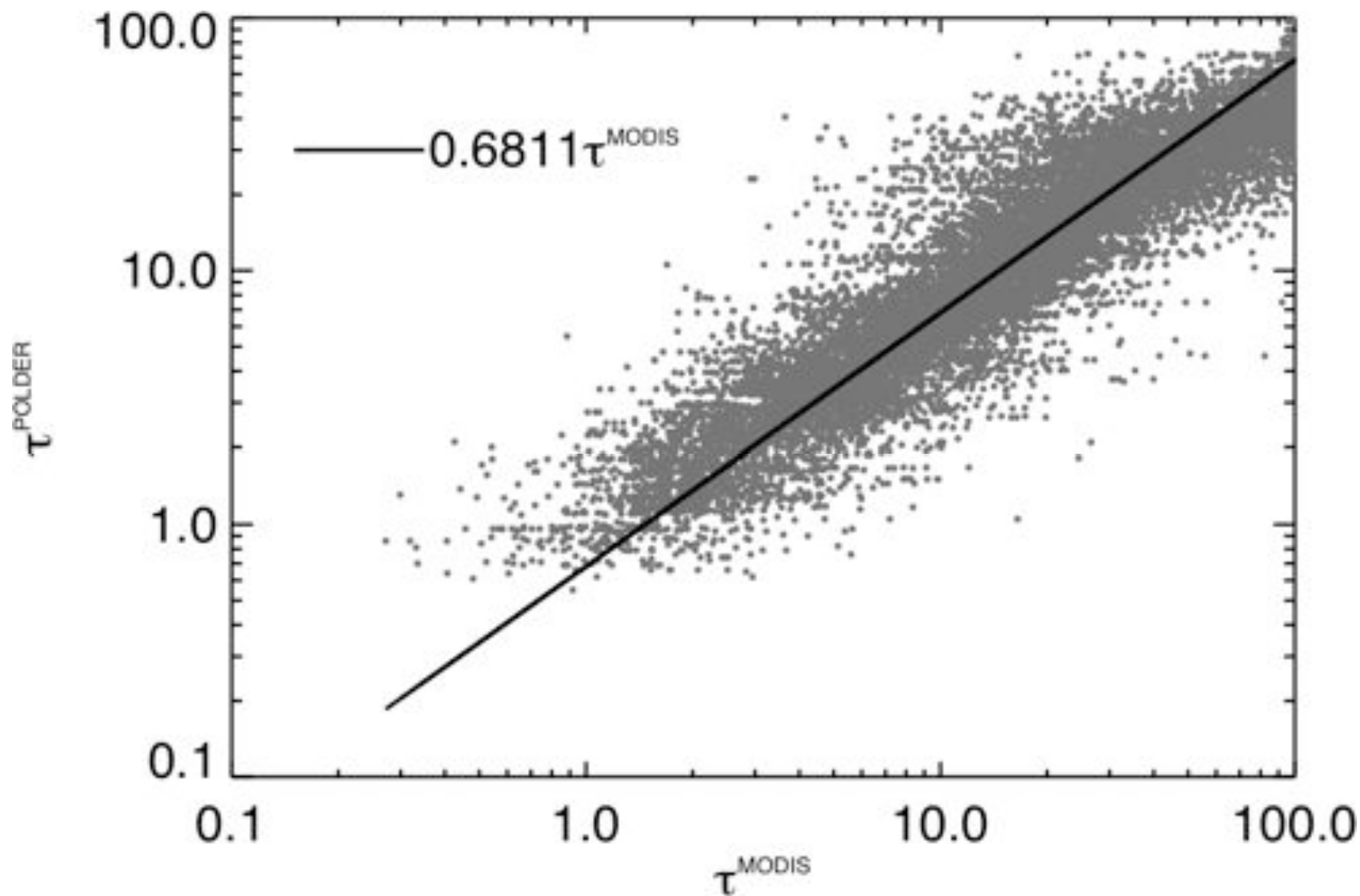


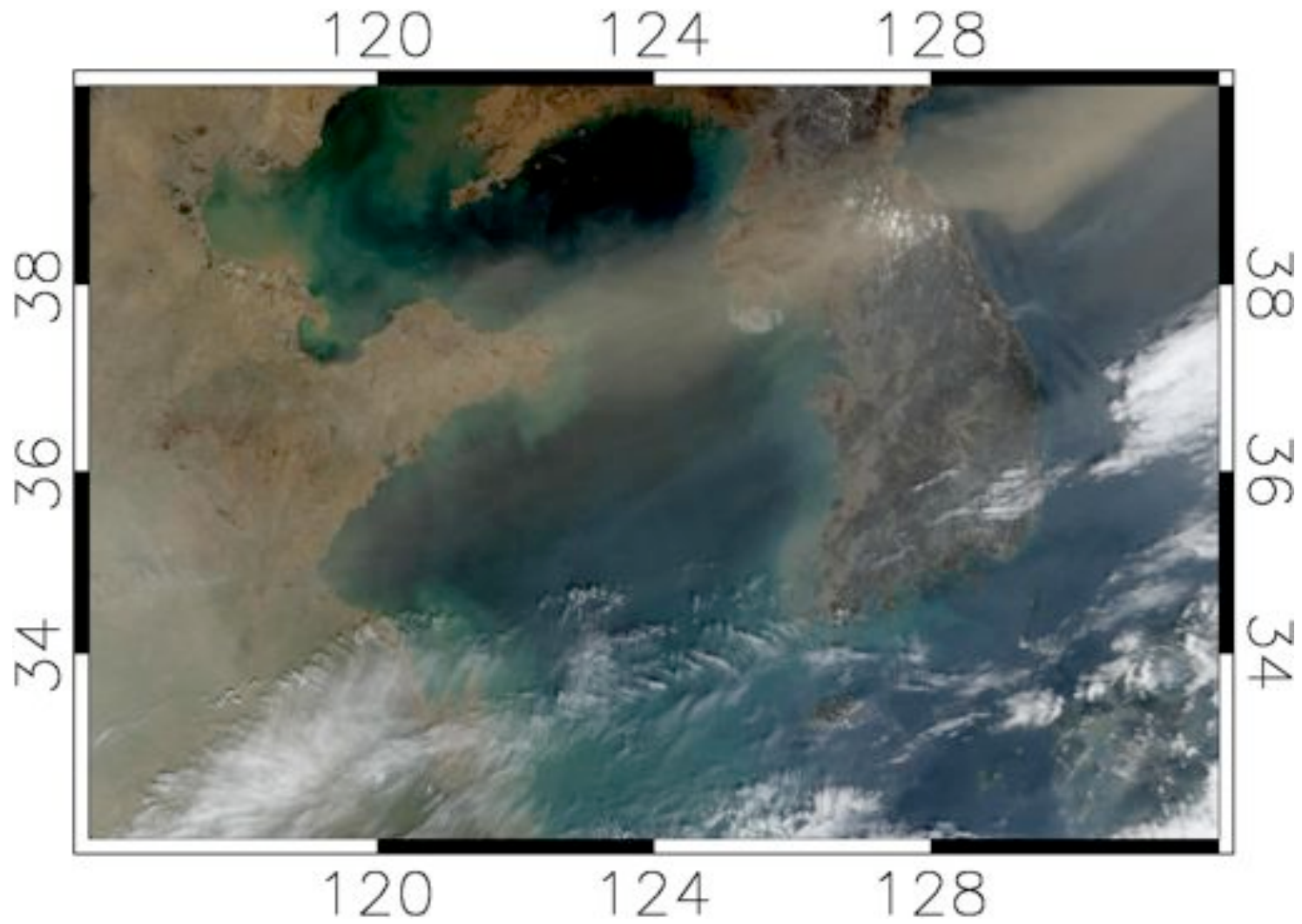
## IHM model



Courtesy of  
Dr. Jerome Riedi

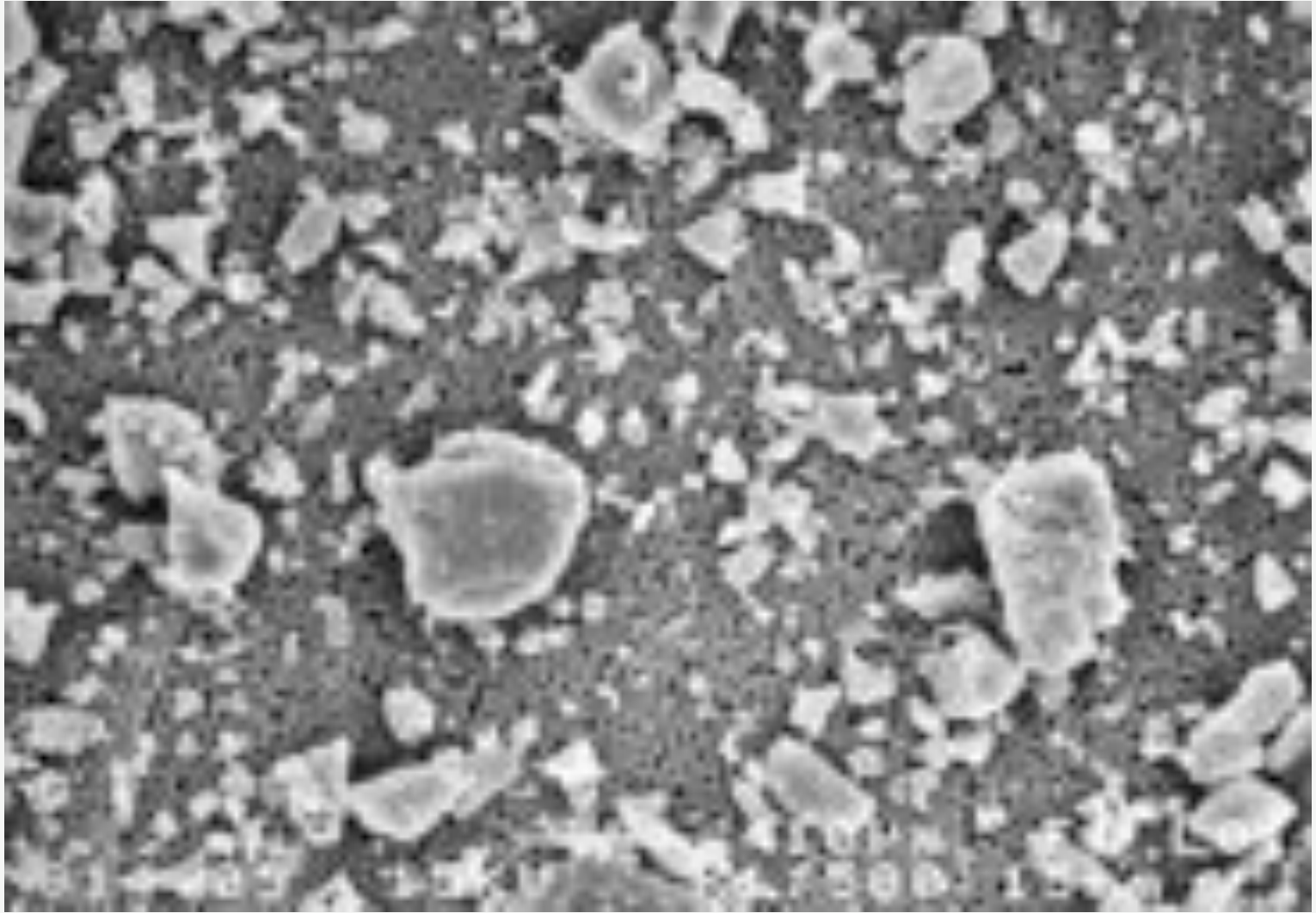
Comparison between MODIS and POLDER Retrievals  
(Zhang, Yang and co-authors, 2009)





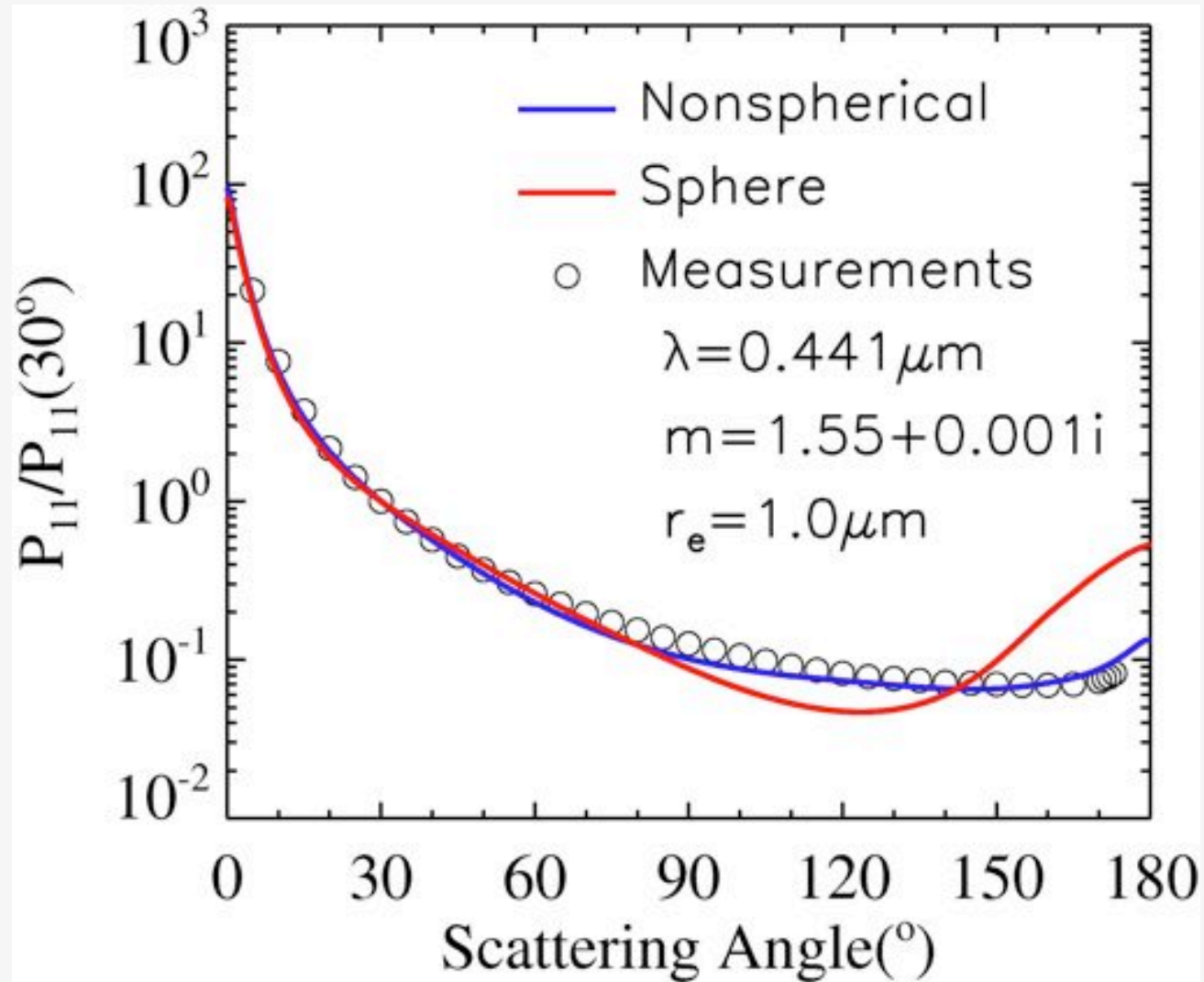
Asian Dust

MODIS RGB ( $0.65\mu\text{m}$ ,  $0.55\mu\text{m}$ ,  $0.47\mu\text{m}$ ) Image



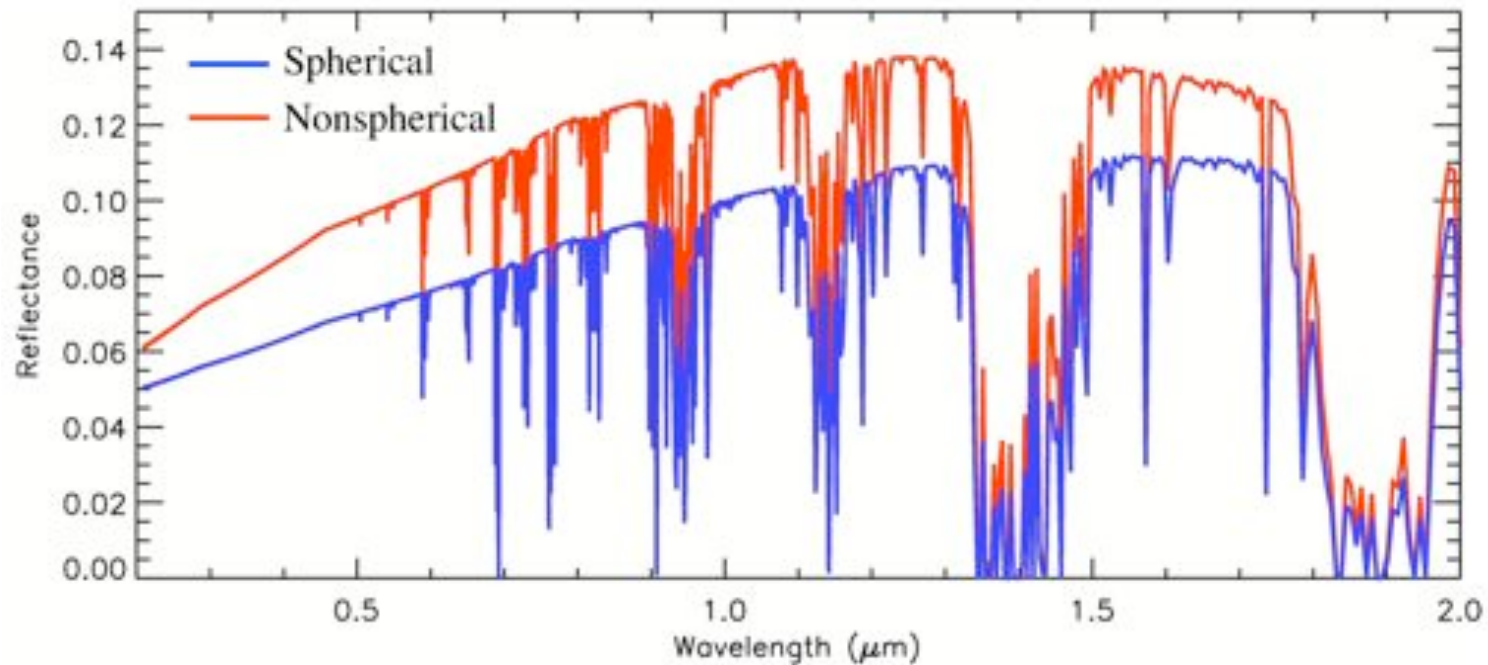
Mineral aerosols sample (feldspar) SEM image (Volten et al., 2001). Dust aerosols are exclusively irregular particles with arbitrary geometries.



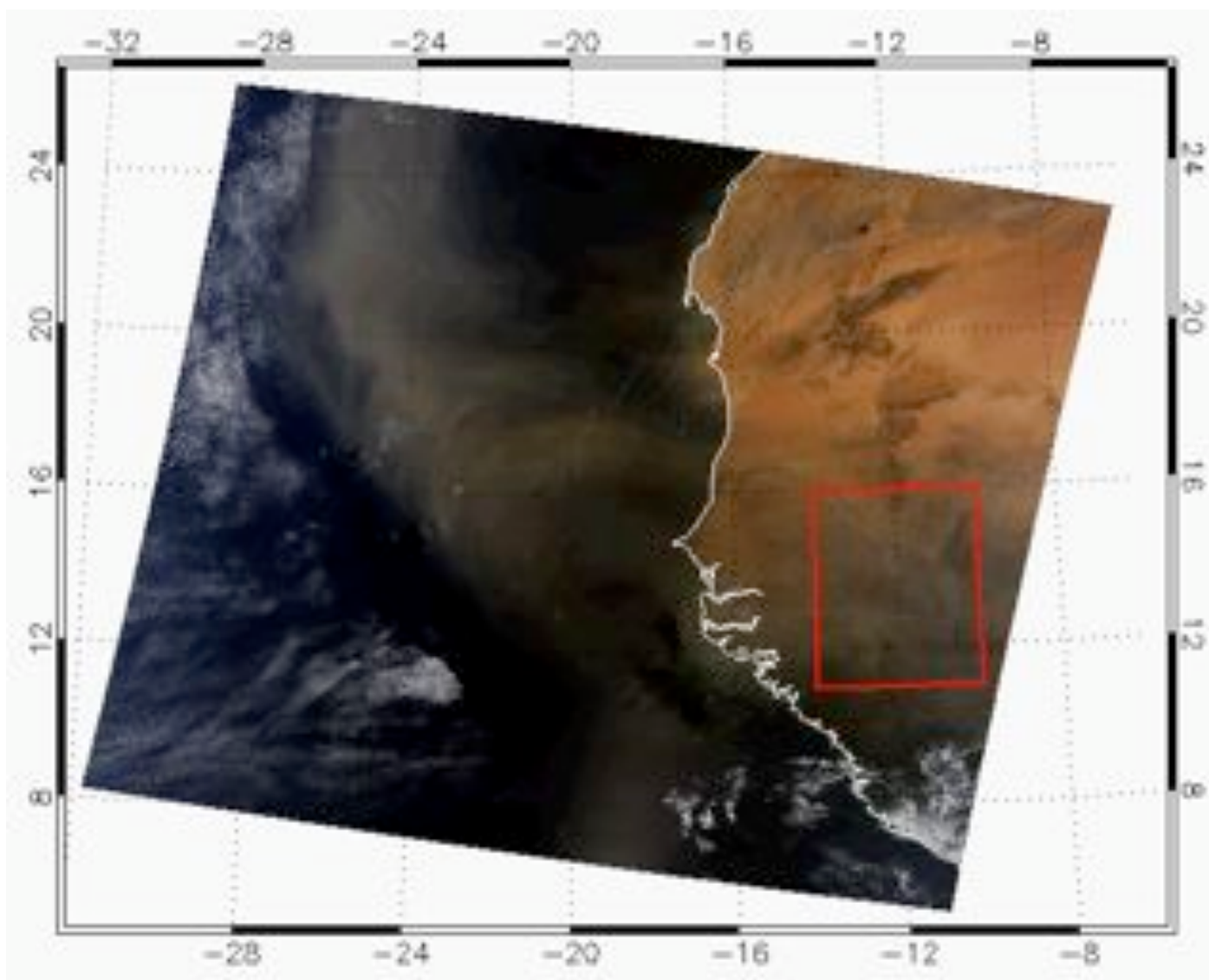


Comparison between the phase functions computed for spherical and nonspherical dust particles (Feng, Yang, Kattawar and co-authors, 2009). The symbols indicate laboratory measurements (Volten et al. 2001).

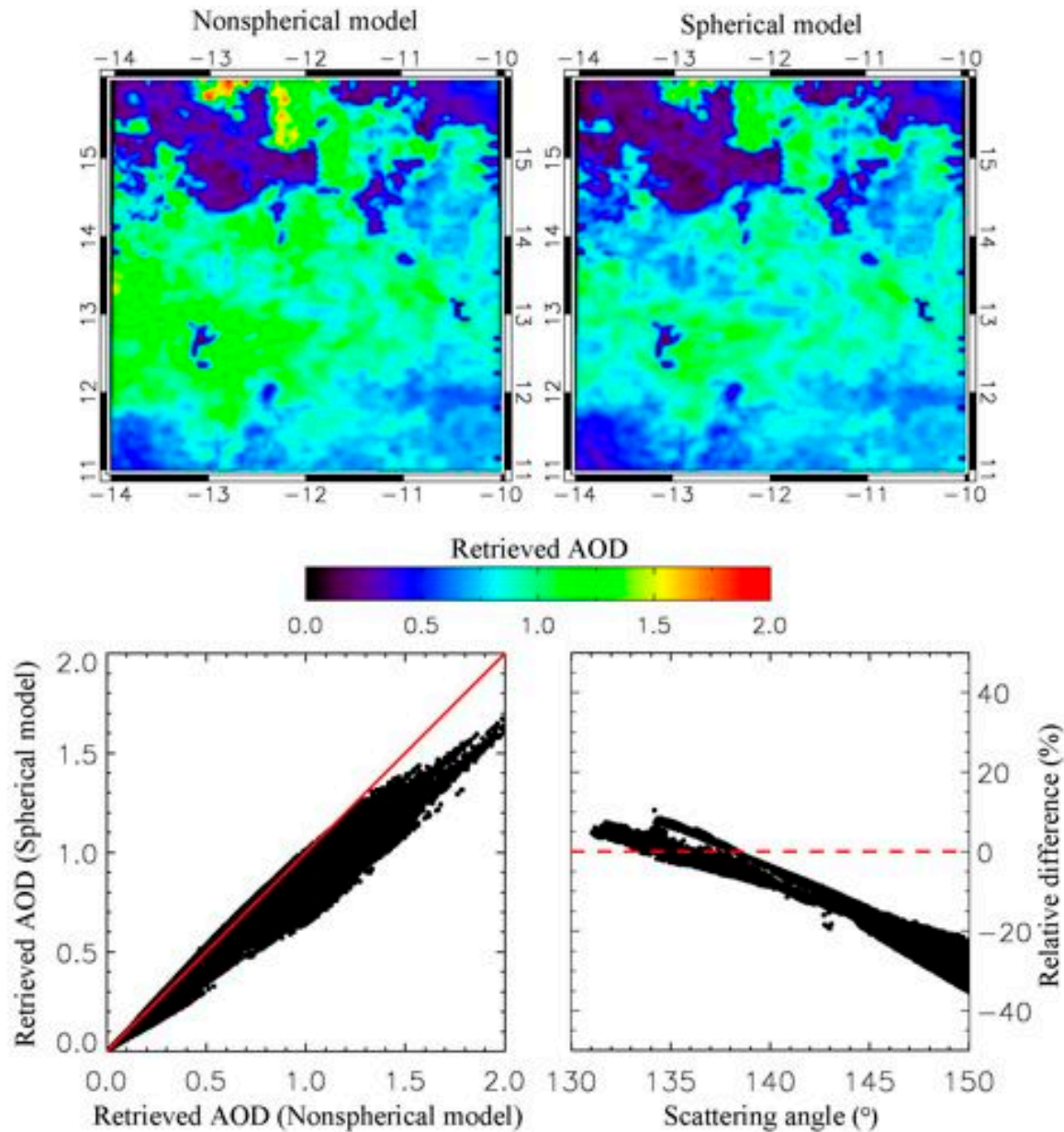
Simulated solar reflectance at the top of a dusty atmosphere. Spherical and nonspherical shapes are assumed for dust particles (Yang et al. , 2007).



- These results indicate that the equivalent sphere approximation leads to an underestimate of the albedo of a dusty atmosphere. This underestimate has an important implication to the study of the effect of airborne dust on the radiation budget within the atmosphere.



MODIS RGB image on March 2, 2003, showing a dust plume over West Africa. The area indicated by the small red box is used to retrieve dust AOD in the present sensitivity study (Feng, Yang, Kattawar, Hsu, Tsay and Laszlo, 2009).



**Upper panels:** the retrieved dust AOD based on the nonspherical and sphere models.

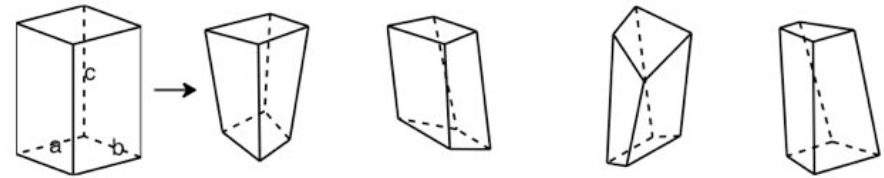
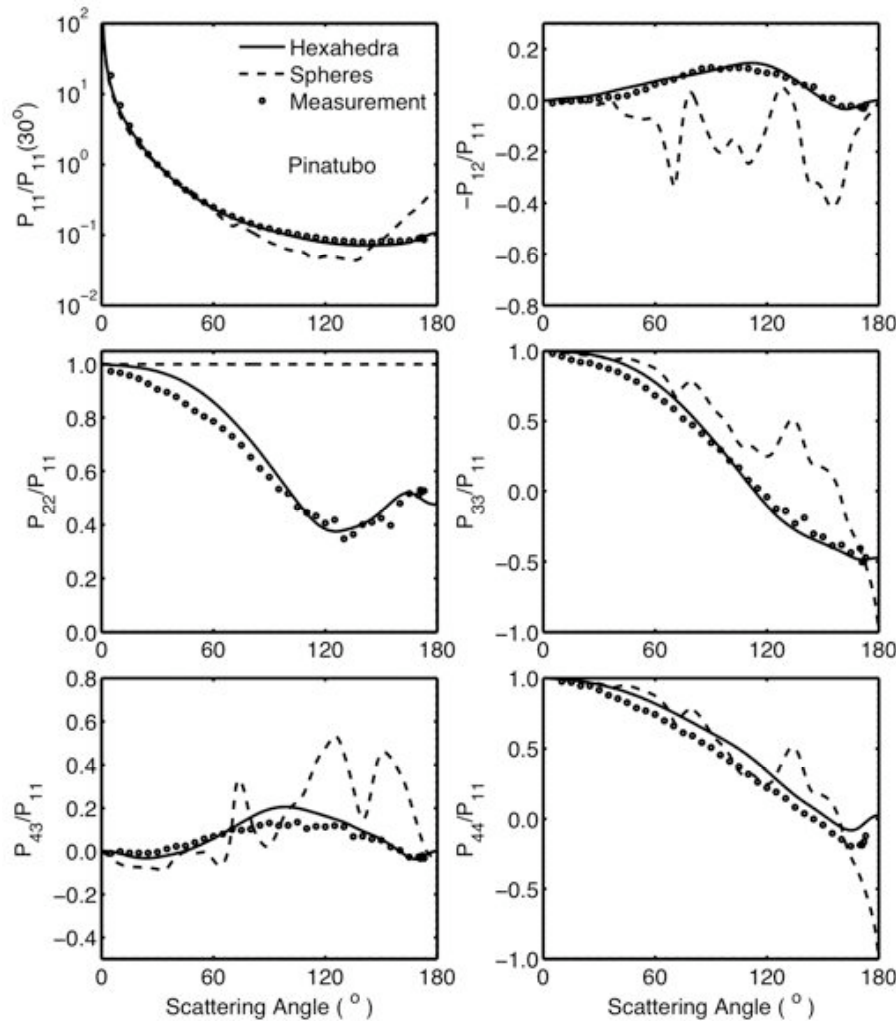
**Lower left panel:** retrieved dust AOD based on the sphere model versus those based on the nonspherical model.

**Lower right panel:** the relative differences of the retrieved AOD (Feng, Yang, Kattawar, Hsu, Tsay and Laszlo, 2009).



# Modeling Optical Properties of Mineral Aerosol Particles by Using Non-symmetric Hexahedra

(Bi, Yang, Kattawar and Kahn, 2010).



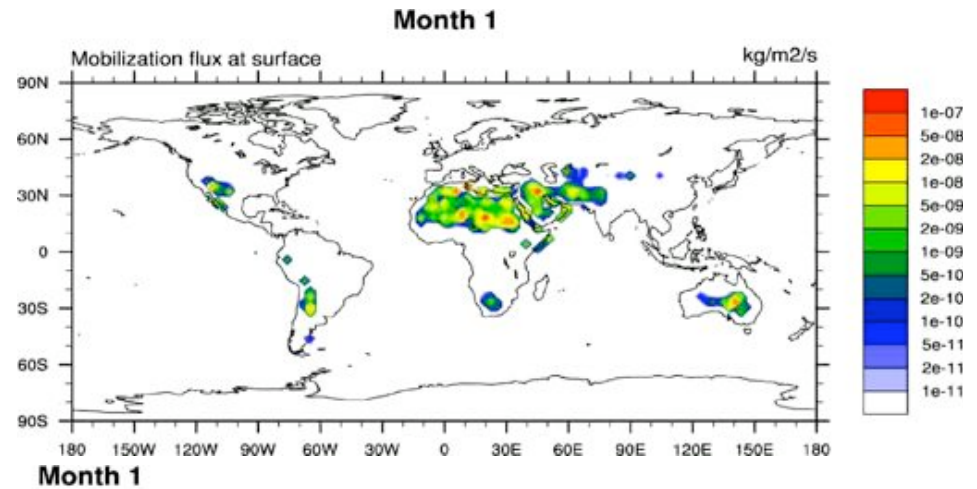
- Comparison of simulated results of hexahedra with measurements for **Pinatubo aerosol particles** at a wavelength of 0.633 μm.

## Dust Aerosols: Observation & Modeling

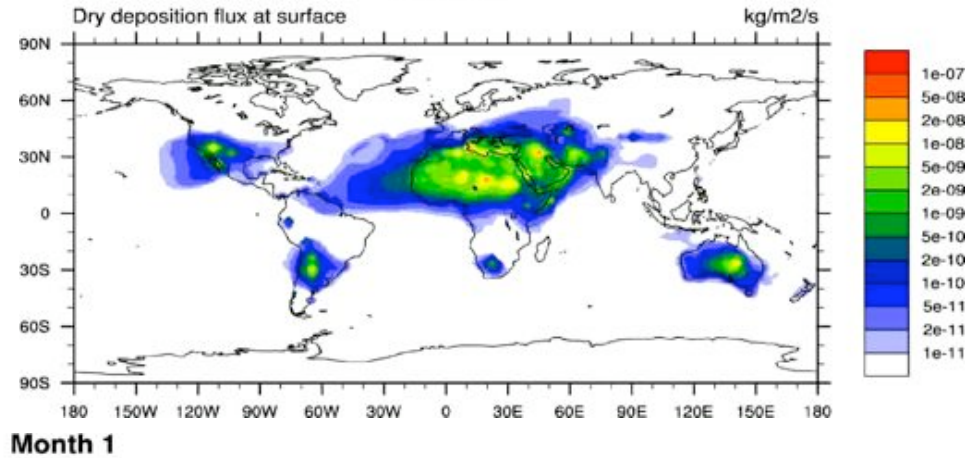
- The CAM3+DEAD model is compiled on Linux platform and is run for ten years; DEAD is a dust entrainment and deposition module developed by Dr. Charlie Zender;
- The model horizontal resolution is T42, which is about  $2.8 \times 2.8$  degrees; a slab ocean model is used. The vegetation in the model is updated with the result of BIOME3 model to better represent dust sources;
- Monthly model output of dust related variables were obtained to compare with former results;
- Multiple satellite AOD data sets are used to compare with the modeling results.

# Model simulated dust mobilization and deposition

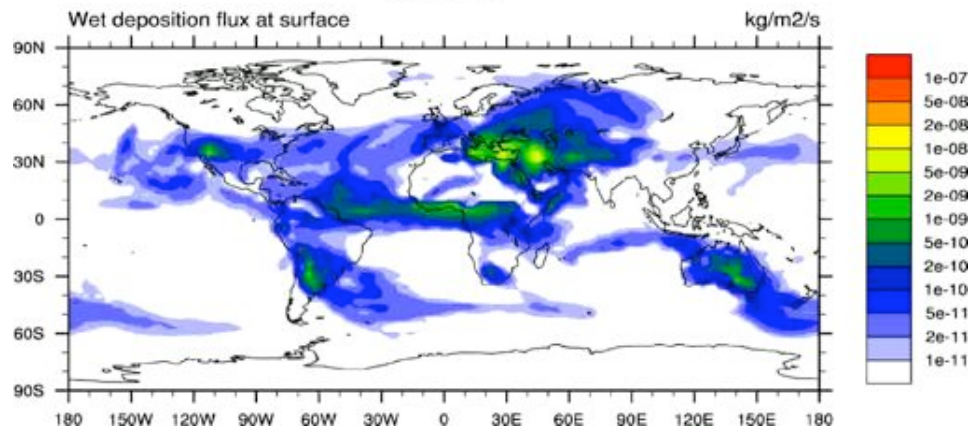
Dust mobilization



Dry deposition of dust

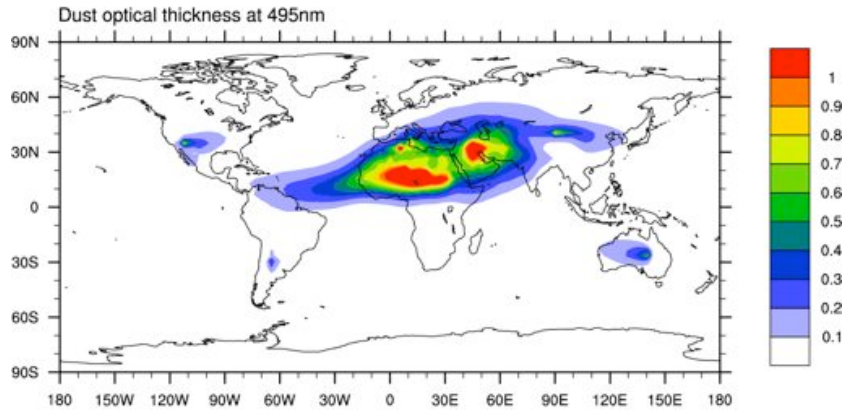


Wet deposition of dust

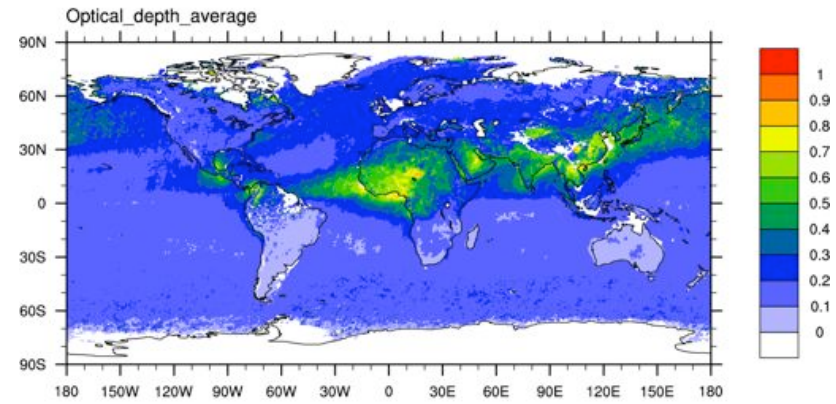


# Modeled and Observed AOD - Spring

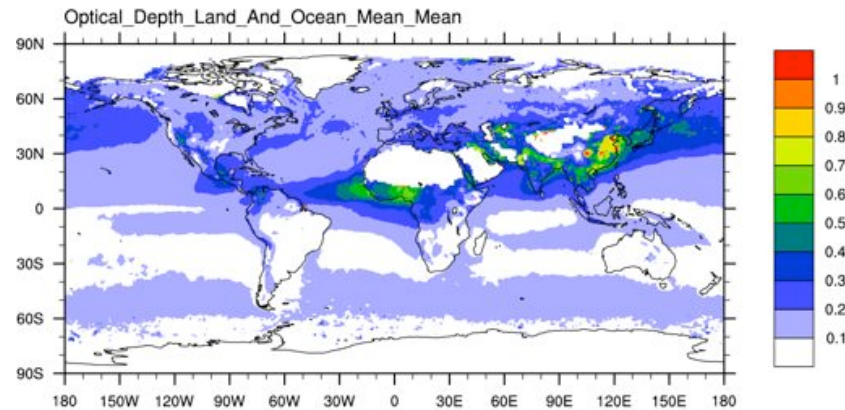
**Dust optical depth**



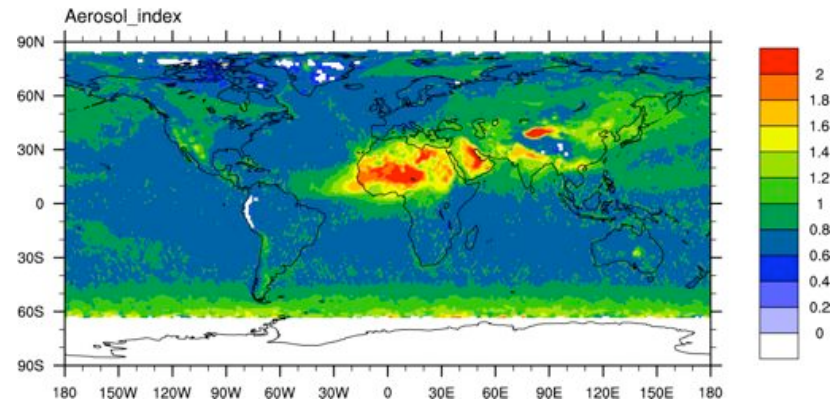
**MISR AOD climate average for SPR**



**MODIS TERRA AOD 10 yr average climatology for SPR**



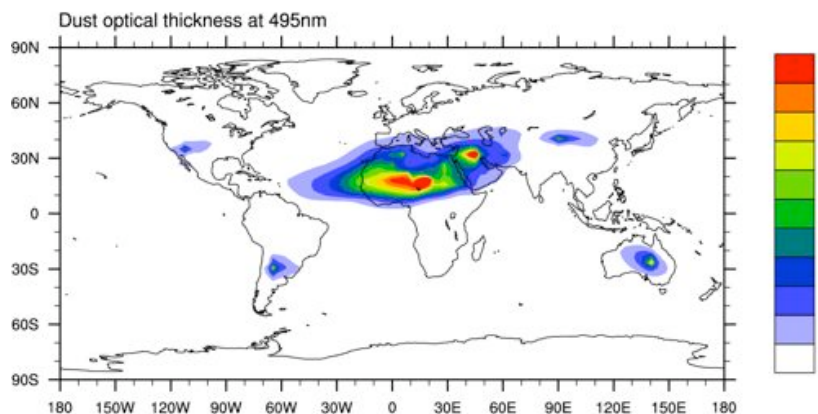
**TOMS OMI averaged AI for Month 4**



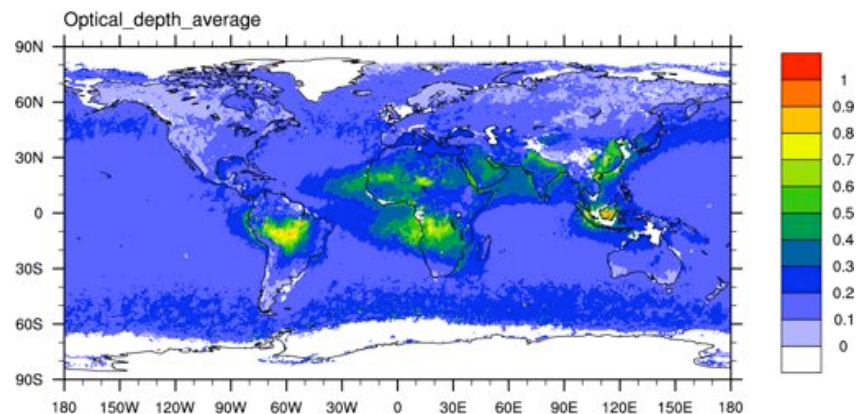


# Modeled and Observed AOD - Fall

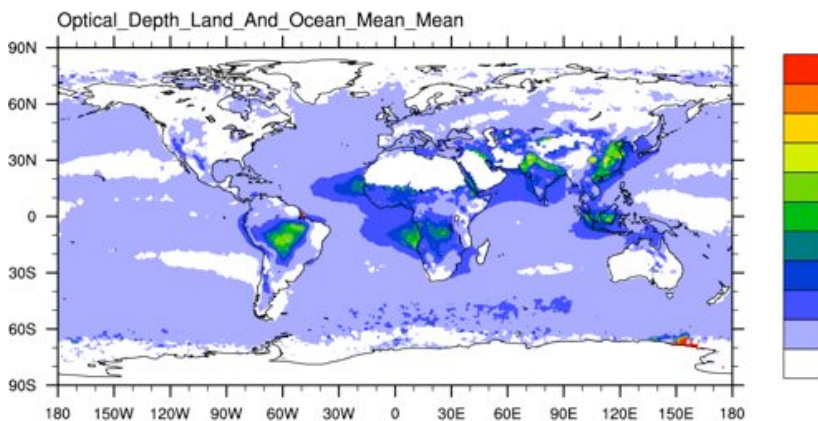
Dust optical depth



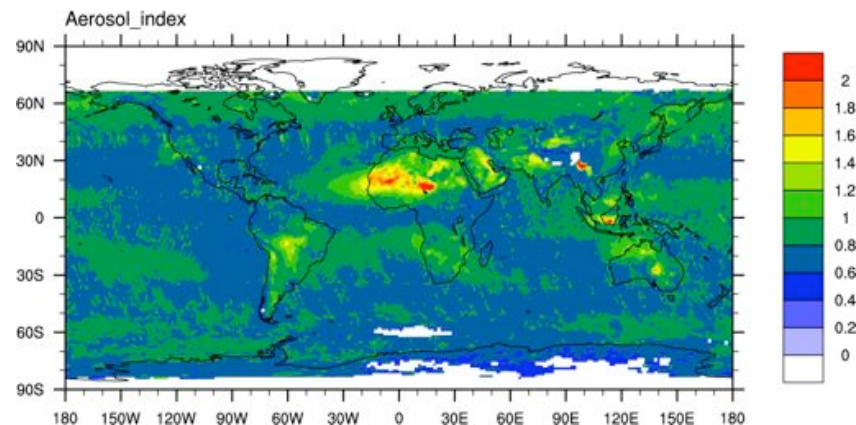
MISR AOD climate average for FALL



MODIS TERRA AOD 10 yr average climatology for FALL

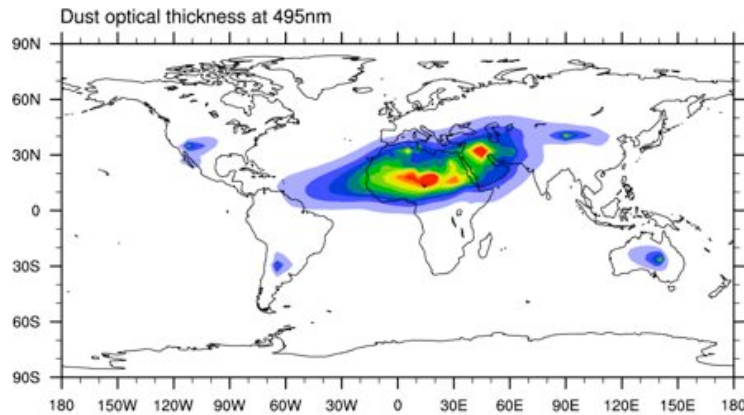


TOMS OMI averaged AI for Month 10

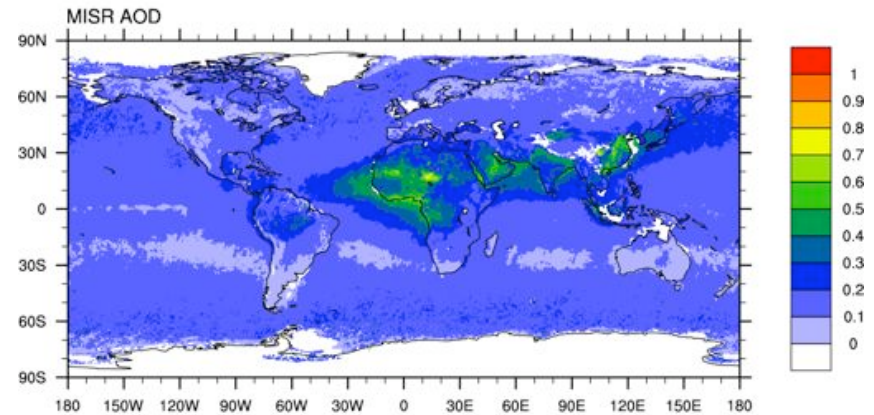


# Modeled and Observed AOD – All year average

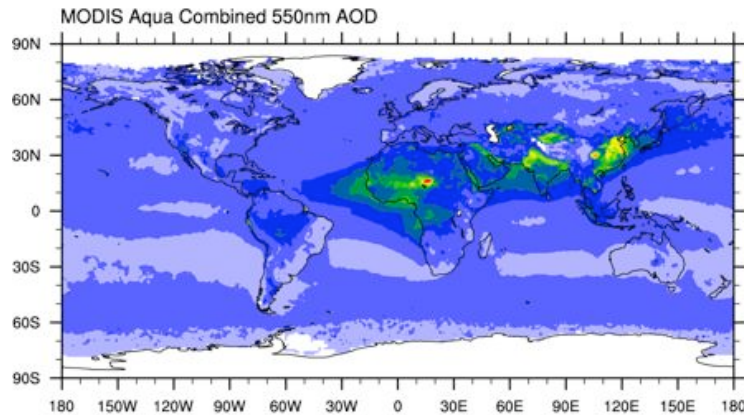
**Dust optical depth**



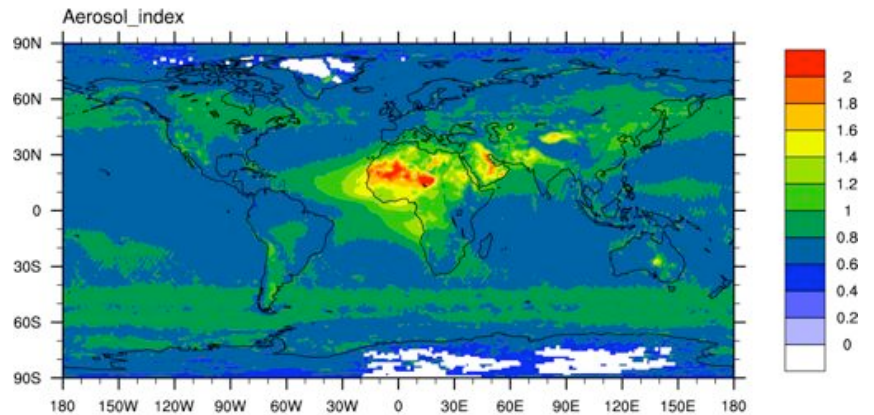
**MISR AOD average climatology: 2005-2008**



**MODIS Aqua Combined AOD average climatology: 2005-2008**



**TOMS AI average climatology: 2005-2008**





# Dust radiative forcing

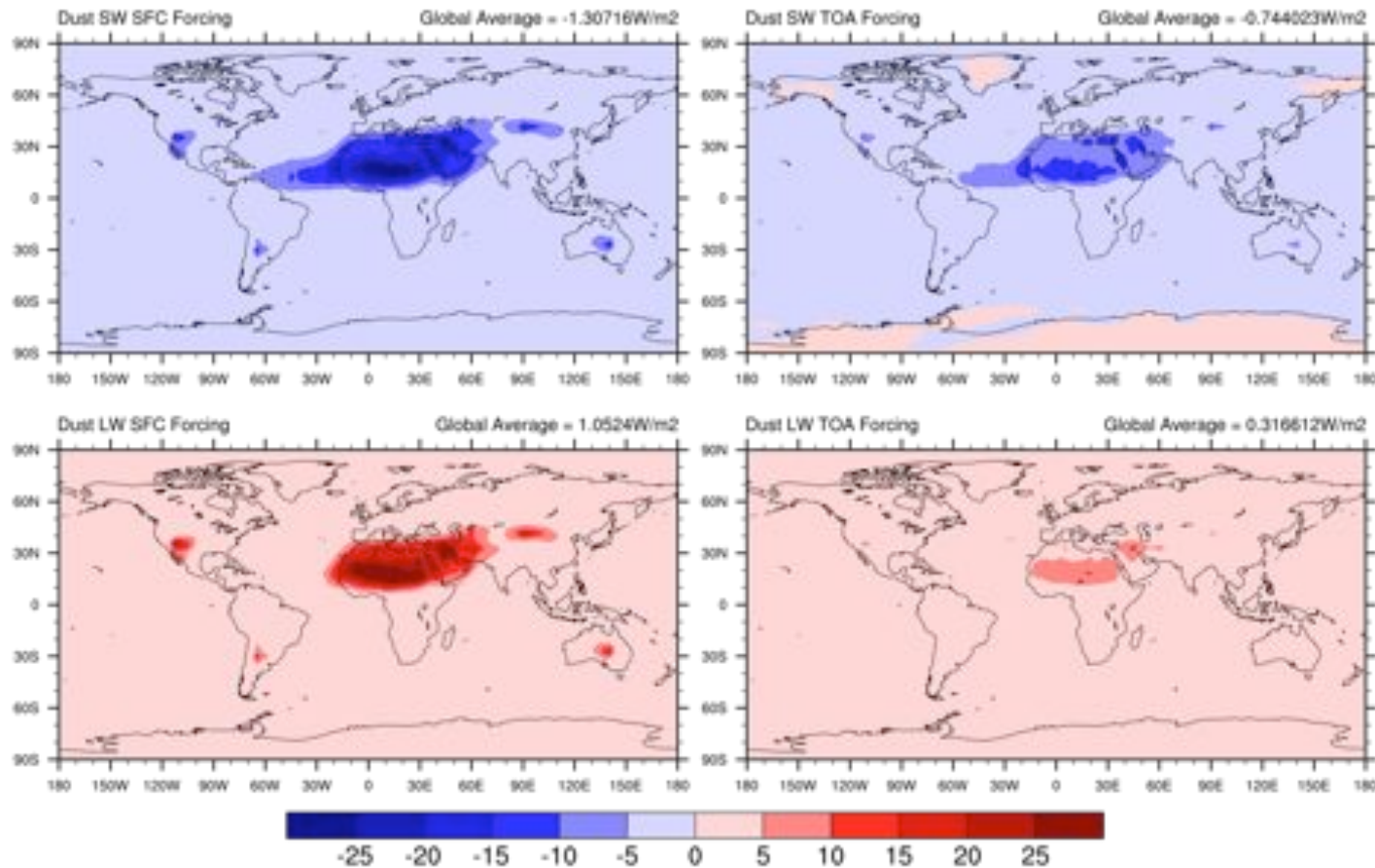
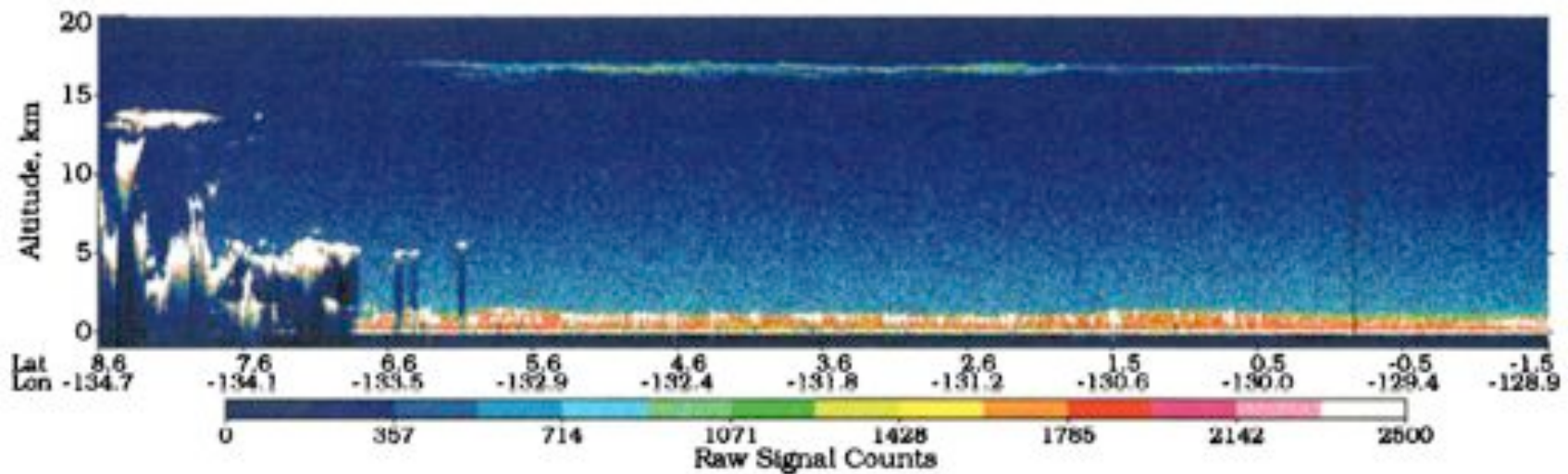


Fig. Simulated dust radiative effect: difference in Short-wave and Long-wave radiative flux at TOA and SFC in dust-on and dust-off cases

## “Thin” Cirrus clouds

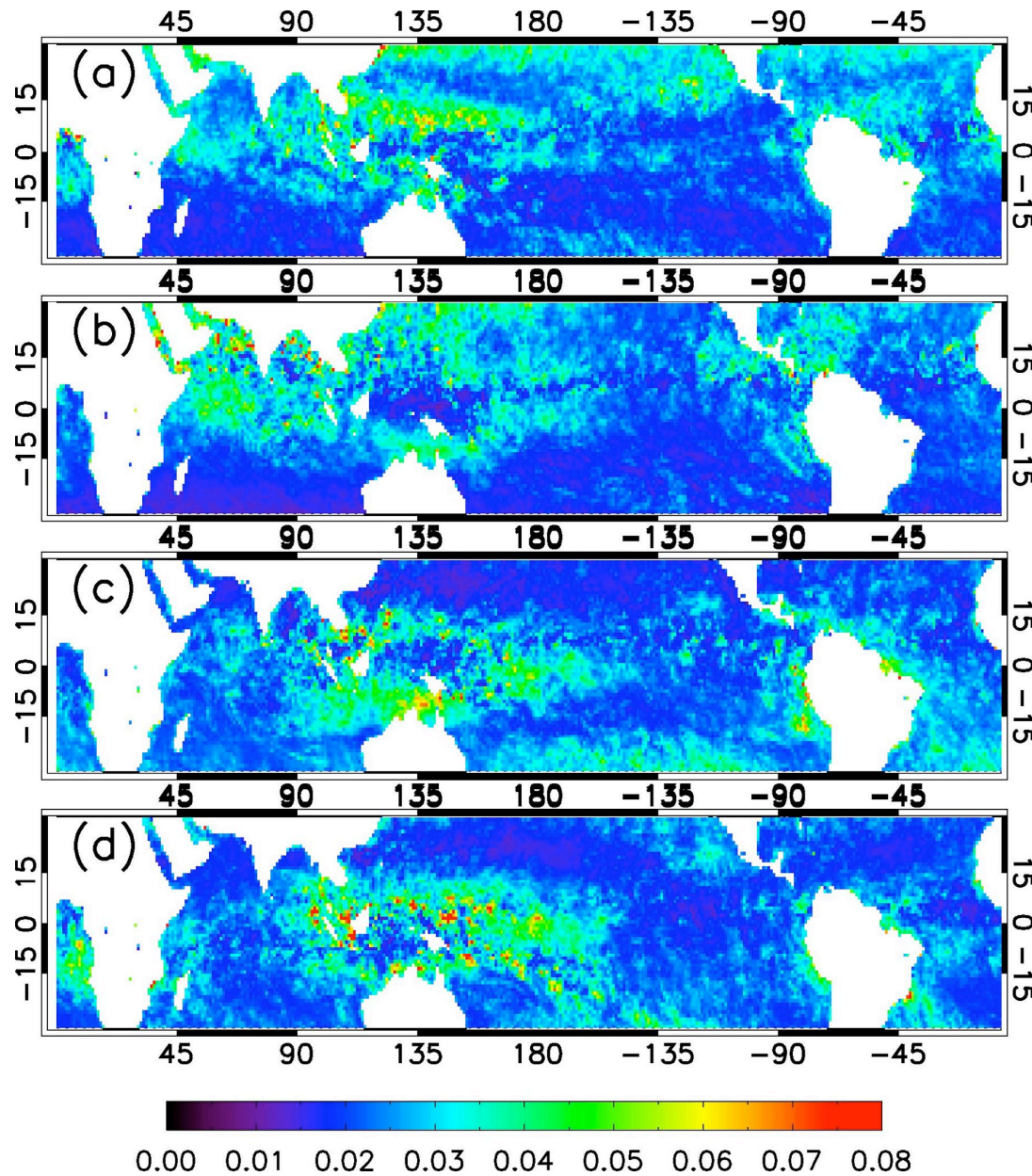
- “Thin” cirrus clouds are defined here as being those not detected by the operational MODIS cloud mask, corresponding to an optical depth value of approximately 0.3 or smaller, but are detectable in terms of the cirrus reflectance product based on the MODIS 1.375- $\mu\text{m}$  channel;
- Our preliminary results show that thin cirrus clouds were present in more than 40% of the pixels flagged as “clear-sky” by the operational MODIS cloud mask algorithm;
- The present study shows positive and negative net forcings at the top of the atmosphere (TOA) and at the surface, respectively. The positive (negative) net forcing at TOA (the surface) is due to the dominance of longwave (shortwave) forcing. Both the TOA and surface forcings are in a range of 0-20  $\text{Wm}^{-2}$ , depending on the optical depths of thin cirrus clouds.





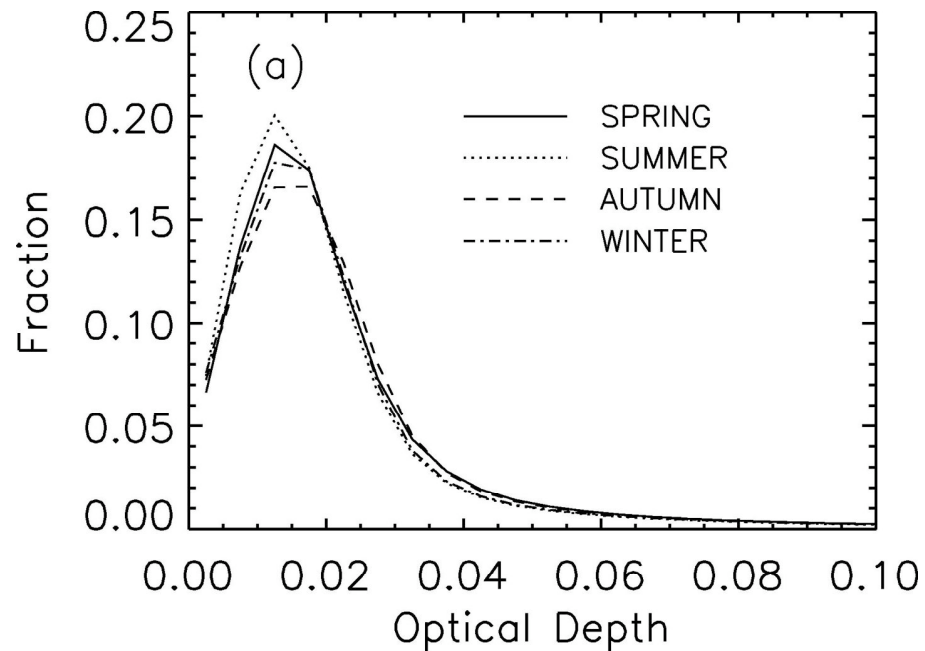
**Cross-section of color-coded raw backscatter signal from the LITE 532 nm channel over the western Pacific Ocean. White indicates dense clouds or the ocean surface return, dark blue indicates clean atmosphere, reds and greens generally indicate aerosols. Laminar cirrus is seen at an altitude of 17 km. (Winker and Trepte, 1998).**

## Subvisible cirrus clouds

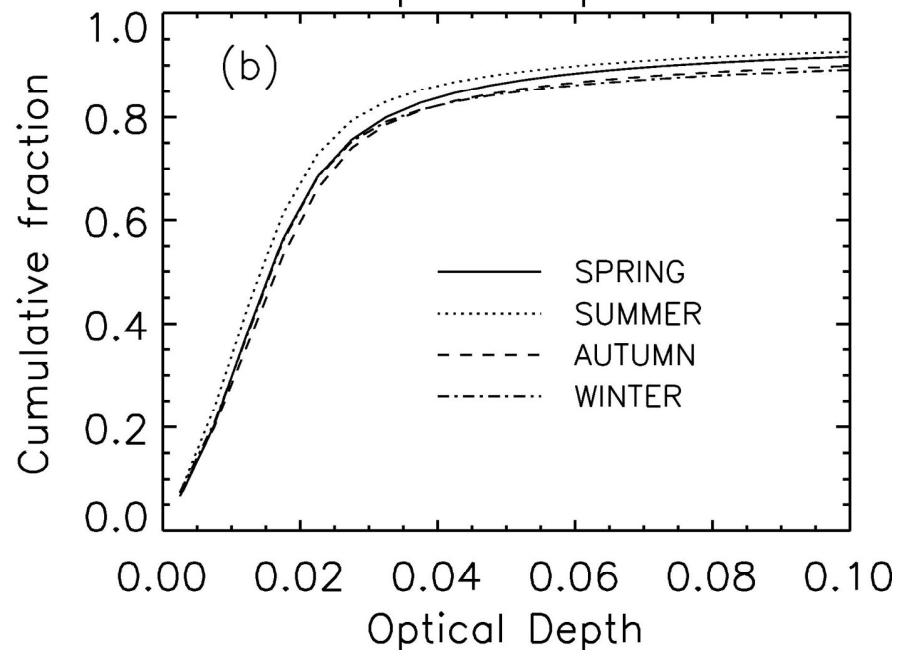


Optical depths of tropical thin cirrus clouds for the pixels flagged as “clear-sky” by MODIS for boreal (a) spring, (b) summer, (c) autumn, and (d) winter (Lee, Yang and co-authors, 2009)

## Subvisible cirrus clouds



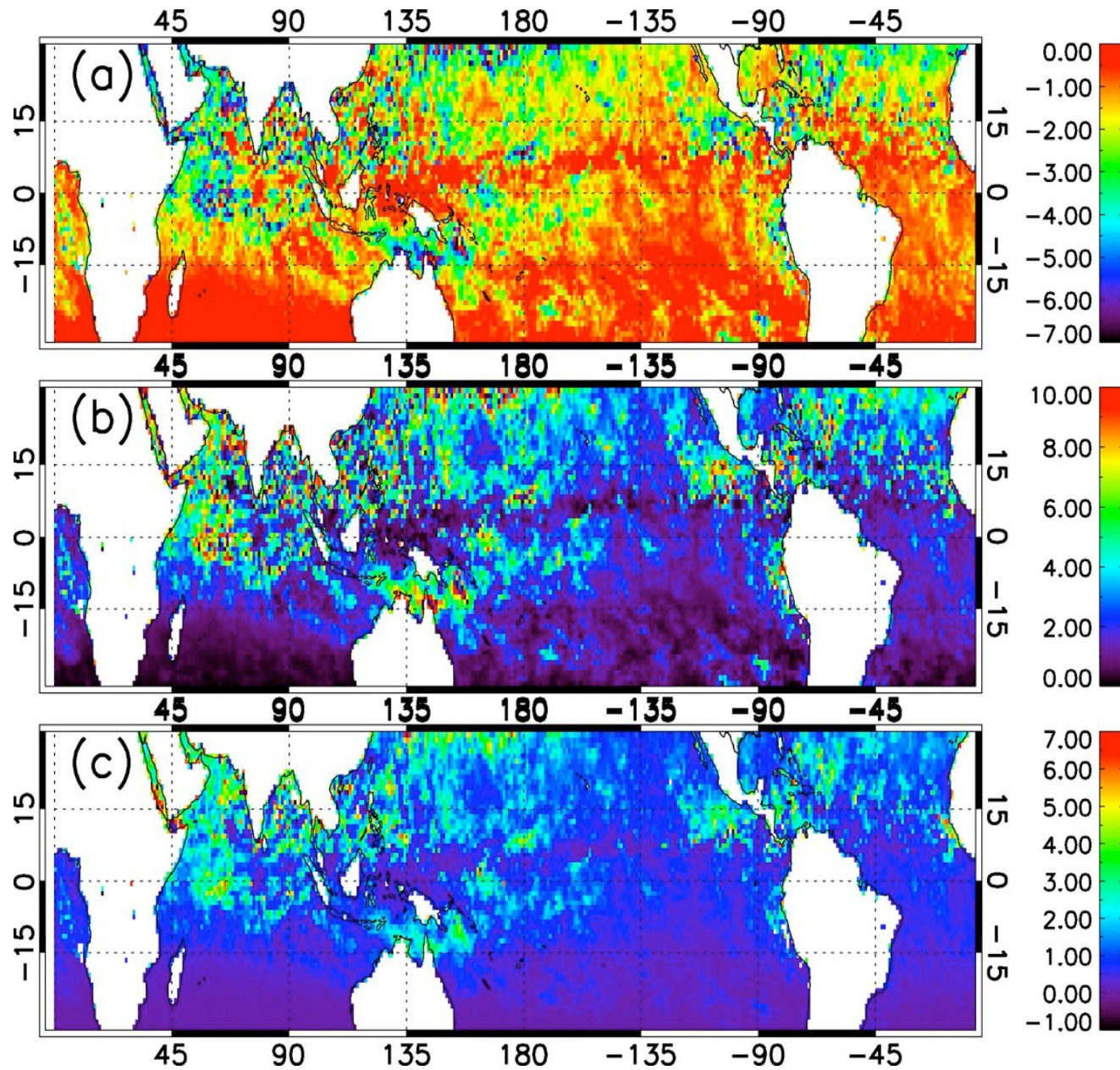
(a) Histograms of optical depth of thin cirrus clouds retrieved between latitudes 30°S and 30°N for each of boreal seasons.



(b) Cumulative fractions of optical depth of thin cirrus clouds for each of boreal seasons.

Lee, Yang and co-authors (2009)





Radiative forcing of subvisible cirrus clouds

Spatial distributions of (a) shortwave, (b) longwave, and (c) net cloud radiative forcing at the top of the atmosphere for June 2005. Units are  $\text{Wm}^{-2}$  (Lee, Yang and coauthors, 2009)



# Summary

- Research with MODIS cloud products:
  - comparisons of global properties with NCAR CAM3
  - comparisons of MODIS with POLDER and CALIPSO
  - collaboration with other groups working with MODIS data independently
- Use of MODIS cloud products to investigate tropical equatorial waves
- Improvements in deriving the single-scattering properties of aerosols and ice clouds:
  - new habits: hollow bullet rosettes, aggregates of plates
  - improved computational models
  - ice models being used by many EOS sensor teams
  - dust models include nonspherical particles
- We studied the distribution and radiative forcing of tropical “thin” cirrus clouds.