1757

Atmos. Chem. Phys. Discuss., 9, 1757–1796, 2009 www.atmos-chem-phys-discuss.net/9/1757/2009/ © Author(s) 2009. This work is distributed under the Creative Commons Attribution 3.0 License.

This discussion paper is/has been under review for the journal *Atmospheric Chemistry and Physics (ACP)*. Please refer to the corresponding final paper in *ACP* if available.

# Influence of ice particle model on retrieving cloud optical thickness from satellite measurements: model comparison and implication for climate study

Z. Zhang<sup>1</sup>, P. Yang<sup>1</sup>, G. Kattawar<sup>2</sup>, J. Riedi<sup>3</sup>, L. C. Labonnote<sup>3</sup>, B. Baum<sup>4</sup>, S. Platnick<sup>5</sup>, and H.-L. Huang<sup>4</sup>

<sup>1</sup>Department of Atmospheric Sciences, Texas A&M University, College Station, TX, USA <sup>2</sup>Department of Physics, Texas A&M University, College Station, TX, USA <sup>3</sup>Laboratoire d'Optique Atmosphérique – Université des Sciences et Technologies de Lille/CNRS, Villeneuve d'Ascq Cedex, France



Atmospheric

and Physics

Discussions

Chemistry

9, 1757–1796, 2009

Ice particle model and cloud optical thickness retrieval





 <sup>4</sup>Space Science and Engineering Center – University of Wisconsin-Madison, Madison, WI, USA
 <sup>5</sup>NASA/Goddard Space Flight Center, Greenbelt, Maryland, USA

Received: 31 October 2008 - Accepted: 8 January 2009 - Published: 20 January 2009

Correspondence to: Z. Zhang (zzbatmos@ariel.met.tamu.edu)

Published by Copernicus Publications on behalf of the European Geosciences Union.

#### **ACPD**

9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval





#### Abstract

The influence is investigated of the assumed ice particle microphysical and optical model on inferring ice cloud optical thickness ( $\tau$ ) from satellite measurements of the Earth's reflected shortwave radiance. Ice cloud  $\tau$  are inferred, and subsequently com-

- <sup>5</sup> pared, using products from MODIS (MODerate resolution Imaging Spectroradiometer) and POLDER (POLarization and Directionality of the Earth's Reflectances). POLDER  $\tau$  values are found to be substantially smaller than those from collocated MODIS data. It is shown that this difference is caused primarily by the use of different ice particle bulk scattering models in the two retrievals, and more specifically, the scattering phase
- function. Furthermore, the influence of the ice particle model on the derivation of ice cloud radiative forcing (CRF) from satellite retrievals is studied. Three sets of short-wave CRF are calculated using different combinations of the retrieval and associated ice particle models. It is shown that the uncertainty associated with an ice particle model may lead to two types of errors in estimating CRF from satellite retrievals. One
- stems from the retrieval itself and the other is due to the optical properties, such as the asymmetry factor, used for CRF calculations. Although a comparison of the CRFs reveals that these two types of errors tend to cancel each other, significant differences are still found between the three CRFs, which indicates that the ice particle model affects not only optical thickness retrievals but also CRF calculations. In addition to CRF, the
- <sup>20</sup> effect of the ice particle model on the derivation of seasonal variation of  $\tau$  from satellite measurements is discussed. It is shown that optical thickness retrievals based on the same MODIS observations, but derived using different assumptions of the ice particle model, can be substantially different. These differences can be divided into two parts. The first-order difference is mainly caused by the differences in the asymmetry factor.
- The second-order difference is related to seasonal changes in the sampled scattering angles and therefore dependent on the sun-satellite viewing geometry. Because of this second-order difference, the use of different ice particle models may lead to a different understanding of the seasonal variation of  $\tau$ .

#### **ACPD**

9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval





#### 1 Introduction

Ice clouds cover about 20% of the Earth's surface (Wang et al., 1996; Wylie and Menzel, 1999; Sassen et al., 2008). They interact strongly with both solar and infrared radiation fields, and therefore can exert a significant influence on the radiative energy bud-

- get and thermal structure of the Earth-atmosphere system (Liou, 1986; Ramaswamy and Ramanathan, 1989; Fu and Liou, 1993; Lohmann and Roeckner, 1995). However, our understanding of this role is very limited. The current generation of climate models still exhibits a large range in ice cloud climatology and radiative forcing estimates (Zhang et al., 2005). The sign and magnitude of cloud feedbacks remains very uncertain (Bony et al., 2006). The need for a better understanding of ice clouds is evident.
- To meet this need, continuous global observations of ice clouds from satellite-based instruments are indispensable.

Despite the substantial efforts and significant progress made over the last decade, reliable retrieval of ice cloud properties from remotely sensed measurements still re-

- <sup>15</sup> mains a challenge owing to the complex nature of ice cloud particles. As revealed by the photos of ice particles, their sizes range from microns to millimeters and their habits (or shapes) vary from simple pristine hexagonal columns and plates to highly irregular aggregates and polycrystals (Weickmann, 1947; Heymsfield et al., 2002a, 2003). This makes the development of ice particle models that quantitatively replicate the micro-
- <sup>20</sup> physical and associated optical properties of ice particles very difficult. Over the last two decades, several major ice cloud measurement campaigns have been carried out (Cox et al., 1987; Jensen et al., 2004). Based on the in-situ and remotely-sensed data obtained from these campaigns, a number of ice particle models have been developed and used for ice cloud retrievals (McFarquhar and Heymsfield, 1996; Labonnote et al.,
- 25 2000; Baum et al., 2005). Unfortunately, as will be shown hereafter, these models generally differ substantially from one another. This indicates the existence of large uncertainty in ice cloud retrievals associated with ice particle model. Although the effect of this uncertainty depends on what kind of ice cloud property is retrieved and the

#### **ACPD**

9, 1757–1796, 2009

#### Ice particle model and cloud optical thickness retrieval





method used for retrieval, it is usually an important source of error in ice cloud retrievals (Comstock et al., 2007).

Optical thickness ( $\tau$ ) is one of the most important radiative properties of clouds. It plays a key role in determining cloud radiative forcing (CRF) (Fu and Liou, 1993; <sup>5</sup> Jensen et al., 1994; Fu, 1996; Fu et al., 1998; McFarquhar et al., 2000). A popular method to retrieve cloud  $\tau$  relies on satellite measurements of the Earth's reflected shortwave radiance (King, 1987; Nakajima and King, 1990; Minnis et al., 1993) (Hereafter it is referred to as the "solar reflective method"). It has been employed in the retrieval algorithms of several satellite instruments, such as the Advanced Very High Resolution Radiometer (AVHRR) (Heidinger et al., 2005), Spinning Enhanced Visible 10 and Infrared Imager (SEVIRI) (Roebeling et al., 2006), MODIS (Platnick et al., 2003) and POLDER (Buriez et al., 2005). The future Visible Infrared Imaging Radiometer Suite (VIIRS) that will fly on NPOESS (National Polar-Orbiting Environmental Satellite System) (Miller et al., 2006) and the Advanced Baseline Imager planed to fly on the Geostationary Operational Environmental Satellite-R Series (GOES-R) (Schmit et 15 al., 2005) may also adopt this method for their operational cloud  $\tau$  retrievals. Cloud products from these sensors will continue the satellite record useful for climate studies.

Although the principle behind the "solar reflective method" is simple (i.e., the cloud reflectance varies with optical thickness in the shortwave region), many factors may in-

- fluence the retrievals results. For example, several studies have shown that the use of different ice particle models in the method might lead to substantially different retrieval results (Mishchenko et al., 1996; Knap et al., 2005; Yang et al., 2007, 2008). In addition, the spatial resolution, the characteristics of instrument and the implementation of the algorithm may also influence the retrieval. As a result, different satellite sensors
- <sup>25</sup> may produce different  $\tau$  retrievals for the same cloud. Such differences complicate our understanding of the climatic role of ice clouds due to the fact that satellite retrievals are now widely used, for example, to derive cloud climatologies (Rossow and Schiffer, 1999; Karlsson, 2003) and compare with GCM simulations (Zhang et al., 2005). Therefore, a study of the influences of the above factors, especially the ice particle model in

### ACPD 9, 1757-1796, 2009 Ice particle model and cloud optical thickness retrieval Z. Zhang et al. **Title Page** Introduction Abstract Conclusions References **Tables Figures** ►T. Back Close Full Screen / Esc **Printer-friendly Version**

Interactive Discussion



ice cloud  $\tau$  retrieval would help us to understand the differences of ice  $\tau$  retrievals from different sensors and may improve our understanding of ice clouds. Moreover, such a study may also provide some guidance for establishing a long-term climatology of ice cloud  $\tau$  from the retrievals provided by different satellite sensors.

- Motivated by the above considerations, the primary objective of this study is to in-5 vestigate the influence of ice particle model on ice cloud  $\tau$  retrieval in comparison with other factors. To achieve this goal, we compare the collocated retrievals from the MODIS-Aqua and the POLDER onboard PARASOL. We address the following questions through the comparison. How different is the operational MODIS ice cloud  $\tau$  re-
- trieval from that of POLDER? What are the possible reasons for the differences? What 10 is the influence of ice particle model? We will also discuss the potential implications for climate studies. We ask the questions: How, and to what extent, does the uncertainty associated with ice particle model impact our understanding of the climatology and radiative effects of ice clouds?
- This paper is organized as follows. In Sect. 2 we discuss the differences between 15 MODIS and POLDER ice cloud  $\tau$  retrieval algorithms, with a special emphasis on the difference in ice particle models. In Sect. 3 we first compare the MODIS and POLDER ice cloud  $\tau$  retrieval and then investigate the role of ice particle model among other reasons in causing the difference. Potential implications for climate studies are discussed
- in Sect. 4 and the paper is summarized in Sect. 5. 20

#### 2 MODIS and POLDER ice optical thickness retrieval algorithms

As mentioned in the introduction, both MODIS and POLDER use a solar reflective method for their operational cloud  $\tau$  retrieval. Specifically, the bands centered around  $0.86-\mu m$  (hereafter referred to as the "0.86- $\mu m$  band") are used in both algorithms for retrieval over ocean. The bi-directional cloud reflection function (R) observed by

### ACPD 9, 1757-1796, 2009 Ice particle model and cloud optical thickness retrieval Z. Zhang et al. **Title Page** Introduction Abstract Conclusions References **Tables Figures** ►T. Back Close Full Screen / Esc **Printer-friendly Version**

Interactive Discussion



satellites in the 0.86- $\mu$ m band is defined as follows (Liou, 2002):

$$R(\tau, \omega, P_{11}, \theta_0, \theta_v, \phi_v - \phi_0) = \frac{\pi I(\theta_v, \phi_v)}{F_0 \cos(\theta_0)},$$

where  $\omega$  and  $P_{11}$  are the bulk-scattering albedo and phase function of cloud particles, respectively;  $\theta_0$  and  $\phi_0$  ( $\theta_v$  and  $\phi_v$ ) are the zenith and azimuthal angles of solar incidence (satellite-viewing direction), respectively;  $F_0$  denotes the solar flux density and *I* denotes radiance observed by satellite. Based on Eq. (1),  $\tau$  is retrieved in practice usually using a so-called look-up table (LUT) (King et al., 1997) that specifies the relationship between *R* and  $\tau$ . Because ice absorption is minimal in the 0.86- $\mu$ m band,  $\omega$  is essentially unity. As a result, for a given  $\tau$  and sun-satellite-viewing geometry the LUT depends solely on  $P_{11}$ , which in turn depends sensitively on the microphysical properties of ice particles, such as their sizes and shapes. For this reason, the ice particle model has a significant influence on the retrieval.

An ice particle model advanced by Baum et al. (2005) (hereafter referred to as the "Baum05 model") is employed in the MODIS operational retrieval algorithm, while POLDER retrieval is based on a so-called IHM (Inhomogeneous Hexagonal Monocrystal) model (Labonnote et al., 2001). The two models are substantially different in many aspects. First, the Baum05 model is primarily based on the use of in-situ observations of ice particle sizes and habits to compute optical properties for a realistic ensemble of theoretical particles. The IHM model has been developed by comparing theoretical

- <sup>20</sup> models to direct measurements of the average BRDF (Bi-directional Reflection Distribution Function) of ice clouds as observed by POLDER. Secondly, ice clouds may have different effective radii ( $r_e$ ) in the Baum05 model, while in the IHM model only one effective radius (30  $\mu$ m) is assumed for all ice clouds. Thirdly, ice particles are assumed to have similar shapes in the IHM model (i.e., hexagonal column with internal air bub-
- $_{25}\,$  bles). The Baum05 categorizes ice particles into six habits and uses a size-dependent habit distribution to simulate the variation of ice particle habits with size. For example, ice particles smaller than 60  $\mu m$  are assumed to be 100% droxtal (Yang et al., 2003; Zhang et al., 2004), and a mixture of 15% bullet rosettes, 50% solid hexagonal columns



(1)



and 35% hexagonal plates is assumed for particles within 60 to  $1000 \,\mu$ m. Finally, all ice particle habits in the Baum05 model have smooth surfaces and no inclusions of air bubbles or aerosol particles, while the IHM model assumes that all ice particles contain many randomly distributed small air bubbles inside.

<sup>5</sup> Because of the above differences in ice particle microphysics, the two models have substantially different  $P_{11}$ . Figure 1 shows the  $P_{11}$  in the 0.86- $\mu$ m band based on the Baum05 model with  $r_e$ =30  $\mu$ m (solid line) and the IHM model (dashed line) as a function of scattering angle. In the Baum05  $P_{11}$ , several pronounced scattering features are clearly visible. At scattering angles between 0° to 60°, which are particularly important for ground-based observations, the most marked features are the two sharp peaks around the 22° and 46° (i.e., the halos). In the region important for satellitebased and airborne instruments (i.e., from about 60° to 180°), the features include a steep slope between about 120° and 140°, a moderate scattering peak near 156° and a sharp backscattering peak at 180°. Evidently from Fig. 1, the  $P_{11}$  based on the IHM 15 model is quite different. It is rather flat and featureless. Although the 22° peak still exists, it is substantially weakened.

Another important difference between Baum05 and IHM model is in the asymmetry factor (g), which indicates the ratio of forward-scattered to backward-scattered light (van de Hulst, 1957). Mathematically, g is defined as follows (Liou, 2002):

$$g = \frac{1}{2} \int_{-1}^{1} P_{11}(\cos \theta_s) \cos \theta_s d \cos \theta_s,$$

where  $\theta_s$  is the scattering angle  $(0 < \theta_s < \pi)$ . According to Baum05 model, the value of g of an ice cloud with a  $r_{\theta}$  of 30  $\mu$ m in the 0.86- $\mu$ m band is 0.8336, while the corresponding value of the IHM model is 0.7665.

Since the differences between the two  $P_{11}$  are substantial, it is worth explaining the physics causing such differences. Numerical scattering simulations have shown that scattering features, such as those in the Baum05  $P_{11}$ , are generated by two or more photon reflections or refractions at the faces of hexagonal prisms (Takano and Liou,

#### **ACPD**

9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval

Z. Zhang et al.



(2)



1989). In the Baum05 model, a large portion of ice particles is assumed to be pristine hexagonal columns and plates. As a result, the scattering features associated with these particles, for example the 22° and 46° halos, remain pronounced even after averaging over particle habit distribution. In the case of the IHM model, however, the interactions between the randomly distributed small air bubbles and incident photons make the paths of photons much less organized, which substantially reduces or even smoothes out the scattering peaks leading to a flat and featureless  $P_{11}$  (Labonnote et al., 2001). Air bubble inclusion also plays an important role in causing the difference in *g* between the two models, for it is known that non-absorbing inclusions, such as air bubbles, reduces forward-scattering and increases the side and back-scattering (Macke et al., 1996a). Both fractal and roughened surfaces can also have effects on the scattering properties of ice particles similar to air bubble inclusion, i.e., smoothing out scattering features and reducing the asymmetry factor (Macke et al., 1996b; Yang

- et al., 2008).
   Besides the difference in the chosen ice particle model, MODIS and POLDER algorithms are also different in three major respects: First, MODIS retrieves cloud optical thickness at the resolution of 1×1 km<sup>2</sup> (Platnick et al., 2003). Although POLDER has a "full-resolution" of about 6×6 km<sup>2</sup>, cloud optical thickness is retrieved at the resolution of "superpixel", which is about 18×18 km<sup>2</sup>, composed of 3×3 full-resolution pixels
- <sup>20</sup> (Buriez et al., 2005). In practice, radiances of  $3 \times 3$  full-resolution pixels are first aggregated to the resolution of superpixel and then cloud optical thickness corresponding to superpixels is retrieved on the basis of the aggregated radiance. The resolutions of MODIS and POLDER products involved in this study are listed in Table 1. Secondly, the wide spectral coverage of MODIS enables it to retrieve the  $r_e$  of ice clouds from obser-
- vations in the near-infrared ice-absorbing bands, such as the 1.64 and 2.13  $\mu$ m bands, using the method developed by Nakajima and King (1990). In contrast, the spectral coverage of POLDER ranges from 0.443 to 0.910  $\mu$ m. The absorption of ice in this region is weak, thus POLDER lacks the capability to retrieve  $r_e$ . This is the reason why all ice clouds are assumed to have the same  $r_e$  of 30  $\mu$ m in POLDER retrieval. Note that

#### **ACPD**

9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval





because  $P_{11}$  and therefore cloud reflectance are dependent on  $r_e$ , the treatment of  $r_e$  may impact  $\tau$  retrieval. Finally, MODIS is a scanner that makes observation and therefore retrieves  $\tau$  of a given pixel in a single direction (Platnick et al., 2003). However, POLDER performs measurements in multiple directions. It first retrieves cloud optical thickness in all available directions and then a directionally averaged optical thickness is derived from the multi-directional retrievals (Buriez et al., 2005).

#### 3 Comparison of ice cloud optical thickness

In this section, we first compare the MODIS and POLDER ice cloud  $\tau$  retrievals. Then, we investigate the relevance of differences in retrieval algorithms described in the last section to the differences in ice optical thickness revealed by the comparison.

#### 3.1 Case selection and collocation

5

An Aqua MODIS granule over Central America on 22 July 2007 is selected for the comparison. Figure 2 shows the false-color image of this granule. The image was constructed by contrast stretching and combining three different MODIS bands as<sup>15</sup> signed to red, green and blue channels (RGB), respectively. To obtain contrast between ocean, land, low-level water clouds and high-level ice clouds, the RGB assignment is as follows: reflectances in the 0.66-µm and 0.86-µm bands are in red and green, respectively and 11-µm brightness temperature (gray flipped) is in blue. In this color scheme, ocean is dark; land surface is green; ice clouds generally have a whitish cast
<sup>20</sup> (although cirrus may appear bluish); and low-level water clouds appear somewhat yellowish green. Cloud evolution observations from geostationary satellites (not shown here) indicate that a deep convective system developed early to the south of Panama had dissipated, leaving behind the anvil clouds that cover the center of the granule. To the northeast of the anvils along the coast of Columbia is another convective system

<sup>25</sup> at its later stage. The granule in Fig. 2 is selected because it contains a variety of





ice clouds, from thin cirrus at the edge of a deep convection system to thick anvils. Another consideration is that data from NASA's TC<sup>4</sup> (Tropical Composition, Cloud and Climate Coupling) mission, which was conducted in July and August of 2007 over Central America, will provide valuable information for future study.

- An important step before the comparison is the collocation of MODIS and POLDER retrievals. Both the level-2 operational cloud products and level-1 geolocated radiance products have been collocated using a data fusion system developed by Laboratoire d'Optique Atmospherique (France). The collocation is made at the POLDER full resolution (6×6 km<sup>2</sup>). The resolutions of the MODIS and POLDER products involved in the collocation are listed in Table 1. The objective of the collocation is to obtain two sets of cloud properties or radiances for each collocated pixel, one corresponding to MODIS and the other corresponding to POLDER retrieval. Further details follow.
  - 1. Level-1 radiance collocation. To collocate MODIS and POLDER level-1 geolocated radiance products, MODIS level-1 pixels  $(1 \times 1 \text{ km}^2)$  are first collocated to POLDER full resolution pixels  $(6 \times 6 \text{ km}^2)$ . Then the radiances from MODIS pixels within each POLDER full resolution pixel are averaged to obtain a mean and standard deviation values for the collocation  $(6 \times 6 \text{ km}^2)$ .

15

20

25

2. Level-2 cloud product collocation. The level-2 collocation consists of two steps. In the first step, POLDER full-resolution pixels ( $6 \times 6 \text{ km}^2$ ) are collocated to the POLDER super-pixels ( $18 \times 18 \text{ km}^2$ ). Cloud properties from POLDER level-2 cloud product ( $18 \times 18 \text{ km}^2$ ) are assigned each collocated full-resolution pixel. Note that, if two full-resolution pixels are within the same super-pixel, the same cloud properties will be assigned to them. This process can be seen as a nearest pixel extrapolation of level 2 products to level 1 resolution. In the second step, MODIS cloud  $\tau$  retrievals ( $1 \times 1 \text{ km}^2$ ) are first collocated to POLDER full-resolution pixels. Then, within each POLDER full-resolution pixel, cloud properties from MODIS cloud product are averaged over all MODIS pixels to obtain a new set of cloud properties. Therefore, after the collocation, each POLDER full-resolution pixel

ACPD				
9, 1757–1796, 2009				
Ice particle model and cloud optical thickness retrieval Z. Zhang et al.				
Title	Page			
Abstract	Introduction			
Conclusions	References			
Tables Figures				
I	۶I			
•	•			
Back	Close			
Full Screen / Esc				
Printer-friendly Version				
Interactive Discussion				



has two sets of cloud properties, one from POLDER RB2 and one from MODIS MOD06 cloud product. Note that the extrapolation of POLDER RB2 product to full resolution may introduce some random deviation for the comparison to MODIS products. It will however not bias correlation between the two dataset since average values are conserved.

The differences between MODIS and POLDER cloud top thermodynamic phase retrieval fall out of the scope of this study but interested readers are referred to Riedi et al. (2007). We choose only those pixels identified as ice clouds by both MODIS and POLDER for  $\tau$  comparisons.

#### 10 3.2 Comparison results and discussion

5

Figure 3 shows a scatterplot of pixel-to-pixel comparison of collocated MODIS ( $\tau^{\text{MODIS}}$ ) and POLDER ( $\tau^{\text{POLDER}}$ ) ice  $\tau$  retrievals for the granule shown in Fig. 2. It is first noted from Fig. 3 that  $\tau^{\text{MODIS}}$  is in good correlation with  $\tau^{\text{POLDER}}$ . However, it is evident that  $\tau^{\text{POLDER}}$  is substantially smaller than  $\tau^{\text{MODIS}}$ . To understand the differences between  $\tau^{\text{POLDER}}$  and  $\tau^{\text{MODIS}}$  quantitatively, we calculated the probability density function (PDF) and the cumulative distribution of  $\tau^{\text{POLDER}}/\tau^{\text{MODIS}}$ . They are plotted as the solid lines in Fig. 4a and b, respectively. The PDF of  $\tau^{\text{POLDER}}/\tau^{\text{MODIS}}$  is defined as the fraction of pixels with certain value of  $\tau^{\text{POLDER}}/\tau^{\text{MODIS}}$ . The maximum value of PDF has been normalized to unity. It is interesting to note that the PDF of  $\tau^{\text{POLDER}}/\tau^{\text{MODIS}}$  seems to follow the Log-Normal distribution, i.e.,

$$\log_{10}\left(\frac{\tau^{\text{POLDER}}}{\tau^{\text{MODIS}}}\right) \sim N(\mu, \sigma^2).$$
(3)

The median value of  $\tau^{\text{POLDER}}/\tau^{\text{MODIS}}$  is 0.68. The black line in Fig. 3 corresponds to 0.68 $\tau^{\text{MODIS}}$ , which apparently fits POLDER retrievals fairly well. The PDF of  $\tau^{\text{POLDER}}/\tau^{\text{MODIS}}$  indicates that for half of total pixels  $\tau^{\text{POLDER}}$  is smaller than  $\tau^{\text{MODIS}}$ 

9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval





by more than about 30%. The cumulative distribution of  $\tau^{\text{POLDER}}/\tau^{\text{MODIS}}$  in Fig. 4b at unity is close to 80%. It indicates that  $\tau^{\text{POLDER}}$  is smaller than  $\tau^{\text{MODIS}}$ , (i.e.,  $\tau^{\text{POLDER}}/\tau^{\text{MODIS}} < 1$ ) for about 80% of the total pixels. The comparison reveals that there exists a substantial bias between MODIS and POLDER operational ice cloud  $\tau$  retrievals.

As discussed in Sect. 2, MODIS and POLDER ice  $\tau$  retrieval algorithms are different in several respects. Among these differences, the following three may significantly contribute to the bias between  $\tau^{\text{POLDER}}$  and  $\tau^{\text{MODIS}}$ . 1) Difference in retrieval resolution. It is well known that, due to cloud heterogeneity and the nonlinear dependence of cloud reflection on  $\tau$ , the average cloud reflection of a cloudy scene found by averaging reflection of independent pixels within the scene tends to be smaller than using the average cloud optical thickness in the scene (Cahalan et al., 1994; Oreopoulos and Davies, 1998). This difference is usually termed as the "plane-parallel albedo bias". As aforementioned,  $\tau^{\text{POLDER}}$  for each collocated pixel is from the POLDER level-2 product, in which cloud optical thickness is retrieved from cloud reflection measured at the resolution of  $18 \times 18 \text{ km}^2$ , while  $\tau^{\text{MODIS}}$  for each collocated pixel is an arithmetic mean of MODIS level-2 retrievals with spatial resolution of  $1 \times 1 \text{ km}^2$ . Therefore, the plane-parallel bias is a potential reason causing  $\tau^{\text{POLDER}}$  to be smaller than  $\tau^{\text{MODIS}}$ . 2) Difference in cloud effective radius. As aforementioned, MODIS retrieves  $r_e$ , while in

<sup>20</sup> POLDER retrieval the  $r_e$  of all ice clouds is assumed to be 30  $\mu$ m. This difference in the treatment of  $r_e$  may contribute to the bias between  $\tau^{\text{POLDER}}$  and  $\tau^{\text{MODIS}}$ , although according to the MODIS cloud product ice clouds in Fig. 2 have a mean  $r_e$  of 28.18  $\mu$ m. 3) Difference in ice particle model. As mentioned in the introduction, the ice particle model may significantly affect the retrieval results of the "solar reflective method", so the differences between the Baum05 and IHM model may be an important reason explaining the bias between  $\tau^{\text{POLDER}}$  and  $\tau^{\text{MODIS}}$ .

To identify the relative importance of the above three reasons, the following three experiments are conducted for the granule in Fig. 2. In experiment A, based on the

#### ACPD

9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval





Baum05 model with  $r_e$  assumed to be 30  $\mu$ m, ice cloud  $\tau$  is retrieved from the collocated MODIS radiances (6×6 km<sup>2</sup>). In experiment B, the retrieval is based on the IHM model and the collocated POLDER radiances (6×6 km<sup>2</sup>). Experiment C is the same as experiment B, except that it is based on the Baum05 model ( $r_e=30 \, \mu m$ ). The configurations of the three experiments are summarized in the Table 2. A Lambertian 5 surface has been assumed in all experiments. The surface reflectance is determined from the observations in the clear-sky region. Hereafter, the retrievals from these three experiments will be denoted as  $\tau^A$ ,  $\tau^B$  and  $\tau^C$ , respectively. The PDFs of  $\tau^B/\tau^A$  and  $\tau^{C}/\tau^{A}$  are shown in Fig. 4a and the corresponding cumulative distributions are shown in Fig. 4b. The statistics of  $\tau^{B}/\tau^{A}$  and  $\tau^{C}/\tau^{A}$  are listed in Table 3, together with those of 10  $\tau^{\text{POLDER}}/\tau^{\text{MODIS}}$ . Evidently,  $\tau^{B}/\tau^{A}$  shares quite similar statistics with  $\tau^{\text{POLDER}}/\tau^{\text{MODIS}}$ . This similarity indicates that the substantial bias between POLDER and MODIS retrievals remains largely unchanged, even if they are made at the same resolution and treat  $r_e$  in the same way in their algorithms (see Table 2). However, as indicated by the similarity between  $\tau^{C}$  and  $\tau^{A}$ , the bias between POLDER and MODIS ice  $\tau$  retrievals 15 disappears almost completely when the same ice particle model (i.e., the Baum05 model) is used in both retrievals.

The above results clearly show that the bias between MODIS and POLDER ice cloud au retrievals is primarily attributable to the use of different ice particle models in their algorithms. But why does POLDER retrieval tend to be smaller? The underlying physics 20 is as follows: It has been shown that cloud reflectivity is, generally speaking, inversely proportional to the asymmetry factor, q, of cloud particles (King, 1987; Stephens et al., 1990). Therefore, since the IHM model has a smaller q than the Baum05 model, an ice cloud is more reflective if it consists of IHM particles than Baum05 particles. In other words, from the perspective of retrieval, smaller (larger)  $\tau$  will be retrieved from



## ACPD 9, 1757-1796, 2009 Ice particle model and cloud optical thickness retrieval Z. Zhang et al. **Title Page** Introduction Abstract Conclusions References **Figures** ÞI



Full Screen / Esc

**Printer-friendly Version** 

Interactive Discussion

Back

#### 4 Climate implications

15

4.1 Implications for the derivation of cloud radiative forcing of ice clouds from satellite observations

Presently, satellite data are widely used in climate studies, for example to derive cloud
 and aerosol climatologies and compare with GCM simulations. However, satellite data must account for various uncertainties. For example, as indicated by the substantial difference between MODIS and POLDER retrieval, there may exist considerable uncertainties in satellite retrievals of ice cloud optical thickness. In this section, we address the question: How, and to what extent, does the uncertainty in satellite retrievals affect
 our understanding of the radiative effects of ice clouds?

An important parameter to measure cloud radiative effects is the cloud radiative forcing (CRF), which consists of two parts, the shortwave and longwave CRF. In this study we focus only on the shortwave CRF of ice clouds for a number of reasons, but primarily because both MODIS and POLDER retrieve cloud optical thickness using shortwave bands. Following Ramanathan, et al. (1989), the shortwave CRF of ice clouds, denoted as ( $F_{SW}$ ) hereafter, is defined as:

$$F_{\rm SW} = F_{\rm SW}^{\rm cloudy} - F_{\rm SW}^{\rm clear}, \tag{4}$$

where  $F_{SW}^{cloudy}$  and  $F_{SW}^{clear}$  denote the downward flux of shortwave radiation at the top of atmosphere (TOA) with and without the presence of ice clouds, respectively.

- <sup>20</sup> One way to derive CRF is to compute it from satellite-retrieved cloud properties using radiative transfer models. Figure 5a shows zonally-averaged Aqua MODIS level-3 monthly mean (i.e., MODIS product "MYD08\_M3") ice cloud optical thickness in the tropics as a function of latitude and month for the year 2007. Figure 5b shows the corresponding POLDER observations (i.e., POLDER product "RB3"). An important point
- to bear in mind is that both MODIS and POLDER are on board of polar-orbiting satellites and therefore their level-3 products are the average of "snapshots", rather than

9, 1757-1796, 2009

Ice particle model and cloud optical thickness retrieval





continuous observations. The two data sets agree largely on overall patterns. However, as expected, POLDER observations are substantially smaller than those from MODIS. Based on the MODIS observation in Fig. 5a and the Baum05 model, we compute the  $F_{SW}^{MODIS}$  using a radiation model developed by Chou et al. (1992). Similarly, we

- <sup>5</sup> compute the  $F_{SW}^{POLDER}$  based on the POLDER observations and the IHM model. For the purpose of comparison, another set of CRF,  $F_{SW}^{PB}$  is computed and is based on the combination of POLDER observations and the Baum05 model. In all computations, ice cloud effective radius is assumed as 30  $\mu$ m. The ice clouds are put in a layer between 175 and 225 hPa of a tropical atmosphere. It is important to point out that the diurnal
- <sup>10</sup> cycle and sunlight duration are not considered in the computation. Instead, the monthly mean solar zenith angle from MODIS level-3 product is used. Thus,  $F_{SW}^{MODIS}$ ,  $F_{SW}^{POLDER}$ and  $F_{SW}^{PB}$ , shown in Fig. 6, are instantaneous, rather than daily-averaged, CRF, because of this configuration and the above-mentioned nature of MODIS and POLDER level-3 products,
- <sup>15</sup> Inspection of Fig. 6 immediately reveals that  $F_{SW}^{MODIS}$  and  $F_{SW}^{POLDER}$  agree relatively well, while  $F_{SW}^{PB}$  is substantially weaker (less negative). Given the substantial difference between MODIS and POLDER retrievals, the relatively good agreement between  $F_{SW}^{MODIS}$  and  $F_{SW}^{POLDER}$  might appear somewhat surprising. However, it is fairly well known that the process of converting observed reflectance to optical thickness and then to cloud albedo does not have a strong dependence on the assumed microphysical model as long as a consistent model is used in both steps. From a given observed reflectance, we can derive two very different optical thicknesses by using two different microphysical ice models but still end up with two fairly close values of cloud albedo if
- the microphysical model is kept consistent in both steps. Similar albedo values would in
- <sup>25</sup> turn lead to relatively good agreement in the derived shortwave fluxes. In other words, this comparison illustrates that the uncertainty associated with the ice particle model impacts our understanding of the CRF of ice clouds much less than it does on satellite  $\tau$  retrievals. This is the reason for the relatively good agreement between  $F_{SW}^{MODIS}$  and

# ACPD 9, 1757–1796, 2009 Ice particle model and cloud optical thickness retrieval Z. Zhang et al.





 $F_{SW}^{POLDER}$ . More specifically we can describe the mechanism as follows. It is shown that the strength of shortwave CRF increases with  $\tau s$  but decreases with increasing g (Fu and Liou, 1993). Therefore, although  $\tau^{POLDER}$  is substantially smaller than  $\tau^{MODIS}$ , in radiative transfer computations this difference is largely canceled by the difference between the IHM and Baum05 model in g, which leads to similar estimates of CRF. This reason also explains why  $F_{SW}^{PB}$  is substantially weaker than both  $F_{SW}^{MODIS}$  and  $F_{SW}^{POLDER}$ . The combination of smaller  $\tau$  retrieval (i.e.,  $\tau^{POLDER}$ ) and larger g (i.e., that of the Baum05 model) eliminates the necessary condition for the above cancellation mechanism and therefore makes  $F_{SW}^{PB}$  substantially weaker. The above comparison again illustrates clearly the well established importance to use the same ice particle model in both retrieval and CRF computation.

Nevertheless, it needs to be stressed that the difference between  $F_{SW}^{MODIS}$  and  $F_{SW}^{POLDER}$  is still considerable. The former is significantly stronger for thin ice, while the latter is stronger for thick ice clouds. The significant difference between  $F_{SW}^{MODIS}$  and  $F_{SW}^{POLDER}$  makes it clear that different understandings of ice particle microphysics may lead not only to different ice cloud  $\tau$  retrievals but also to different estimates of the radiative effects of ice clouds. Therefore, further efforts are needed to improve our

understanding of the microphysical and optical properties of ice clouds.

15

20

25

4.2 Potential implications for the derivation of seasonal variation of ice optical thickness from satellite measurements

The selection of ice particle model is an important, yet difficult, issue in the development of retrieval algorithms for future sensors, such as the VIIRS that will fly on NPOESS. A question recently receiving increasing attention (Heymsfield et al., 2002b; Baran and Labonnote, 2006; Yang et al., 2008) is whether pristine ice particles with high-order regularity (e.g., hexagonal ice columns and ice bullet rosettes) or irregular ice particles (e.g., aggregates, ice crystals with rough surfaces or internal inclusions of air

## ACPD

9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval





bubbles) predominate in ice clouds. As shown in Fig. 1, highly irregular ice particles, such as the IHM model, tends to have featureless shortwave  $P_{11}$  and smaller g, while regular ice particles, such as those in the Baum05 model, tend to have  $P_{11}$  featured with pronounced scattering peaks and larger g. Although it is still controversial which assumption represents better the nature of ice clouds, it is important to understand what differences the two assumptions may make in ice optical thickness retrieval.

The importance of *g* in ice optical thickness retrieval and calculation of ice radiative forcing has been demonstrated in the comparison of MODIS and POLDER ice retrievals in Sect. 3, as well as in many previous studies (Stephens et al., 1990; Macke et al., 1996a; Mishchenko et al., 1996; Fu, 2007). However, only until recently has the influence of the pattern of  $P_{11}$  on ice optical thickness retrieval discussed (Labonnote et al., 2001; Knap et al., 2005; Baran and Labonnote, 2006). These studies have shown that optical thickness retrievals based on different ice scattering phase functions differ substantially. More importantly, they found that the magnitude of the difference is de-15 pendent on the scattering angle ( $\theta_s$ ) specified by the sun-satellite viewing geometry as follows:

$$\cos\theta_s = \cos(\pi - \theta_0)\cos\theta_v + \sin\theta_0\sin\theta_v\cos(\phi_v - \phi_0)$$

here the definitions of  $\theta_0$ ,  $\theta_v$ ,  $\phi_0$ ,  $\phi_v$  are the same as those in Eq. (1). To illustrate the above point, two sets of ice optical thickness retrievals were performed for the granule in Fig. 2 from MODIS observations. The Baum05 model was used in one retrieval, the IHM model in the other. Hereafter, the two retrievals will be referred to as  $\tau^{\text{Baum05}}$  and  $\tau^{\text{IHM}}$ , respectively. Figure 7a shows  $\tau^{\text{IHM}}/\tau^{\text{Baum05}}$  as a function of  $\theta_s$ . Note that each point in Fig. 7a corresponds to an ice cloud pixel in the granule. Two features in Fig. 7a are quite intriguing. First of all, the ratio is substantially smaller than unity, which, as stated before, is largely attributed to the difference in asymmetry factor between the IHM and Baum05 model. Secondly, and more importantly here, it is evident that the difference between  $\tau^{\text{IHM}}$  and  $\tau^{\text{Baum05}}$  is a strong function of  $\theta_s$ . For example, the ratio increases about 10% as  $\theta_s$  increases from about 120° to 140°.



(5)

Interactive Discussion



One may notice that the angular pattern of  $\tau^{\text{IHM}}/\tau^{\text{Baum05}}$  in Fig. 7a closely resembles that of  $P_{11}^{\text{Baum05}}/P_{11}^{\text{IHM}}$  in Fig. 7b. Several previous studies have also noticed such resemblance (Labonnote et al., 2001; Knap et al., 2005; Baran and Labonnote, 2006). However, the reason behind this resemblance still remains unexplained. We suggest that the resemblance can be explained by the physics schematically shown in Fig. 8.

- Because of the diffraction, the shortwave scattering phase function of ice particles usually has a strong peak in the forward direction, i.e.,  $\theta_s = 0^\circ$  (Macke et al., 1995; Yang and Liou, 1996). As a consequence, the possibility of a photon being scattered in the forward direction by an ice particle is much larger than that of being scattered in the
- <sup>10</sup> side or back direction, i.e.,  $\theta_s > 90^\circ$ . An implication of this is that, within thin ice clouds, the occurrence probability of photons following the "Path A" in Fig. 8 is much larger than that of other paths, such as the "Path B" in Fig. 8. It is because in "Path A" backscattering happens only one time, while multiple times of side or backscattering must happen if a photon travels along any other path. As clouds become thicker, the contributions
- <sup>15</sup> to cloud reflectance from photons following the "Path B" increase. However, there are still considerable amount of photons that follow the "Path A". Because these photons going through the "Path A" carry the information of  $P_{11}$ , the bi-directional reflectances and therefore the retrieved optical thickness of ice clouds are correlated to the  $P_{11}$  of the ice particles.
- <sup>20</sup> In the remainder of this section, we will elucidate a potential implication of this  $\theta_s$ dependent difference between  $\tau^{\text{Baum05}}$  and  $\tau^{\text{IHM}}$  in deriving the seasonal variations of ice cloud optical thickness from observations of instruments like MODIS and VIIRS. These instruments perform nadir-viewing, cross-track scanning for data sampling (Salomonson et al., 1989; Miller et al., 2006). This scanning pattern is independent of season. As a result, the seasonal cycle of the sun-satellite viewing geometry and the corresponding  $\theta_s$  are largely determined by the position of the sun. As schematically illustrated in Fig. 9a,  $\theta_s$  increases as solar zenith angle ( $\theta_0$ ) decreases from winter to summer and then decreases as the sun returns to its winter position. This seasonal dependence of MODIS  $\theta_s$  is clearly seen in Fig. 9b which shows the map of zonal and





monthly mean MODIS  $\theta_s$ , derived from MODIS level-3 product, as a function of latitude and month.

- The seasonal dependence of MODIS  $\theta_s$  and the aforementioned dependence of  $\tau^{\text{IHM}}/\tau^{\text{Baum05}}$  on  $\theta_s$  together have an intriguing implication. That is, the difference between  $\tau^{\text{IHM}}$  and  $\tau^{\text{Baum05}}$  tends to be statistically smaller (the ratio  $\tau^{\text{IHM}}/\tau^{\text{Baum05}}$  is closer to unity) in summer than in winter. This indicates that the use of different ice particles models or, more specifically, different scattering phase functions may lead to different results for the seasonal variation of ice cloud optical thickness. This implication is further illustrated in the following theoretical example. In this example, we consider a MODIS granule at the latitude of 15° N. We assume that this granule is overcast by ice clouds with the same optical thickness and effective radius. We further assume that the scattering properties of these ice clouds follow the IHM model. In other words,
- if the MODIS retrieval algorithm were based on the IHM model, the retrieved optical thickness would be close to the assumed value, i.e.,  $\tau^{\text{IHM}}$ . We then retrieve  $\tau^{\text{Baum05}}$  for
- <sup>15</sup> this granule at different months of the year based on the Baum05 model. The monthly mean solar zenith and azimuthal angles from MODIS level 3 data are used to specify the position of the sun in the retrieval. The MODIS viewing geometry is assumed to be independent of season and specified using the sensor zenith and azimuthal angles from level 1 data. The relative differences between the retrieved  $\tau^{\text{Baum05}}$  (averaged over the granule) and the assumed  $\tau^{\text{IHM}}$  at different values of  $\tau^{\text{IHM}}$  are shown in Fig. 10
- as a function of month. It is interesting to note that the difference between  $\tau^{\text{Baum05}}$  and  $\tau^{\text{IHM}}$  can be divided into two parts. To the first order,  $\tau^{\text{Baum05}}$  is substantially larger than  $\tau^{\text{IHM}}$ . As discussed earlier, this is caused by the difference in asymmetry factor between the IHM and Baum05 model. Secondly, and more importantly in this context, the difference shows a significant seasonal pattern.  $\tau^{\text{Baum05}}$  retrieval is larger in
- winter than summer. This second-order difference is observed in all cases and quite considerable when the cloud is thin. The above example has shed some light on a potential uncertainty in deriving ice cloud optical thickness from satellite instruments like MODIS and the future VIIRS on NPOESS. That is, the use of different ice bulk scatter-

9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval





ing models may lead to different understandings of the seasonal variation of ice cloud optical thickness. To our knowledge, this uncertainty has not been discussed before in literature. It again reminds us the importance of improving our understanding of the microphysics of ice particles and is worthy of attention when we develop the ice optical

thickness retrieval algorithms for the future satellite instruments. However, one cannot draw strong conclusions based on a single example. Further study is warranted to confirm the existence of such uncertainty in the real retrieval and comprehend its impact on our understanding of ice clouds and potentially the climate.

A final consideration from these results is that observing instruments with multi-angle viewing capability such as POLDER, MISR (Multiangle Imaging SpectroRadiometer) or AATSR (Advance Along Track Scanning Radiometer) will be less affected by this source of uncertainty since they tend to provide a more extensive and homogeneous sampling of scattering angle and thus phase function over all seasons. Future studies could investigate if a combination of POLDER and MODIS observation can help reduce the uncertainties in the seasonal cycle determination of ice cloud properties.

5 Summary and discussion

20

In this paper, we have been mainly concerned with the influences of two very different ice particle microphysical and optical models on the resulting optical thickness retrievals from satellite measurements of solar reflection. We assessed the influences by comparing the retrievals based on two different ice particle models, the Baum05 and the IHM model. We also studied the implications of the comparisons for climate studies. Our main findings are: 1) The ice cloud optical thickness retrieval from POLDER is substantially smaller than that from MODIS. This difference may be attributed primarily to the difference of asymmetry factor between the Baum05 and the IHM models. 2)

<sup>25</sup> Different assumptions of the ice particle models may lead not only to different optical thickness retrievals but also to significantly different estimates of the shortwave CRF of ice clouds. 3) In CRF computations the difference in ice cloud optical thickness re-





trievals tends to be offset by the difference in optical properties (such as the asymmetry factor) of ice clouds. 4) The use of different ice cloud bulk scattering models may lead to different results for the seasonal variation of ice cloud optical thickness. In summary, the above findings indicate that ice cloud optical thickness retrievals based on satellite

<sup>5</sup> measurements of solar reflection are highly sensitive to the choice of the ice particle model assumed in the retrieval. This sensitivity makes our inadequate knowledge of the microphysics of ice particles the main source of uncertainty in optical thickness retrievals. Therefore, to improve our understanding of the role of ice clouds in the climate, we must continue to improve our understanding of the microphysical and optical properties of ice particles.

Finally, our findings suggest that the lack of a common base to interpret satellite measurements is a great obstacle for establishing a long-term climatology of ice cloud properties from multiple satellite missions. Many satellite instruments, such as the AVHRR, MODIS, POLDER and the future VIIRS and GOES-R sensors, retrieve ice cloud optical thickness from the measurements of their solar-reflective bands. We note that at the time of this writing, the PATMOS-x climatology (based on AVHRR; Heidinger et al., 2005) and MODIS use the Baum05 models. However, a common

- set of models has not been defined or advocated for use by every sensor. Because the ice particle models used in operational retrievals are usually different from one another, a direct combination of the resulting products into a climatology would be almost meaningless. We therefore suggest that a set of existing or newly developed
- ice particle models should be used as the common basis to derive a climatology of ice cloud optical thickness from satellite measurements. A goal is to provide a consistent way to interpret satellite-based decadal measurements, so that comparable retrievals can be derived from different satellite missions and a long-term record of ice cloud
- can be derived from different satellite missions and a long-term record of ice cloud optical thickness can be established for climate studies.

Acknowledgements. The authors wish to thank F. Thieuleux (USTL/CNRS) for his help in development of POLDER/MODIS merging software. This study was supported by NASA (NNG04GL24G and NNX08AF68G) and partly by the National Science Foundation (ATM-

#### **ACPD**

9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval





0239605) Bryan Baum's research is supported by NASA grant NNX08AF81G and NOAA cooperative agreement NA06NES4400002. George Kattawar's research is supported by the Office of Naval Research under the contract N00014-06-1-0069.

#### References

- 5 Baran, A. J. and Labonnote, L. C.: On the reflection and polarisation properties of ice cloud, J. Quant. Spectrosc. Ra., 100, 41-54, 2006.
  - Baum, B., Yang, P., Heymsfield, A., and Thomas, S.: Bulk Scattering Properties for the Remote Sensing of Ice Clouds. Part I: Microphysical Data and Models, J. Appl. Meteorol., 44, 1885-1895, 2005,
- 10 Bony, S., Colman, R., Kattsov, V. M., Allan, R. P., Bretherton, C. S., Dufresne, J.-L., Hall, A., Hallegatte, S., Holland, M. M., Ingram, W., Randall, D. A., Soden, B. J., Tselioudis, G., and Webb, M. J.: How Well Do We Understand and Evaluate Climate Change Feedback Processes?, J. Climate, 19, 3445-3482, 2006.
  - Buriez, J. C., Parol, F., Cornet, C., and Doutriaux-Boucher, M.: An improved derivation of
- the top-of-atmosphere albedo from POLDER/ADEOS-2: Narrowband albedos, J. Geophys. 15 Res., 110, D05202, doi:05210.01029/02004JD005243., 2005.
  - Labonnote, L., Brogniez, G., Doutriaux-Boucher, M., Buriez, J. C., Gayet, J. F., and Chepfer, H.: Modeling of light scattering in cirrus clouds with inhomogeneous hexagonal monocrystals. Comparison with in-situ and ADEOS-POLDER measurements, Geophys. Res. Lett., 27, 113–116, 2000.
- 20

25

Labonnote, L., Brogniez, G., Buriez, J. C., Doutriaux-Boucher, M., Gayet, J. F., and Macke, A.: Polarized light scattering by inhomogeneous hexagonal monocrystals: Validation with ADEOS-POLDER measurements, J. Geophys. Res., 106, 12139–12155, 2001.

Cahalan, R. F., Ridgway, W., Wiscombe, W. J., Bell, T. L., and Snider, J. B.: The Albedo of Fractal Stratocumulus Clouds, J. Atmos. Sci., 51, 2434–2455, 1994.

- Chou, M. D.: A Solar Radiation Model for Use in Climate Studies, J. Atmos. Sci., 49, 762–772. 1992.
- Comstock, J. M., d'Entremont, R., DeSlover, D., Mace, G. G., Matrosov, S. Y., McFarlane, S. A., Minnis, P., Mitchell, D., Sassen, K., and Shupe, M. D.: An Intercomparison of Microphysical

#### ACPD

9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval

Title Page			
Abstract	Introduction		
Conclusions	References		
Tables	Figures		
•	•		
Back	Close		
Full Scre	Full Screen / Esc		
Printer-friendly Version			
Interactive Discussion			
meractive	DISCUSSION		



Retrieval Algorithms for Upper-Tropospheric Ice Clouds, B. Am.. Meteorol. Soc., 88, 191–204, 2007.

- Cox, S. K., McDougal, D. S., Randall, D. A., and Schiffer, R. A.: FIRE-The First ISCCP Regional Experiment, B. Am. Meteorol. Soc., 68, 114–118, 1987.
- <sup>5</sup> Fu, Q. and Liou, K. N.: Parameterization of the Radiative Properties of Cirrus Clouds, J. Atmos. Sci., 50, 2008–2025, 1993.
  - Fu, Q.: An Accurate Parameterization of the Solar Radiative Properties of Cirrus Clouds for Climate Models, J. Climate, 9, 2058–2082, 1996.
  - Fu, Q., Yang, P., and Sun, W. B.: An Accurate Parameterization of the Infrared Radiative Properties of Cirrus Clouds for Climate Models, J. Climate, 11, 2223–2237, 1998.

10

Fu, Q.: A New Parameterization of an Asymmetry Factor of Cirrus Clouds for Climate Models, J. Atmos. Sci., 64, 4140–4150, 2007.

Heidinger, A. K., Goldberg, M. D., Tarpley, D., Jelenak, A., and Pavolonis, M. J.: A new AVHRR cloud climatology, Proc. SPIE, 5658, 197–205, 2005.

Heymsfield, A. J., Bansemer, A., Field, P. R., Durden, S. L., Stith, J. L., Dye, J. E., Hall, W., and Grainger, C. A.: Observations and Parameterizations of Particle Size Distributions in Deep Tropical Cirrus and Stratiform Precipitating Clouds: Results from In Situ Observations in TRMM Field Campaigns, J. Atmos. Sci., 59, 3457–3491, 2002a.

Heymsfield, A. J., Lewis, S., Bansemer, A., Iaquinta, J., Miloshevich, L. M., Kajikawa, M.,

Twohy, C., and Poellot, M. R.: A General Approach for Deriving the Properties of Cirrus and Stratiform Ice Cloud Particles, J. Atmos. Sci., 59, 3–29, 2002b.

Heymsfield, A. J.: Properties of Tropical and Midlatitude Ice Cloud Particle Ensembles. Part I: Median Mass Diameters and Terminal Velocities, J. Atmos. Sci., 60, 2573–2591, 2003.

- Jensen, E., Starr, D., and Toon, O. B.: Mission investigates tropical cirrus clouds, Eos Transactions American Geophysical Union, 85, 45–50, 2004.
  - Jensen, E. J., Kinne, S., and Toon, O. B.: Tropical cirrus cloud radiative forcing- Sensitivity studies, Geophys. Res. Lett., 21, 2023–2026, 1994.
  - Karlsson, K. G.: A 10 year cloud climatology over Scandinavia derived from NOAA Advanced Very High Resolution Radiometer imagery, Int. J. Climatol., 23, 1023–1044, 2003.
- <sup>30</sup> King, M. D.: Determination of the Scaled Optical Thickness of Clouds from Reflected Solar Radiation Measurements, J. Atmos. Sci., 44, 1734–1751, 1987.
  - King, M. D., Tsay, S. C., Platnick, S. E., Wang, M., and Liou, K. N.: Cloud retrieval algorithms for MODIS: Optical thickness, effective particle radius, and thermodynamic phase, MODIS

9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval

Title Page				
Abstract	Introduction			
Conclusions	References			
Tables	Figures			
14	<b>N</b> I			
•	•			
Back	Close			
Full Scre	Full Screen / Esc			
Printer-friendly Version				
Interactive Discussion				



Algorithm Theoretical Basis Document, ATBD-MOD-05, 78 pp., 1997.

- Knap, W. H., Labonnote, L., Brogniez, G., and Stammes, P.: Modeling total and polarized reflectances of ice clouds: evaluation by means of POLDER and ATSR-2 measurements, Appl. Optics, 44, 4060–4073, 2005.
- Liou, K.-N.: Influence of Cirrus Clouds on Weather and Climate Processes: A Global Perspective, Mon. Weather Rev., 114, 1167–1199, 1986.

Liou, K. N.: An Introduction to Atmospheric Radiation, Academic Press, 583 pp., 2002.
 Lohmann, U. and Roeckner, E.: Influence of cirrus cloud radiative forcing on climate and climate sensitivity in a general circulation model, J. Geophys. Res., 100, 16305–16324, 1995.

Macke, A., Mishchenko, M. I., Muinonen, K., and Carlson, B. E.: Scattering of light by large nonspherical particles: ray-tracing approximation versus T-matrix method, Opt. Lett, 20, 1934– 1936, 1995.

Macke, A., Mishchenko, M. I., and Cairns, B.: The influence of inclusions on light scattering by large ice particles, J. Geophys. Res, 101, 23311–23316, 1996a.

<sup>15</sup> Macke, A., Mueller, J., and Raschke, E.: Single Scattering Properties of Atmospheric Ice Crystals, J. Atmos. Sci., 53, 2813–2825, 1996b.

McFarquhar, G. M. and Heymsfield, A. J.: Microphysical Characteristics of Three Anvils Sampled during the Central Equatorial Pacific Experiment, J. Atmos. Sci., 53, 2401–2423, 1996. McFarquhar, G. M., Heymsfield, A. J., Spinhirne, J., and Hart, B.: Thin and Subvisual

- <sup>20</sup> Tropopause Tropical Cirrus: Observations and Radiative Impacts, J. Atmos. Sci., 57, 1841– 1853, 2000.
  - Miller, S. D., Hawkins, J. D., Kent, J., Turk, F. J., Lee, T. F., Kuciauskas, A. P., Richardson, K., Wade, R., and Hoffman, C.: NexSat: Previewing NPOESS/VIIRS Imagery Capabilities, B.. Am.. Meteorol. Soc., 87, 433–446, 2006.
- <sup>25</sup> Minnis, P., Liou, K. N., and Takano, Y.: Inference of Cirrus Cloud Properties Using Satelliteobserved Visible and Infrared Radiances. Part I: Parameterization of Radiance Fields, J. Atmos. Sci., 50, 1279–1304, 1993.

Mishchenko, M. I., Rossow, W. B., Macke, A., and Lacis, A. A.: Sensitivity of cirrus cloud albedo, bidirectional reflectance and optical thickness retrieval accuracy to ice particle shape,

J. Geophys. Res., 101, 16973–16986, 1996.

Nakajima, T. and King, M. D.: Determination of the Optical Thickness and Effective Particle Radius of Clouds from Reflected Solar Radiation Measurements. Part I: Theory, J. Atmos. Sci., 47, 1878–1893, 1990. 9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval

Title Page			
Abstract	Introduction		
Conclusions	References		
Tables	Figures		
14	►I		
•	•		
	Close		
Back	Close		
Back Full Scre	Close een / Esc		
Back Full Scre	Close een / Esc		
Back Full Scree Printer-frier	Close een / Esc ndly Version		
Back Full Scree Printer-frier	Close een / Esc ndly Version Discussion		



- Oreopoulos, L. and Davies, R.: Plane Parallel Albedo Biases from Satellite Observations. Part I: Dependence on Resolution and Other Factors, J. Climate, 11, 919–932, 1998.
- Platnick, S., King, M. D., Ackerman, S. A., Menzel, W. P., Baum, B. A., Riedi, J. C., and Frey, R. A.: The MODIS cloud products: algorithms and examples from Terra, IEEE T. Geosci. Remote, 41, 459–473, 2003.

5

20

25

Ramanathan, V., Cess, R. D., Harrison, E. F., Minnis, P., Barkstrom, B. R., Ahmad, E., and Hartmann, D.: Cloud-Radiative Forcing and Climate: Results from the Earth Radiation Budget Experiment, Science, 243, 57–63, 1989.

Ramaswamy, V. and Ramanathan, V.: Solar Absorption by Cirrus Clouds and the Maintenance

- of the Tropical Upper Troposphere Thermal Structure, J. Atmos. Sci., 46, 2293–2310, 1989.
   Riedi, J., Marchant, B., Platnick, S., Baum, B., Thieuleux, F., Oudard, C., Parol, F., Nicolas, J-M., and Dubuisson, P.: Cloud thermodynamic phase inferred from merged POLDER and MODIS data, Atmos. Chem. Phys. Discuss., 7, 14103–14137, 2007, http://www.atmos-chem-phys-discuss.net/7/14103/2007/.
- <sup>15</sup> Roebeling, R. A., Feijt, A. J., and Stammes, P.: Cloud property retrievals for climate monitoring: Implications of differences between Spinning Enhanced Visible and Infrared Imager (SEVIRI) on METEOSAT-8 and Advanced Very High Resolution Radiometer (AVHRR) on NOAA-17, J. Geophys. Res., 111, D20210, doi:10.1029/2005JD006990, 2006.

Rossow, W. B. and Schiffer, R. A.: Advances in Understanding Clouds from ISCCP, B. Am. Meteorol. Soc., 80, 2261–2287, 1999.

- Salomonson, V. V., Barnes, W. L., Maymon, P. W., Montgomery, H. E., and Ostrow, H.: MODIS: advanced facility instrument for studies of the Earth as asystem, IEEE T. Geosci. Remote, 27, 145–153, 1989.
- Sassen, K., Wang, Z., and Liu, D.: The global distribution of cirrus clouds from Cloud-Sat/CALIPSO measurements, J. Geophys. Res., submitted, 2008.
- Schmit, T. J., Gunshor, M. M., Menzel, W. P., Gurka, J. J., Li, J., and Bachmeier, A. S.: INTRO-DUCING THE NEXT-GENERATION ADVANCED BASELINE IMAGER ON GOES-R, B. Am. Meteorol. Soc., 86, 1079–1096, 2005.

Stephens, G. L., Tsay, S.-C., Stackhouse, P. W., and Flatau, P. J.: The Relevance of the Mi-

- 30 crophysical and Radiative Properties of Cirrus Clouds to Climate and Climatic Feedback, J. Atmos. Sci., 47, 1742–1754, 1990.
  - Takano, Y. and Liou, K.-N.: Solar Radiative Transfer in Cirrus Clouds. Part I: Single-Scattering and Optical Properties of Hexagonal Ice Crystals, J. Atmos. Sci., 46, 3–19, 1989.

#### **ACPD**

9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval





- van de Hulst, H. C.: Light Scattering by Small Particles, Light Scattering by Small Particles, New York: John Wiley&Sons, 1957.
- Wang, P.-H., Minnis, P., McCormick, M. P., Kent, G. S., and Skeens, K. M.: A 6-year climatology of cloud occurrence frequency from Stratospheric Aerosol and Gas Experiment II observations (1985–1990), J. Geophys. Res., 101, 29407–29429, 1996.
- tions (1985–1990), J. Geophys. Res., 101, 29407–29429, 1996.
   Weickmann, H. K.: Die Eisphase in der Atmosphäre (The Ice Phase in the Atmosphere), Royal Aircraft Establishments, 96 pp., 1947.
  - Wylie, D. P. and Menzel, W. P.: Eight Years of High Cloud Statistics Using HIRS, J. Climate, 12, 170–184, 1999.
- <sup>10</sup> Yang, P. and Liou, K. N.: Geometric-optics-integral-equation method for light scattering by nonspherical ice crystals, Appl. Optics, 35, 6568–6584, 1996.
  - Yang, P., Baum, B. A., Heymsfield, A. J., Hu, Y. X., Huang, H. L., Tsay, S. C., and Ackerman, S.: Single-scattering properties of droxtals, J. Quant. Spectrosc. Ra., 79, 1159–1169, 2003.
- Yang, P., Zhang, L., Hong, G., Nasiri, S. L., Baum, B. A., Huang, H.-L., King, M. D., and
   Platnick, S.: Differences Between Collection 4 and 5 MODIS Ice Cloud Optical/Microphysical
   Products and Their Impact on Radiative Forcing Simulations, IEEE T. Geosci. Remote, 45, 2886–2899, 2007.
  - Yang, P., Hong, G., Kattawar, G. W., Minnis, P., and Hu, Y.: Uncertainties Associated With the Surface Texture of Ice Particles in Satellite-Based Retrieval of Cirrus Clouds: Part II Effect
- <sup>20</sup> of Particle Surface Roughness on Retrieved Cloud Optical Thickness and Effective Particle Size, IEEE T. Geosci. Remote, 46, 1948–1957, 2008.
  - Zhang, M. H., Lin, W. Y., Klein, S. A., Bacmeister, J. T., Bony, S., Cederwall, R. T., Del Genio, A. D., Hack, J. J., Loeb, N. G., and Lohmann, U.: Comparing clouds and their seasonal variations in 10 atmospheric general circulation models with satellite measurements, J. Geophys. Res, 110, D15S02 doi:10.1029/2004JD005021, 2005.

25

Zhang, Z., Yang, P., Kattawar, G. W., Tsay, S.-C., Baum, B. A., Hu, Y., Heymsfiel, A. J., and Reichardt, J.: Geometrical-Optics Solution to Light Scattering by Droxtal Ice Crystals, Appl. Optics, 43, 2490–2499, 2004. ACPD

9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval

Title Page				
Abstract	Introduction			
Conclusions	References			
Tables	Figures			
•	•			
Back	Close			
Full Scr	Full Screen / Esc			
Printer-friendly Version				
Interactive Discussion				



# **Table 1.** The collocation resolutions and the resolutions of the MODIS and POLDER cloud products.

Level-1 collocation				
	MODIS product (MOD021KM)	POLDER product (L1-B)	Collocation	
Resolution	1×1 km <sup>2</sup>	$6 \times 6  \mathrm{km}^2$	6×6 km <sup>2</sup>	
Level-2 collocation				
	MODIS product (MOD06)	POLDER product (RB2)	collocation	
Resolution	$1 \times 1 \text{ km}^2$	$18 \times 18  \text{km}^2$	6×6 km <sup>2</sup>	





9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval

### **ACPD**

9, 1757–1796, 2009

Ice particle model and cloud optical thickness retrieval

Table 2. Configurations	of three experiments.
-------------------------	-----------------------

Experiment	Radiance source	Radiance resolution	Bulk scattering model
A B	MODIS POLDER	$6 \times 6 \text{ km}^2$ $6 \times 6 \text{ km}^2$	Baum05 ( $r_e$ =30 $\mu m$ ) IHM ( $r_e$ =30 $\mu m$ )
С	POLDER	6×6 km²	Baum05 (r <sub>e</sub> =30 μm)





#### **ACPD**

9, 1757–1796, 2009

Ice particle model and cloud optical thickness retrieval

Z. Zhang et al.

<b>Table 3.</b> Statistics of the ratios, $\tau^{\text{POLDER}}/\tau^{\text{MODIS}}, \tau^{B}/\tau^{A}$ and $\tau^{C}/\tau^{A}$ .	•
---	---

Comparison	Distribution	Mean	Median	Std	C(1.0)*
$\tau^{\rm POLDER}/\tau^{\rm MODIS}$	Log-Normal	0.8082	0.6811	0.9483	80.53%
$\tau^{B}/\tau^{A}$	Log-Normal	0.7703	0.6879	0.3802	86.38%
$\tau^{C}/\tau^{A}$	Normal	1.0880	0.9851	0.5109	52.53%

 $^{*}C(1.0)$  corresponds to the value of cumulative distribution at unity.







**Fig. 1.** The scattering phase functions and corresponding asymmetry factors of ice particles at  $0.86-\mu m$  according to the Baum05 model (solid line) and the IHM model (dashed line).

CC ①

**Printer-friendly Version** 

Interactive Discussion

**ACPD** 





**Fig. 2.** The false-color image (Red: reflectance in 0.65- $\mu$ m band; Green: reflectance in 0.86- $\mu$ m band; Blue: Brightness temperature of 11- $\mu$ m band after gray flopped) of the Aqua MODIS granule selected for comparison. In the image, ocean is dark, land is green, low level clouds appear yellowish and high level clouds are white or light blue.

Interactive Discussion





**Fig. 3.** Comparison of MODIS ( $\tau^{\text{MODIS}}$ ) and POLDER ( $\tau^{\text{POLDER}}$ ) ice cloud  $\tau$  retrievals for the granule in Fig. 2. The solid line corresponds to a fitting of  $\tau^{\text{POLDER}}$  with 0.6811 $\tau^{\text{MODIS}}$ .



Full Screen / Esc

**Printer-friendly Version** 

Interactive Discussion

9, 1757-1796, 2009







Printer-friendly Version

Interactive Discussion





Fig. 5. Zonally-averaged monthly mean ice cloud optical thickness as function of latitude and month derived from (a) MODIS and (b) POLDER cloud products.

#### ACPD

9, 1757-1796, 2009

#### Ice particle model and cloud optical thickness retrieval







ACPD

9, 1757-1796, 2009

Ice particle model and cloud optical thickness retrieval

Z. Zhang et al.



in Fig. 5a using the Baum05 model to specify the radiative properties of ice particles. (b) from POLDER retrieval in Fig. 5b using the IHM model. (c) same as (b) except that the Baum05 model is used.



**Fig. 7.** The ratio of (a)  $\tau_c^{\text{IHM}}/\tau_c^{\text{Baum05}}$  and (b)  $P_{11}^{\text{Baum05}}/\tau_{11}^{\text{IHM}}$  as a function of scattering angle.

#### ACPD

9, 1757-1796, 2009







**Fig. 8.** Schematic illustration of two possible paths of photons within ice cloud. Note that back scattering event occurs only once in "Path A", but several times in "Path B".

### **ACPD**

9, 1757–1796, 2009

#### Ice particle model and cloud optical thickness retrieval







**Fig. 9.** (a) Schematic illustration of the seasonal dependence of solar zenith angle  $\theta_0$  and MODIS scattering angle  $\theta_s$ . (b) Zonal mean  $\theta_s$  as functions of latitude and month.

# ACPD

9, 1757–1796, 2009

#### Ice particle model and cloud optical thickness retrieval







Printer-friendly Version

Interactive Discussion

**ACPD** 

