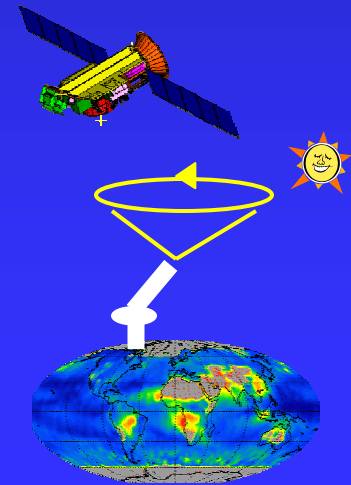


Size distributions from AERONET : Accuracy, Issues, Improvements

O. Dubovik¹, B. N. Holben¹, A. Smirnov¹, T. F. Eck¹,
T. Lapyonok¹, A. Sinyuk¹, M. Sorokin¹, D. Tanre²,
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2- Université de Sci. et Tech. de Lille , France (**PHOTON**)





Forward model:

- Spectral and angular scattering by particles with different sizes, compositions and shapes
- Accounting for multiple scattering in atmosphere

(Dubovik and King, JGR, 2000)



Observations

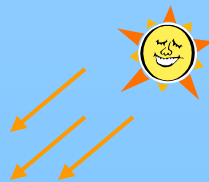


Numerical inversion:

- Accounting for noise
- Solving Ill-posed problem
- Setting a priori constraints



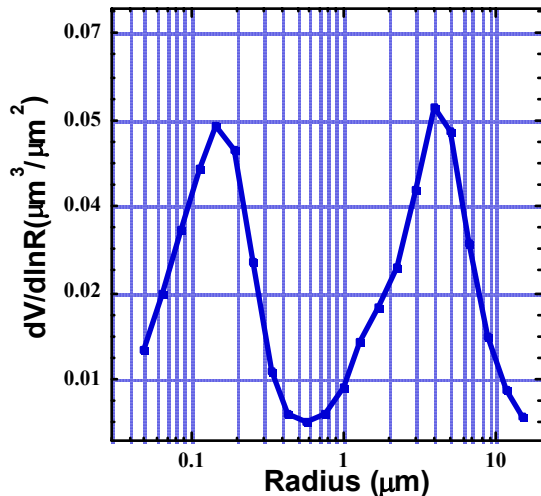
**aerosol particle sizes,
refractive index,
single scattering albedo, etc.**



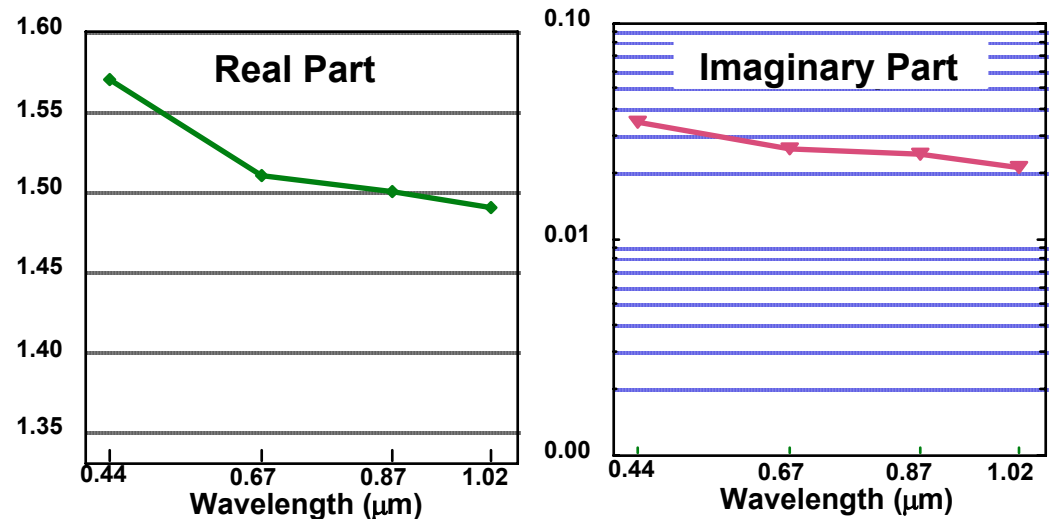
INPUT of Forward Model

Single scattering: aerosol particles - homogeneous spheres

Particle Size Distribution:
 $0.05 \mu\text{m} \leq R \text{ (22 bins)} \leq 15 \mu\text{m}$



Complex Refractive Index at
 $\lambda = 0.44; 0.67; 0.87; 1.02 \mu\text{m}$

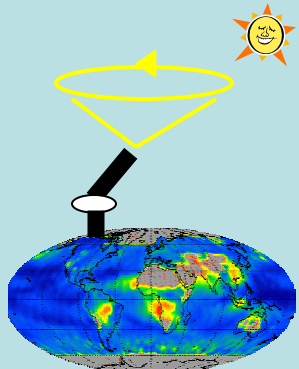


Multiple scattering:

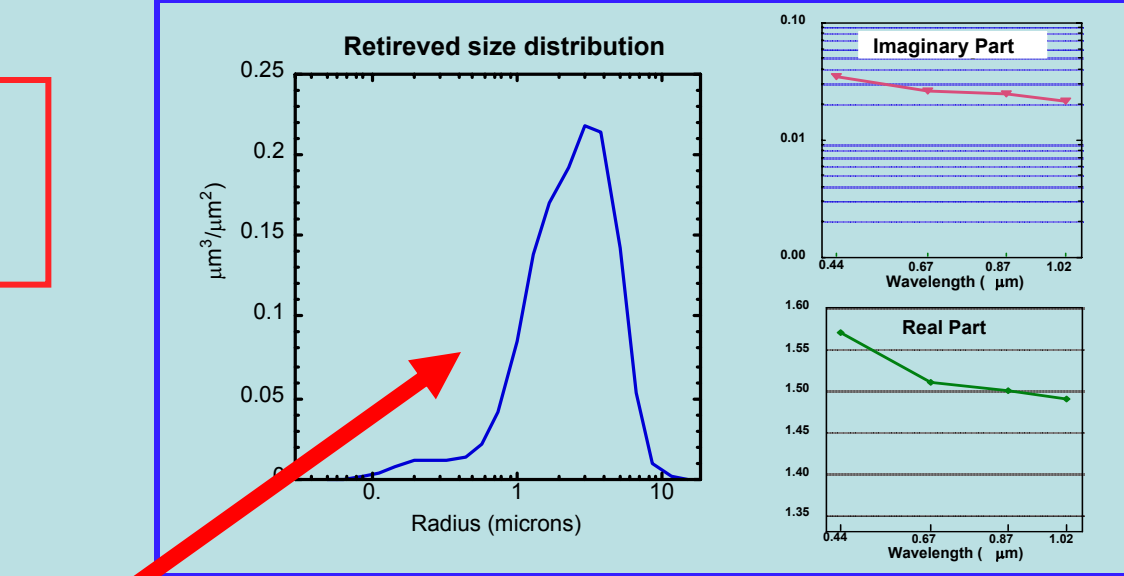
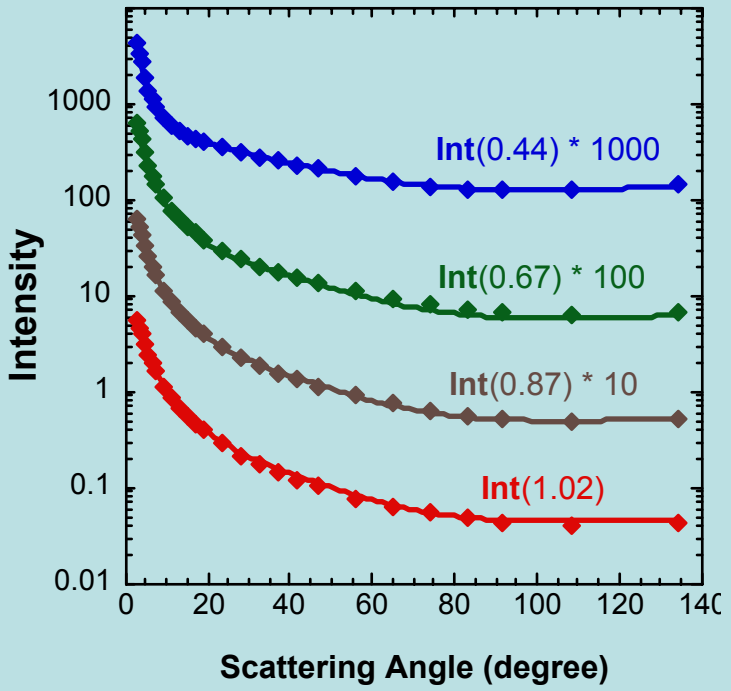
scalar radiative transfer with Lambertian ground reflectance solved by DisOrds (Nakajima-Tanaka or Stamnes et al.)



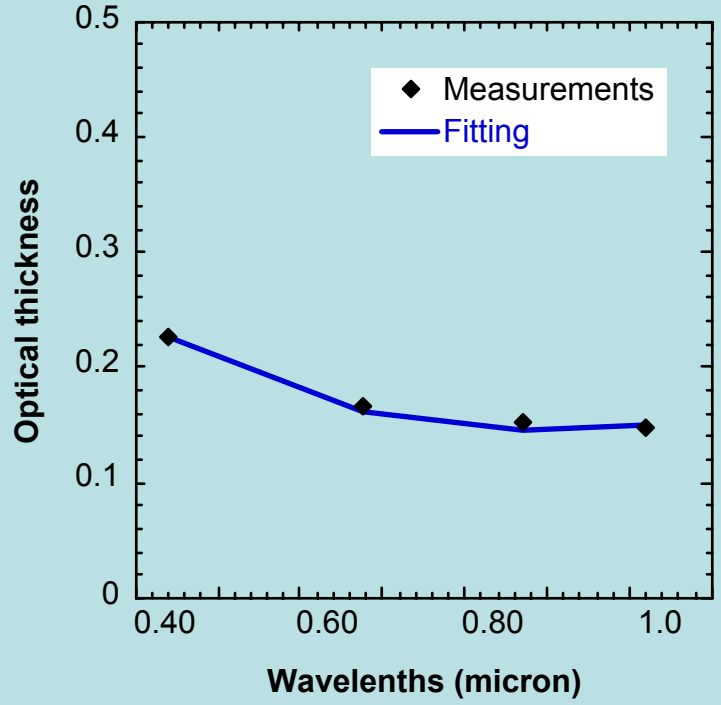
Fitting as a retrieval strategy



Almucantar Fitting



Fitting of optical thickness in retrievals



A world map with a red dot in the Atlantic Ocean. The text "Accuracy ????" is overlaid on the map.

Accuracy ????

Theoretical limitations

Forward model:

- particle shapes: spheres, spheroids (shape retrieval ?)
- particles are homogeneous (bi-components ?)
- horizontal homogeneous
- vertically homogenous aerosol or assumed profile of extinction (?)
- assumed surface albedo or assumed BRDF
- assumed gaseous absorption

Inversion assumptions:

- smoothness constraints on size distribution
- smoothness constraints of spectral dependence of ref. Index
- log-normal distribution of random errors

Perspectives:

- assuming bi-component aerosols
- retrieval of BRDF from combination of AERONET with satellite and aircraft observations
- retrieval of shape distribution

Measurement limitations

Geometry:

- scattering angle coverage: $\sim 3^\circ (1^\circ - ?) - 150^\circ$
- spectral coverage: $\sim 0.34 - 1.6 \mu\text{m}$

Measurement accuracies:

- optical thickness: $\sim 0.01-0.02$
- sky-channel calibration: $\sim 5 \%$
- azimuth angle pointing: $\sim 0.5^\circ$
- degree of linear polarization: $\sim 1-2 \%$ (?)
- consistency between polarization and intensity: good (?)
- cloud contamination: almucantar (good), principle plane (???)

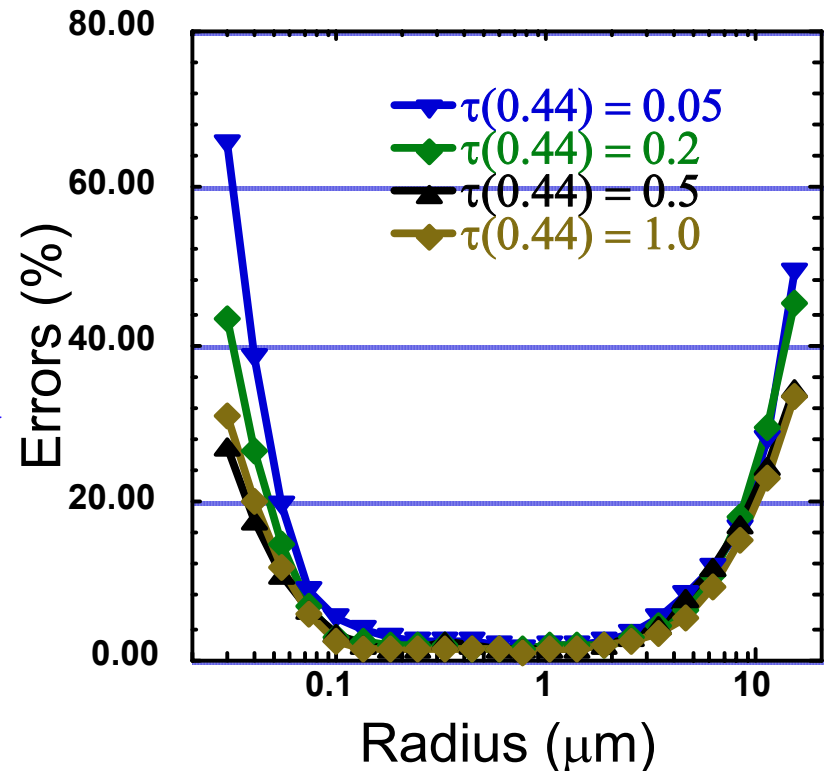
Random ERRORS in AERONET retrievals

ASSUMPTIONS:

- measurements have Normal Noise:
 - optical thickness: $\sigma = 0.01$
 - sky-radiances: $\sigma = 5\%$

CONCLUSIONS:

- the retrievals stable
- important tendencies outlined





Sensitivity to instrumental offsets

Offsets were considered in:

- optical thickness: $\Delta \tau(\lambda) = \pm 0.01; \pm 0.02;$
- sky-channel calibration: $\Delta_I(\lambda; \Theta) / I(\lambda; \Theta) 100\% = \pm 5\%;$
- azimuth angle pointing: $\Delta \phi = 0.5^\circ; 1^\circ;$
- assumed ground reflectance: $\Delta A(\lambda) / A(\lambda) 100\% = \pm 30\%; \pm 50\%;$

Aerosol models considered (bi - modal log-normal):

- Water-soluble aerosol for $0.05 \leq \tau(440) \leq 1;$
- Desert dust for $0.5 \leq \tau(440) \leq 1;$
- Biomass burning for $0.5 \leq \tau(440) \leq 1;$

Results summary:

- $\tau(440) \leq 0.2$ - $dV/d\ln r$ (+), $n(\lambda)$ (-), $k(\lambda)$ (-), $\omega_0(\lambda)$ (-)
- $\tau(440) > 0.2$ - $dV/d\ln r$ (+), $n(\lambda)$ (+), $k(\lambda)$ (+), $\omega_0(\lambda)$ (+)
- Angular pointing accuracy is critical for $dV/d\ln r$ of dust

(+) CAN BE retrieved (-) CAN NOT BE retrieved



Sensitivity to forward model limitations

Mixed aerosols (inhomogeneous spherical aerosols):

- **Externally** mixed ($n(l)$ and $k(l)$ different for fine and coarse modes)
- **Internally** mixed ($n(l)$ and $k(l)$ different for core and shell) - *Biomass Burning*

Results summary:

- $dV/d\ln r$ (+), $\omega_0(\lambda)$ (+), $n(\lambda)$ (+, **effective**), $k(\lambda)$ (+, **effective**)

Non-spherical aerosols:

- **Spheroids** (prolate, axis ratio 2) - *Desert dust*

Results summary:

- $dV/d\ln r$ - coarse mode (+), fine mode (+, zenith angle $< 25^\circ$)
- $\omega_0(\lambda)$ (+) - full solar almucantar (zenith angle $\geq 50^\circ$)
- $k(\lambda)$ (+)
- $n(440)$ (-), $n(670)$ (-), $n(870)$ (+/-), $n(1020)$ (+)

(+) CAN BE retrieved (-) CAN NOT BE retrieved

Retrieval accuracy and limitations

Sensitivity tests by
Dubovik et al. 2000

Effective

wide angular
coverage

bias $\Delta\tau = \pm 0.01$

$\tau(0.44) \leq 0.2$

$\tau(0.44) \geq 0.5$

Real Part
Imaginary Part
SSA

0.05

0.025

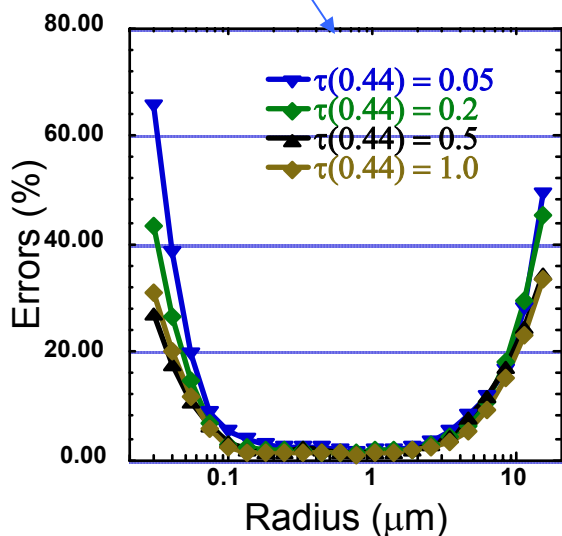
80-100%

50%

0.05-0.07

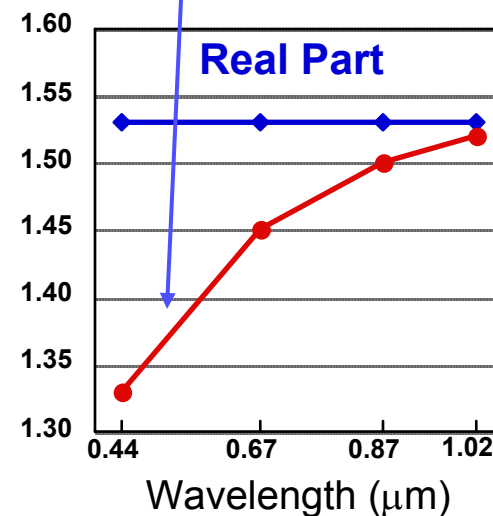
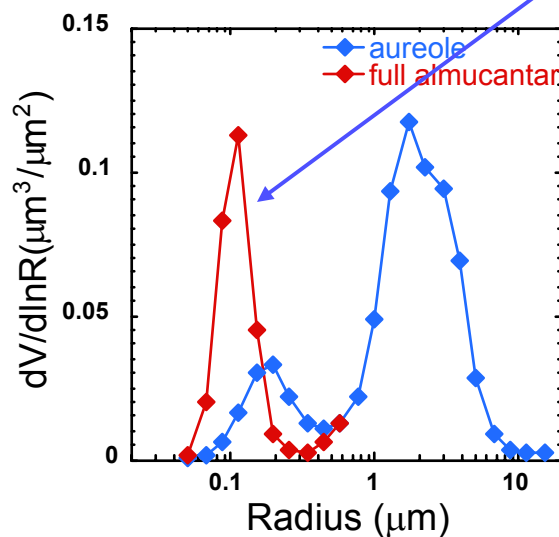
0.03

Random errors

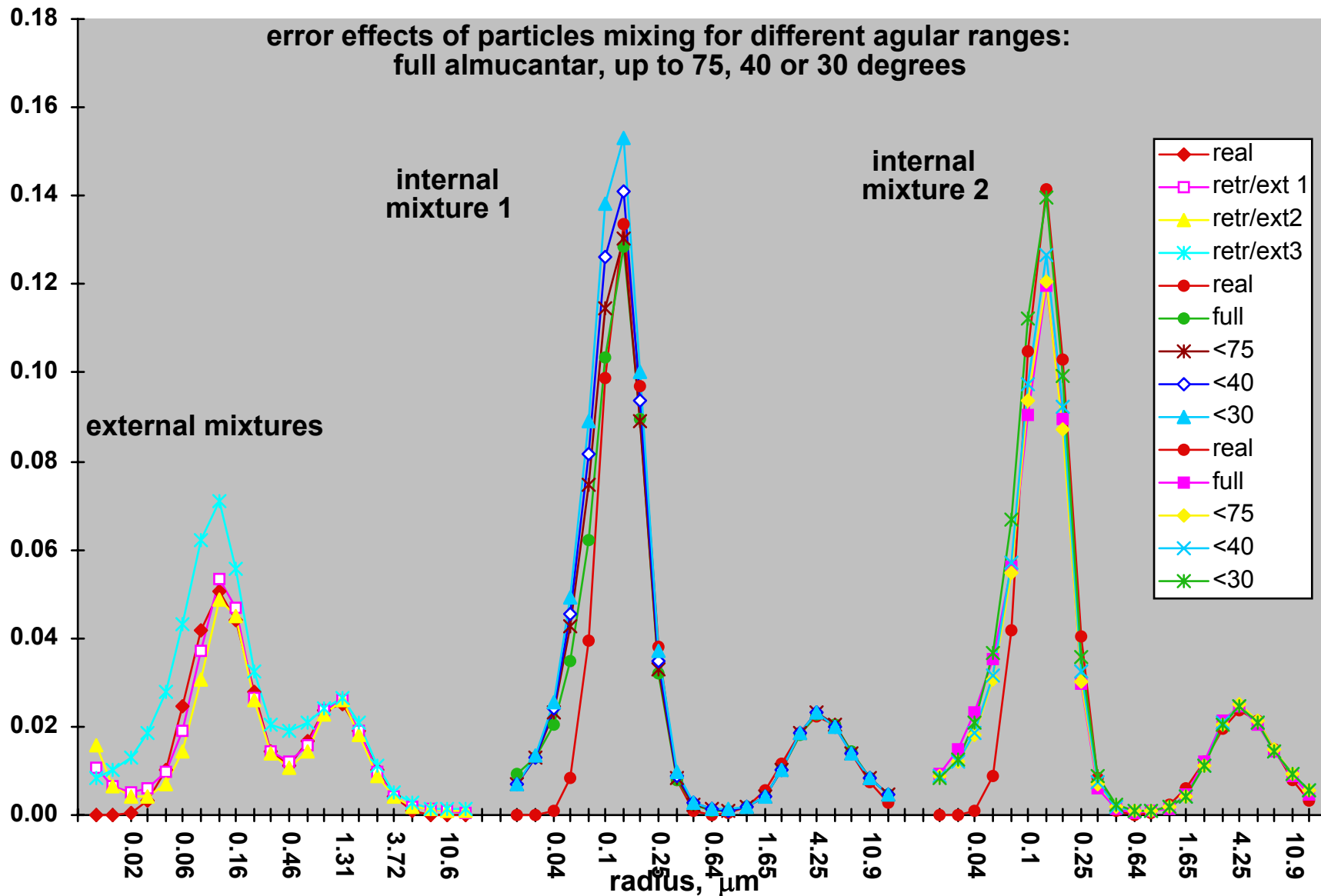


Size Distribution:

Nonsphericity
biases



error effects of particles mixing for different agular ranges:
full almucantar, up to 75, 40 or 30 degrees



AERONET inversion scenarios

Almucantar:

$$\tau(\lambda), I(\lambda, \Theta)$$

$$\lambda = 0.38, 0.44, 0.5, 0.67, \\ 0.87, 1.02, 1.64, \mu\text{m}$$

Principal Plane:

$$\tau(\lambda), I(\lambda, \Theta)$$

$$\lambda = 0.38, 0.44, 0.5, 0.67, \\ 0.87, 1.02, 1.64, \mu\text{m}$$

Polarized Principal Plane:

$$\tau(\lambda), I(\lambda, \Theta), P(\lambda, \Theta)$$

$$\lambda = 0.87 \mu\text{m}$$

satellite, aircraft, etc.

spheres



spheroids



Inversion
Products:

$$dV/d\ln(r_i)$$

$$n(\lambda)$$

$$k(\lambda)$$

BRDF

errors

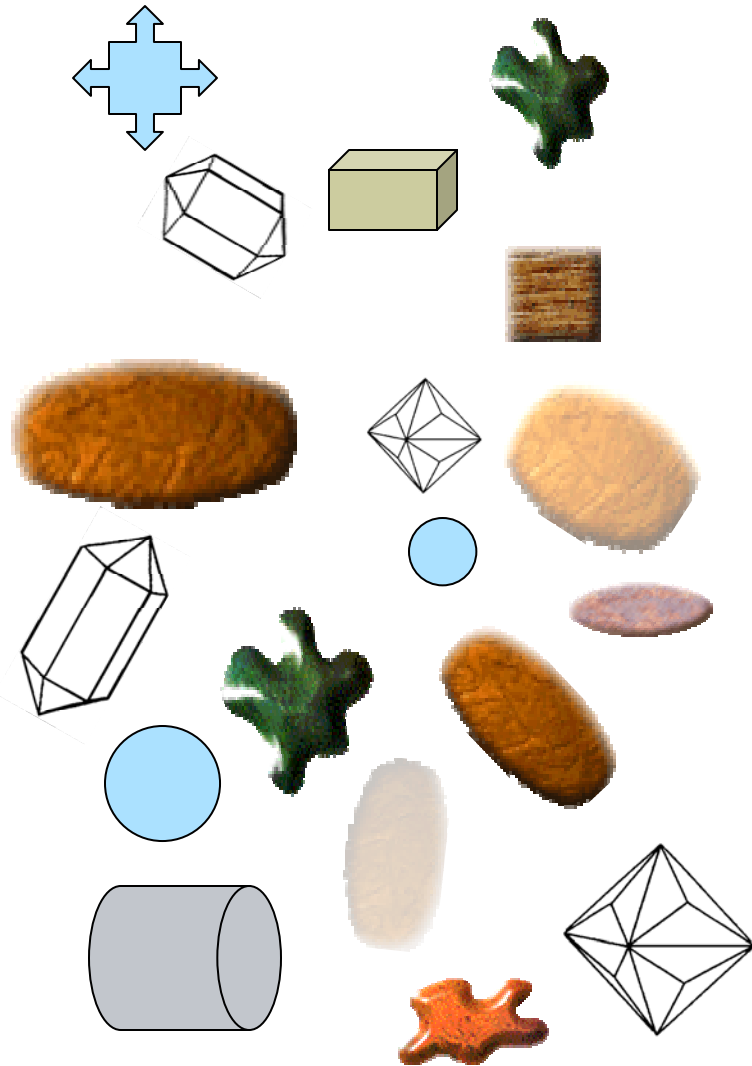


$$\omega_0(\lambda)$$

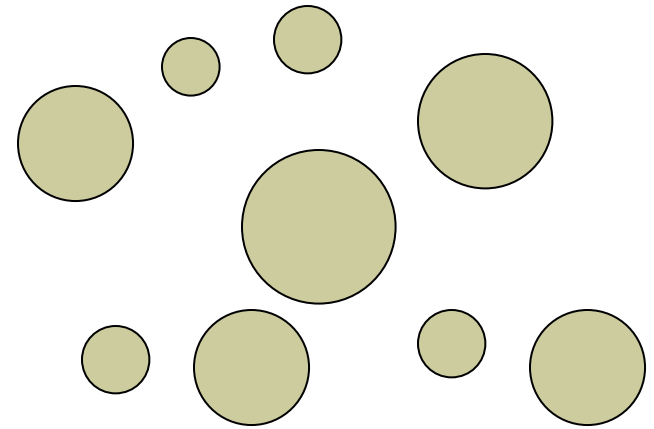
$$P_{11}(\lambda), P_{12}(\lambda), \dots$$

fine & coarse
fluxes, ...

AERONET model of aerosol

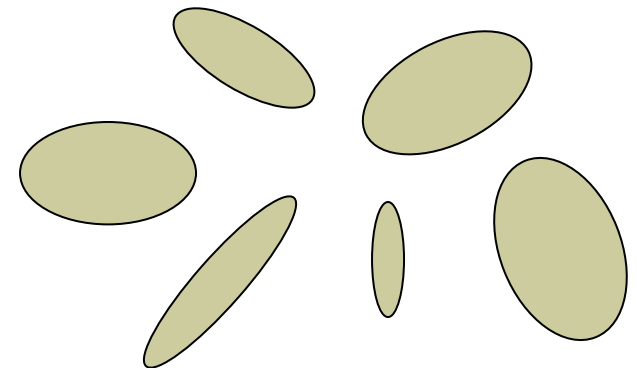


spherical:

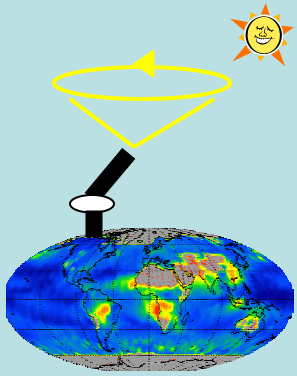


*Randomly oriented
spheroids :*

(Mishchenko et al., 1997)



spheroid kernels data base for operational modeling !!!



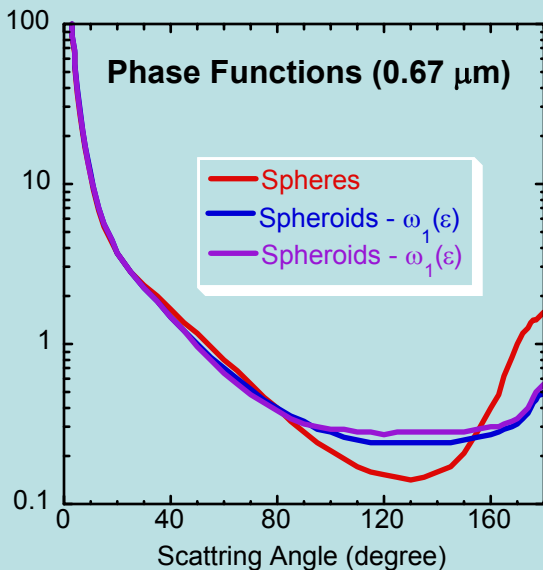
K - pre-computed
kernel matrices:
Input: n and k

Input: ω_p ($N_p = 11$),
 $V(r_i)$ ($N_i = 22 - 26$)

Basic Model by Mishchenko et al.
1997:

- randomly oriented homogeneous spheroids
- $\omega(\varepsilon)$ - size independent shape distribution

$$\tau(\lambda), F_{11}, \dots, F_{44} \approx \sum_{(i,p)} \mathbf{K}_{ip}(\dots; n, k) \omega_p V(r_i)$$



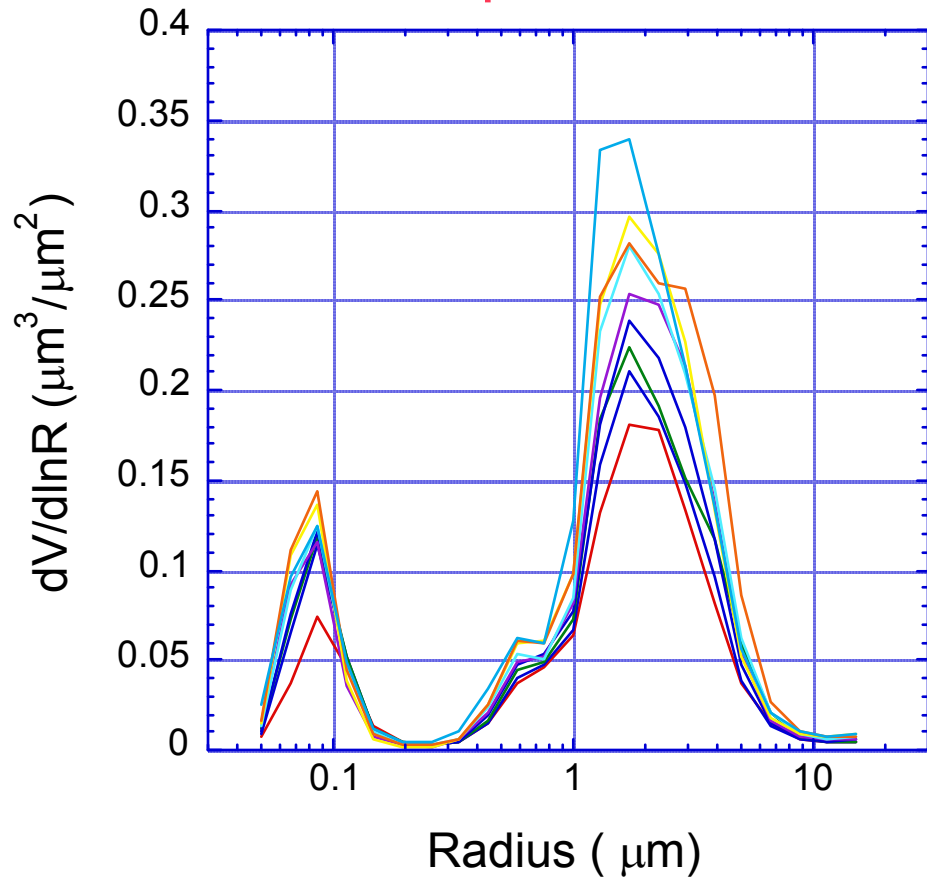
Time: < one sec.
Accuracy: < 1-3 %
Range of applicability:
 $0.15 \leq 2\pi r/\lambda \leq \underline{280}$ (26 bins)
 $0.4 \leq \varepsilon \leq 2.4$ (11 bins)
 $1.33 \leq n \leq 1.6$
 $0.0005 \leq k \leq 0.5$

Output: $\tau(\lambda), \omega_0(\lambda),$
 $F_{11}(\Theta), F_{12}(\Theta), F_{22}(\Theta),$
 $F_{33}(\Theta), F_{34}(\Theta), F_{44}(\Theta)$

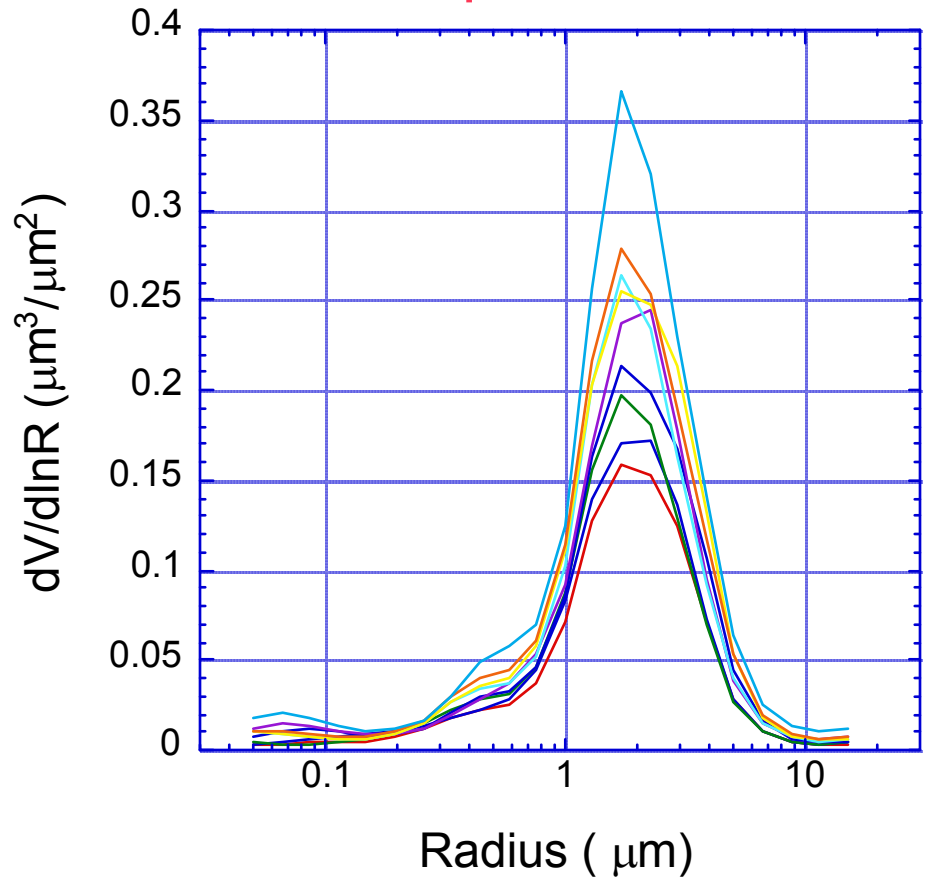
Cape Verde (2001) dust Size distributions

(110 cases; $\tau(1020) \geq 0.3$; $\alpha \leq 0.6$)

Spheres

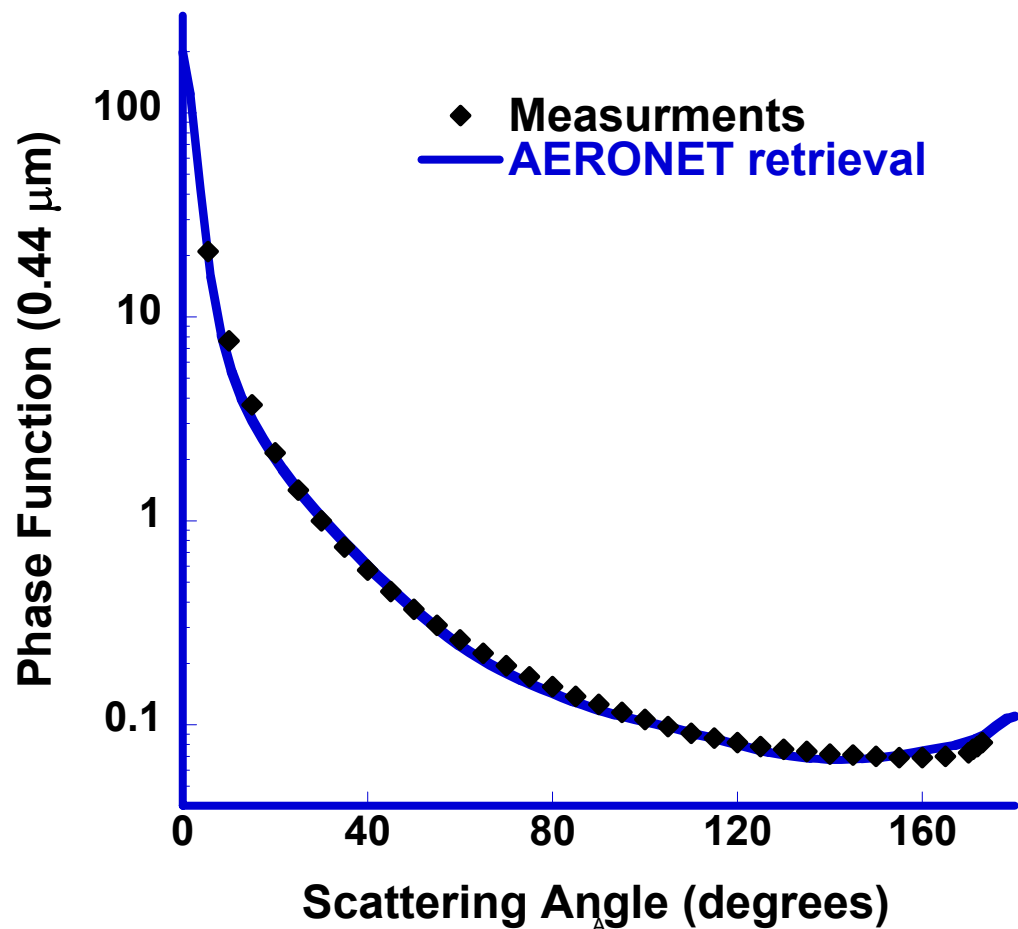


Spheroids

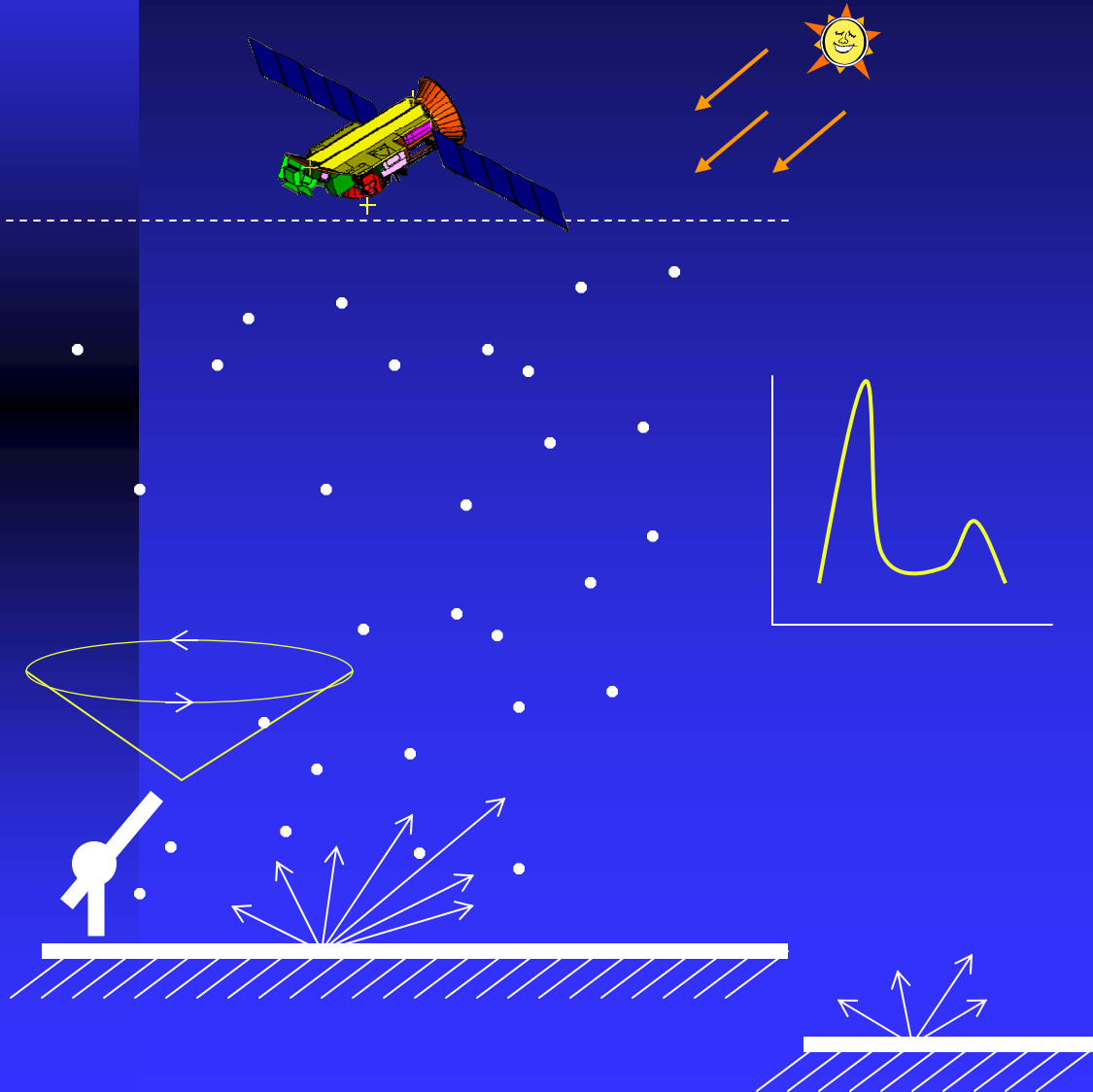


9 groups: $\tau = 0.39, 0.44, 0.48, 0.50, 0.52, 0.57, 0.60, 0.62, 0.71$

Comparison of “laboratory” Phase Function with typical AERONET retrieval



Retrieval using combinations of up-looking Ground-based and down-looking satellite observations



Retrieved:

Aerosol Properties:

- size distribution
 - real ref. ind.
 - imag. ref. ind
- (AERONET sky channels)

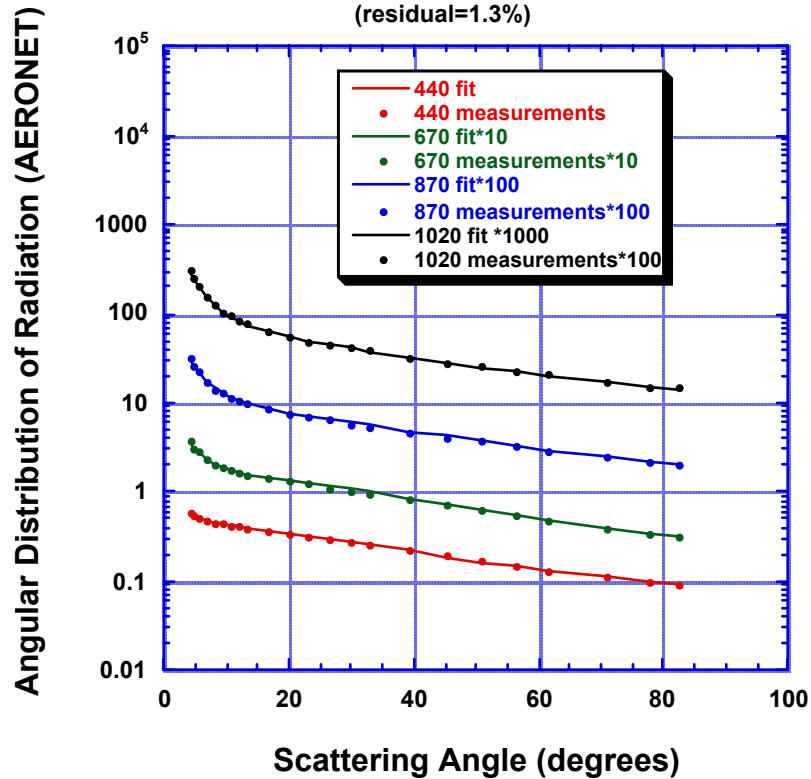
Surface Parameters:

- BRDF (MISR channels)
- Albedo (MODIS IR channels)

Simultaneous fitting

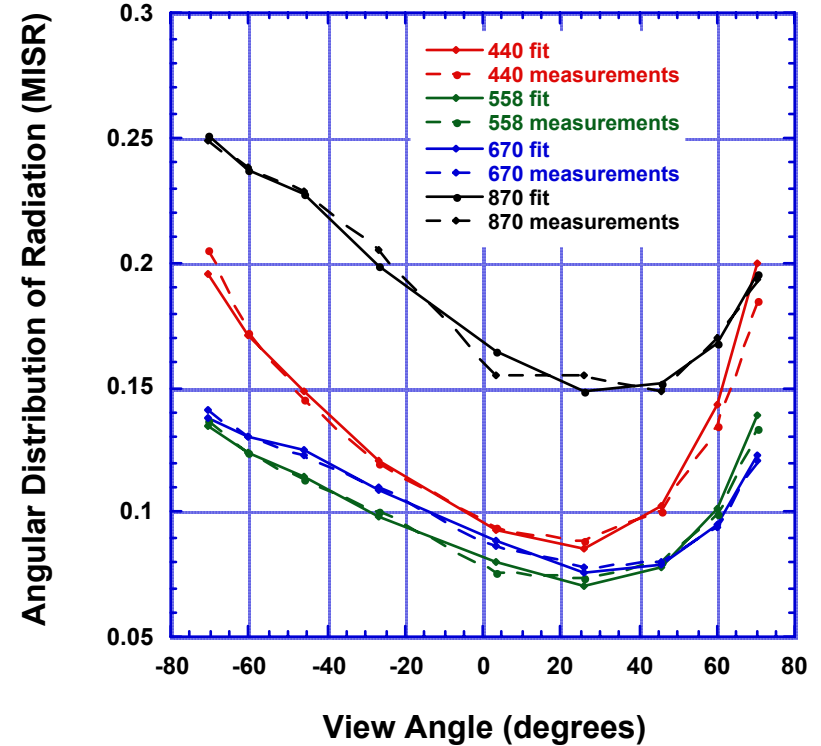
Mongu, August 9, 2003

(residual=1.3%)



Mongu, August 9, 2003

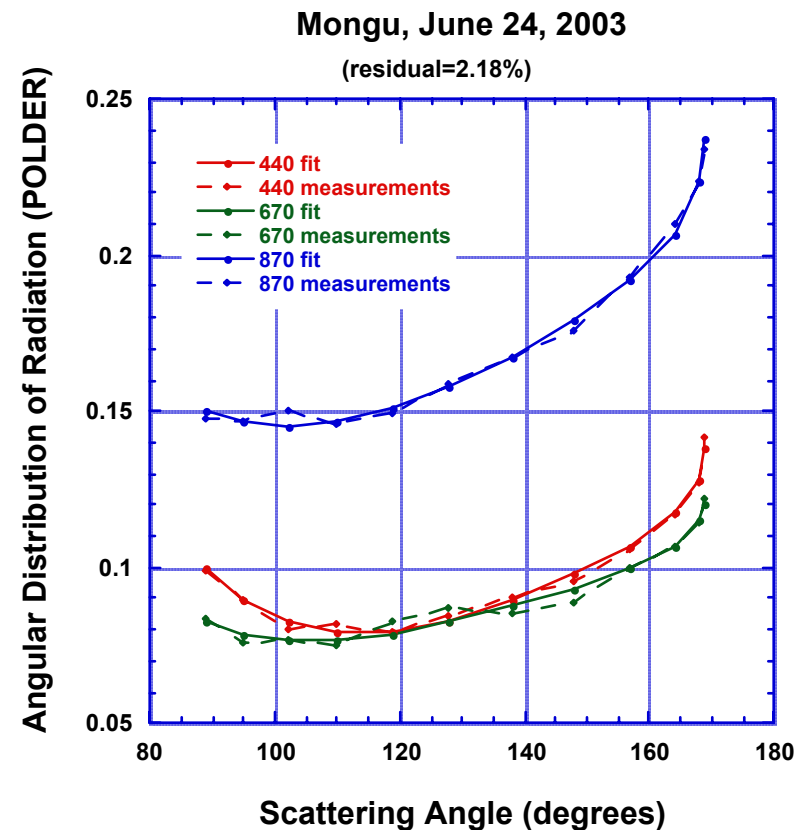
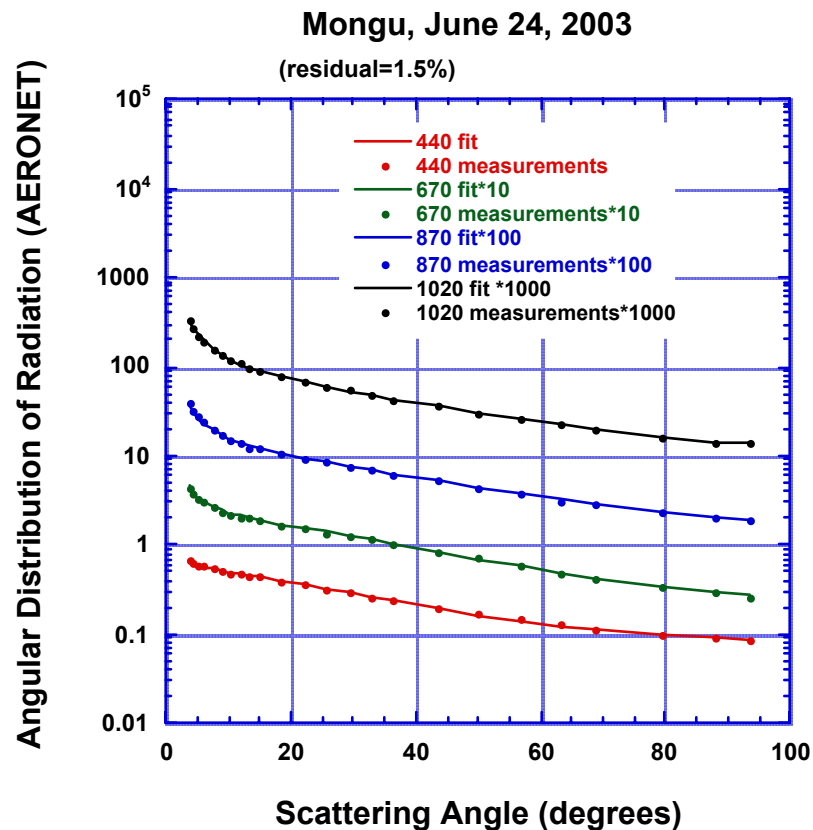
(residual=3%)



AERONET- POLDER

June 24, 2003
 $\tau(0.44) \sim 0.26$

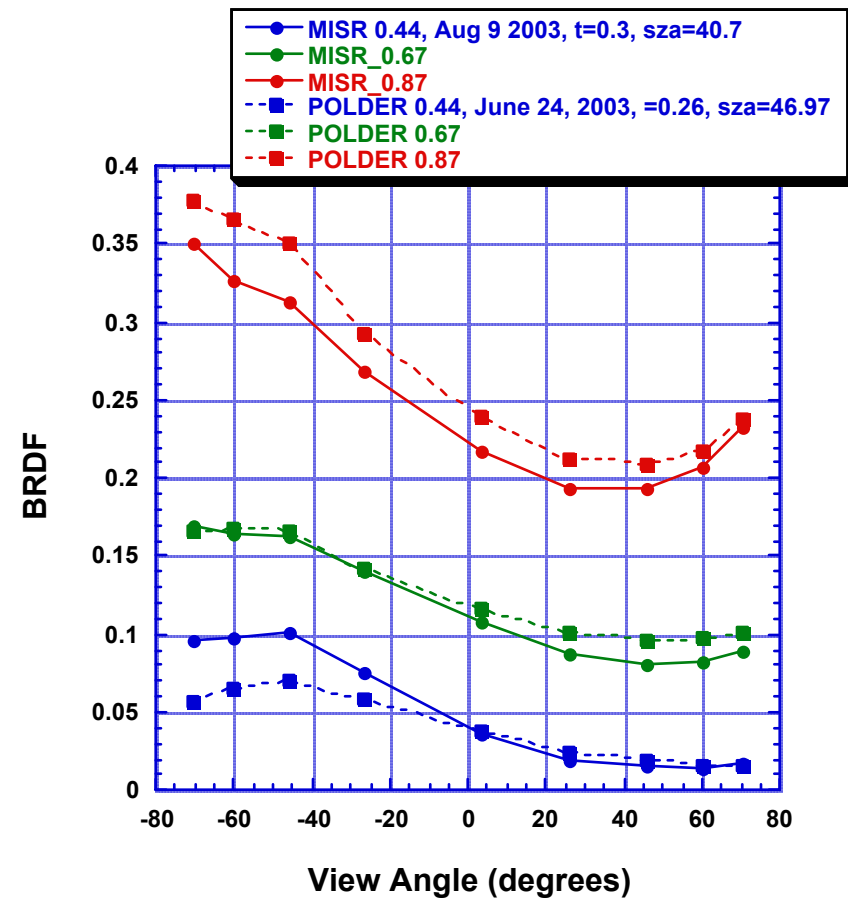
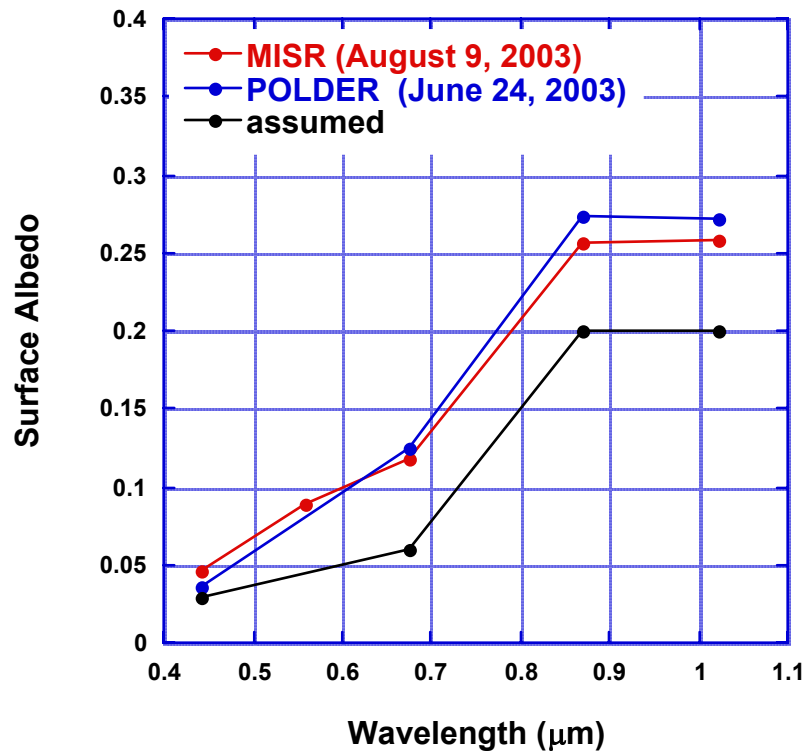
Simultaneous fitting



Comparisons of Surface Retrievals

POLDER: June 24, 2003
 $\tau(0.44) \sim 0.26$, SZA=47°

MISR: August 9, 2003
 $\tau(0.44) \sim 0.3$, SZA=40°

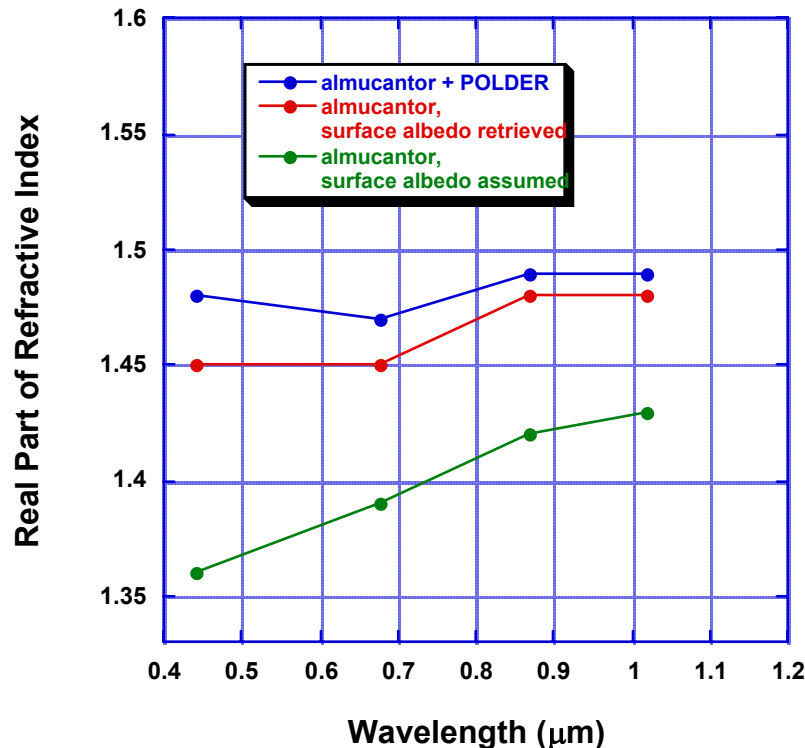


Surface Effect on Retrievals of the Refractive Index (low aerosol loading)

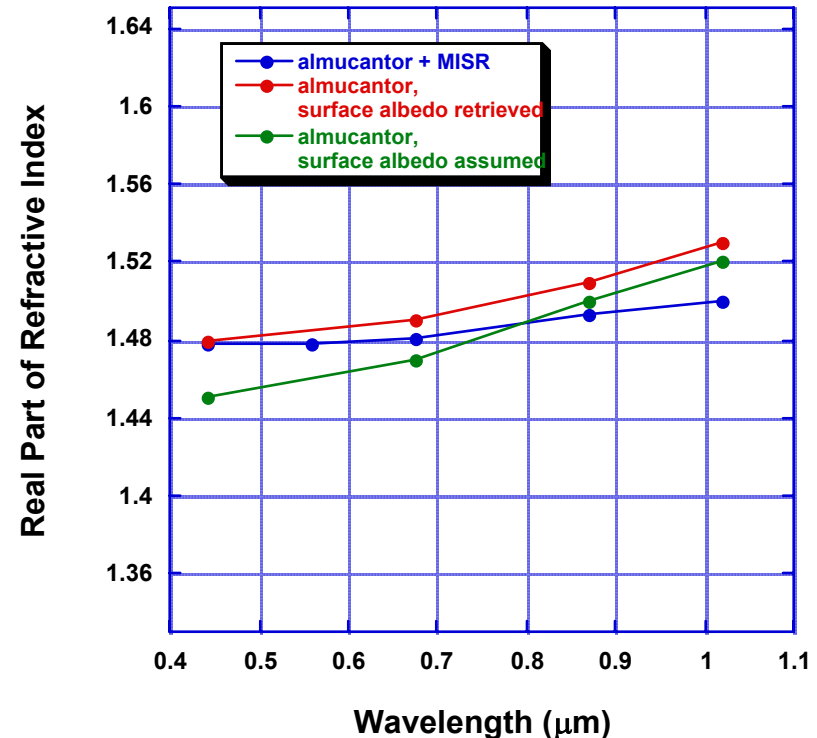
POLDER: June 24, 2003
 $\tau(0.44) \sim 0.26$, SZA=47°

MISR: August 9, 2003
 $\tau(0.44) \sim 0.3$, SZA=40°

Mongu, June 24, 2003



Mongu, August 9, 2003

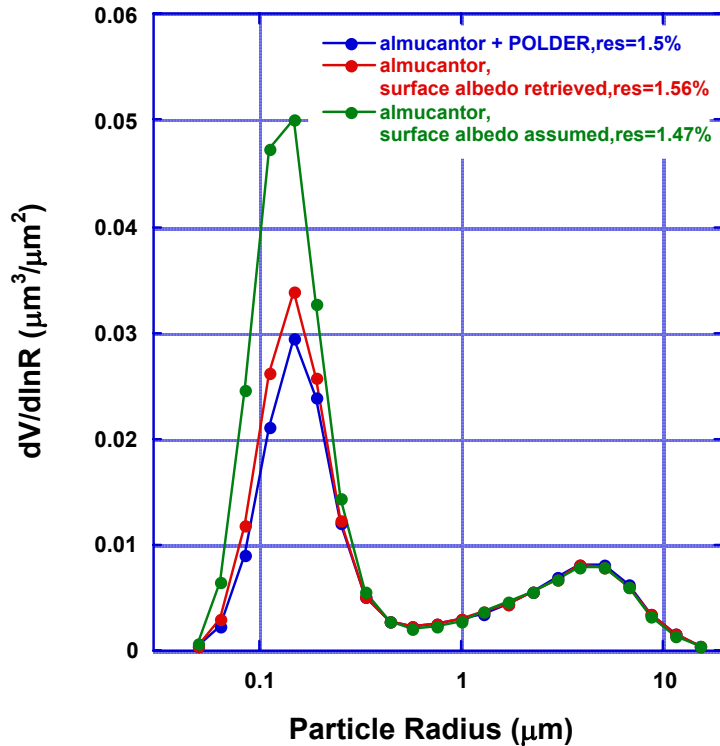


Surface Effect on the Retrievals of the Size Distribution (low aerosol loading)

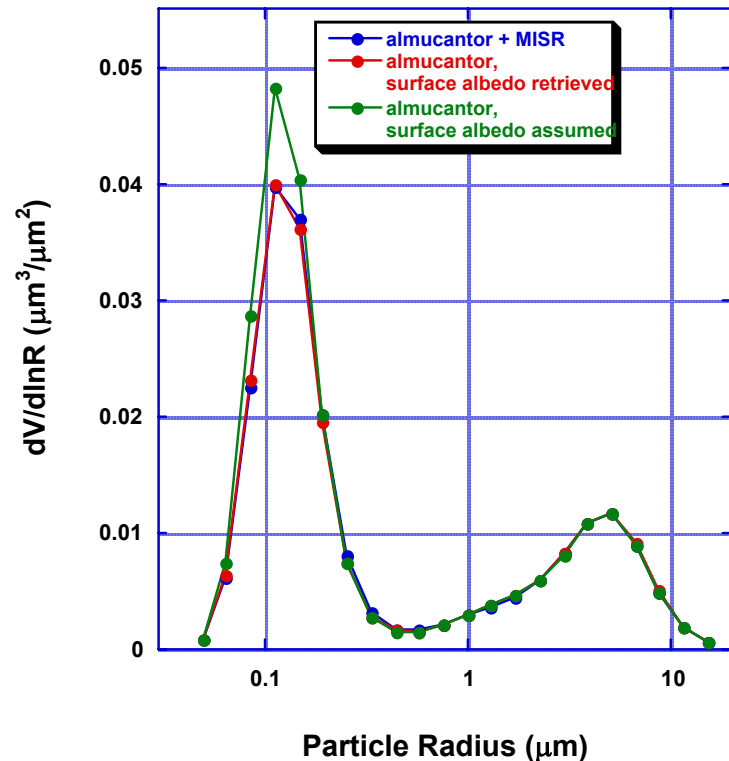
POLDER: June 24, 2003
 $\tau(0.44) \sim 0.26$, SZA=47°

MISR: August 9, 2003
 $\tau(0.44) \sim 0.3$, SZA=40°

Mongu, June 24, 2003



Mongu, August 9, 2003

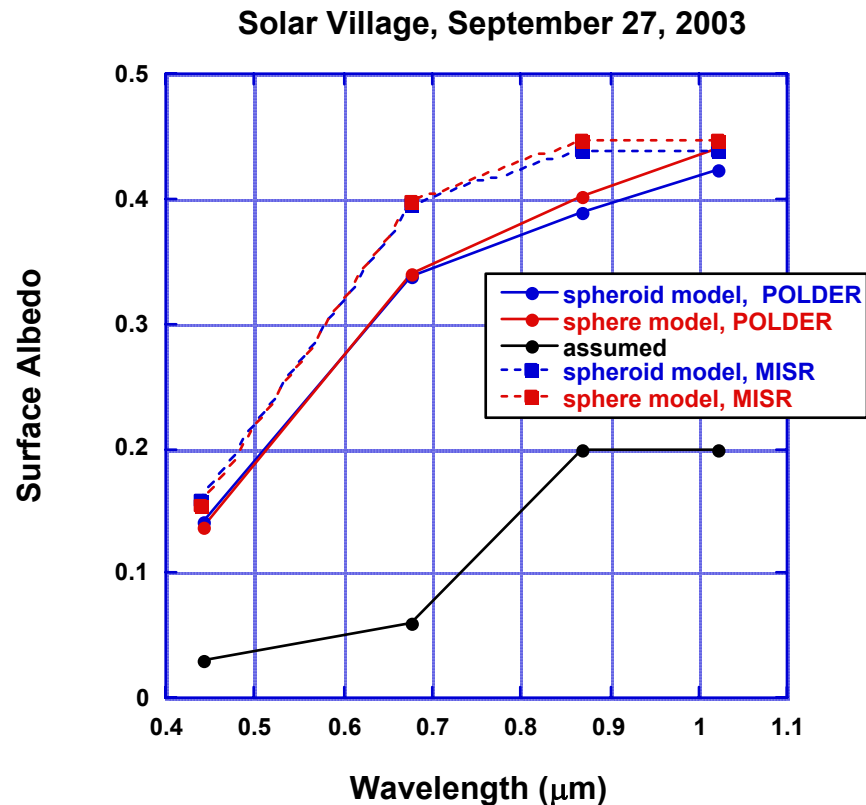
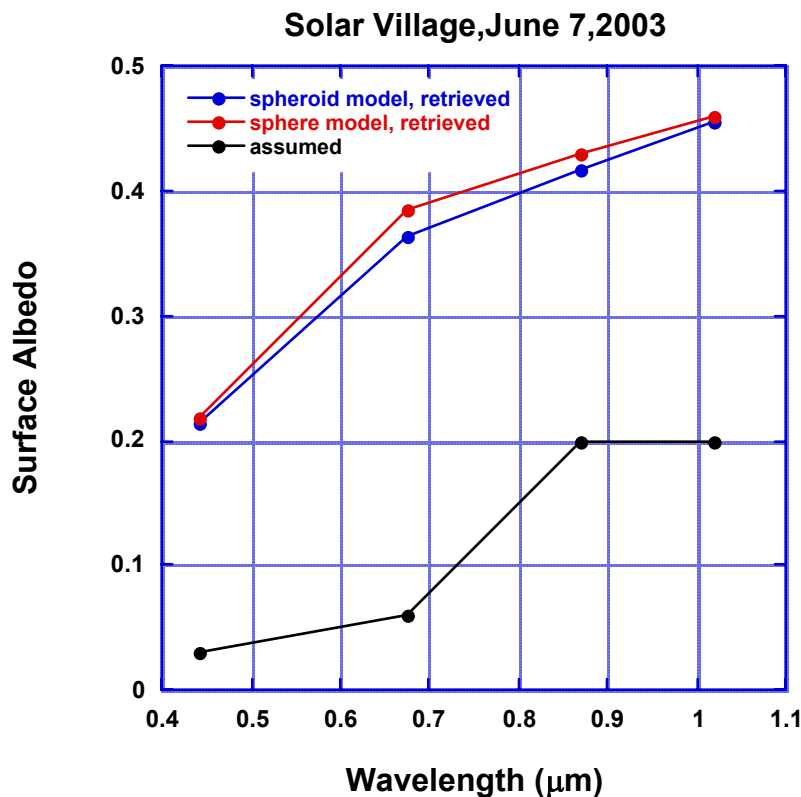


Comparisons of Surface Retrievals (Albedo)

MISR: September 27, 2003
 $\tau(0.44) \sim 0.24$, SZA=31°

POLDER: June 7, 2003
 $\tau(0.44) \sim 0.67$, SZA=23°

POLDER: September 27, 2003
 $\tau(0.44) \sim 0.24$, SZA=34°

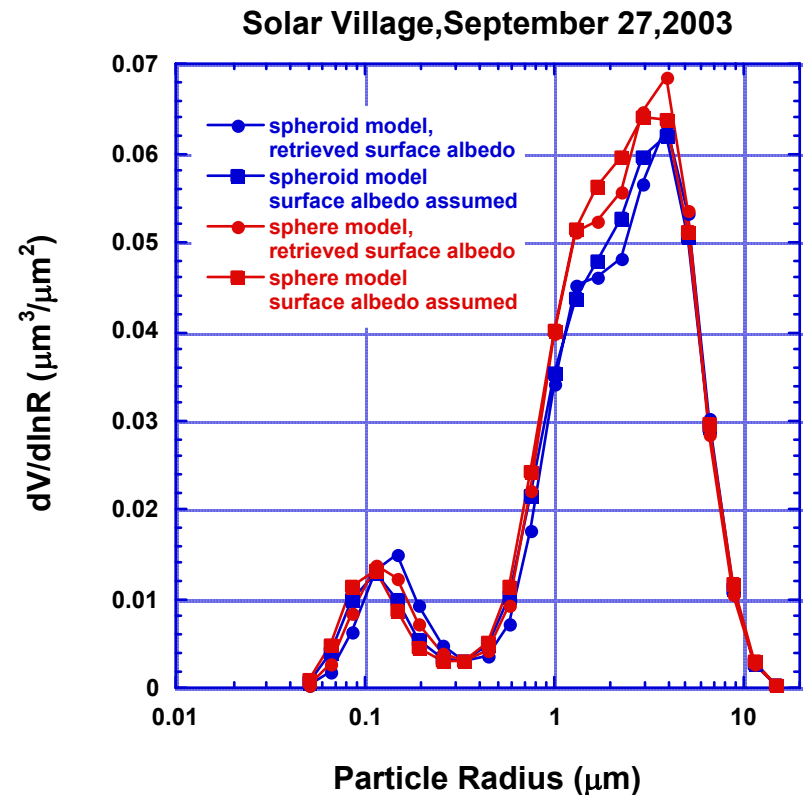
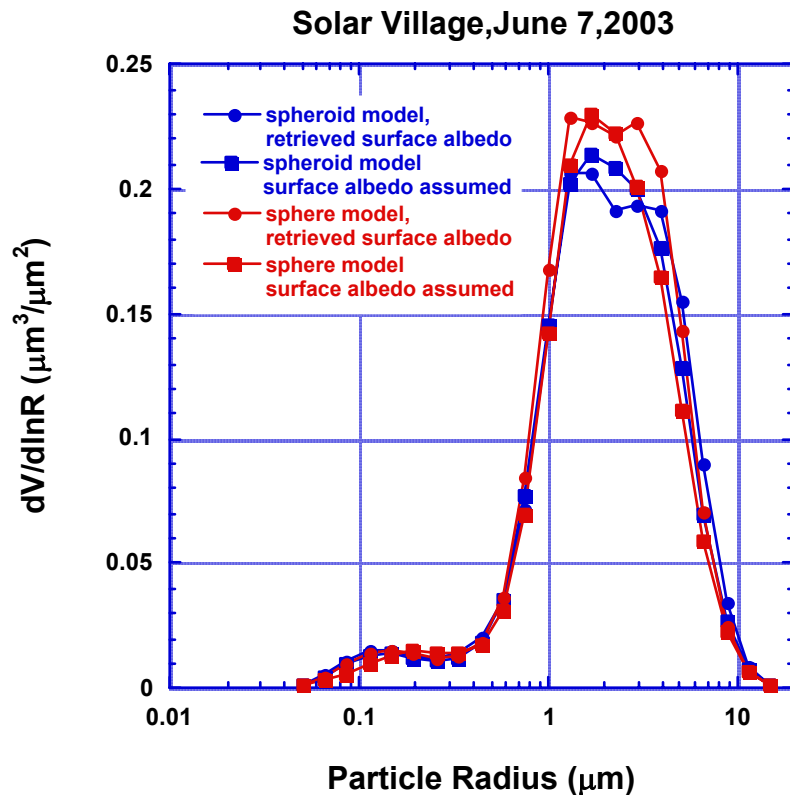


Surface Effect on the Retrievals of Size Distribution

(Principle Plane with corrected surface)

POLDER: June 7, 2003
 $\tau(0.44) \sim 0.67$, $\text{SZA}=70^\circ$

POLDER: September 27, 2003
 $\tau(0.44) \sim 0.24$, $\text{SZA}=70^\circ$



Fitting Accuracy of Radiances

Spheroids and Spheres (principle plane)

Satellite: ~ 1-3%

2.8%

POLDER: September 27, 2003
 $\tau(0.44) \sim 0.24$, SZA=34°

5.5%

