



The Abdus Salam
International Centre for Theoretical Physics



2256-8

Workshop on Aerosol Impact in the Environment: from Air Pollution to Climate Change

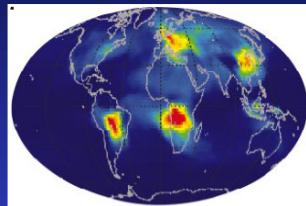
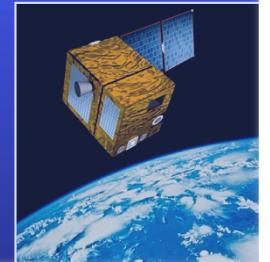
8 - 12 August 2011

Potential of aerosol properties from enhanced satellite observations

O. Dubovik

Lab. d'Optique Atmosphérique, Lille, France

Potential of aerosol remote sensing from space



Oleg Dubovik

*Science and Technology University of Lille, CNRS, France
NASA/GSFC, Greenbelt, USA*

- ✓ Aerosol retrieval from of the satellite;
- ✓ Inverse modeling
- ✓ Improved POLDER/PARASOL algorithm

Main passive aerosol remote sensing observations

■ MODIS

Reflectance at

7 channels: 0.47, 0.55, 0.66, 0.87, 1.2, 1.6, 2.1



Global Coverage!!!
Good spectral range!

■ MISR

Reflectance at

4 channels: 0.45, 0.55, 0.67, 0.87 mm

9 viewing angles: $\pm 70.5^\circ$, $\pm 60^\circ$, $\pm 45.6^\circ$, $\pm 26.1^\circ$, 0°



Sensitive to
Particle shape!!!

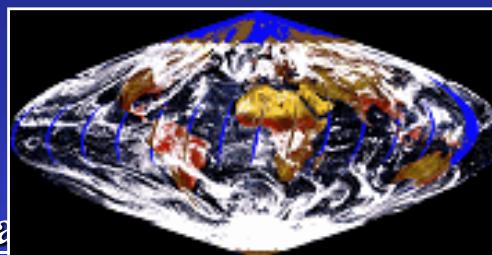
■ POLDER

Reflectance at

8 channels: 0.44, 0.49, 0.56, 0.67, 0.76, 0.87, 0.91, 1.02

13 viewing angles

Polarization at: 0.44, 0.67, 0.87



Global Coverage!!!
Sensitive to
Refractive index,
Particle shape.

■ AERONET Ground-based Sun-sky radiometers

- $\tau(\lambda) \pm 0.02$ at

6 channels: 0.34, 0.38, 0.44, 0.67, 0.87, 1.02, **1.65** μm

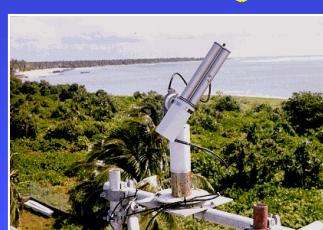
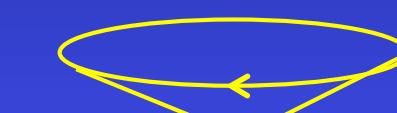
- $I(\lambda, \Theta) \pm 0.05\%$

6 channels: **0.38**, 0.44, 0.67, 0.87, 1.02, **1.65** μm

$3^\circ \leq \text{scattering angles} \leq \sim 150^\circ$

- $P(\lambda, \Theta) \pm 0.02\%$ at

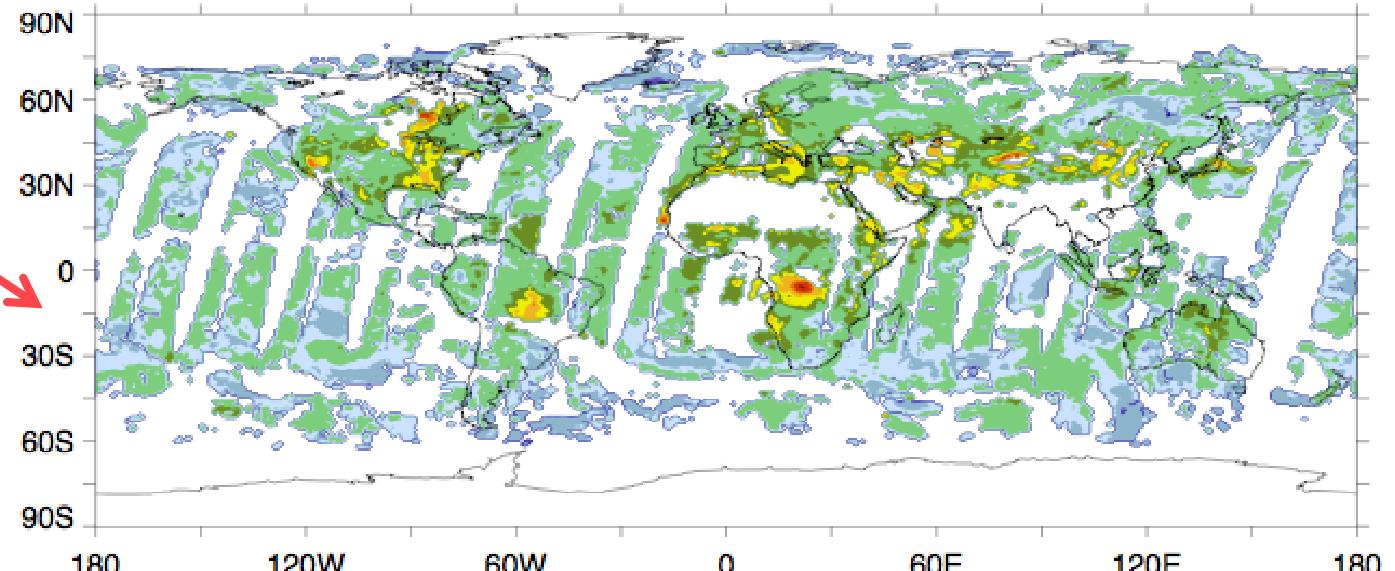
6 channels: **0.38, 0.44, 0.67, 0.87, 1.02, 1.65** μm



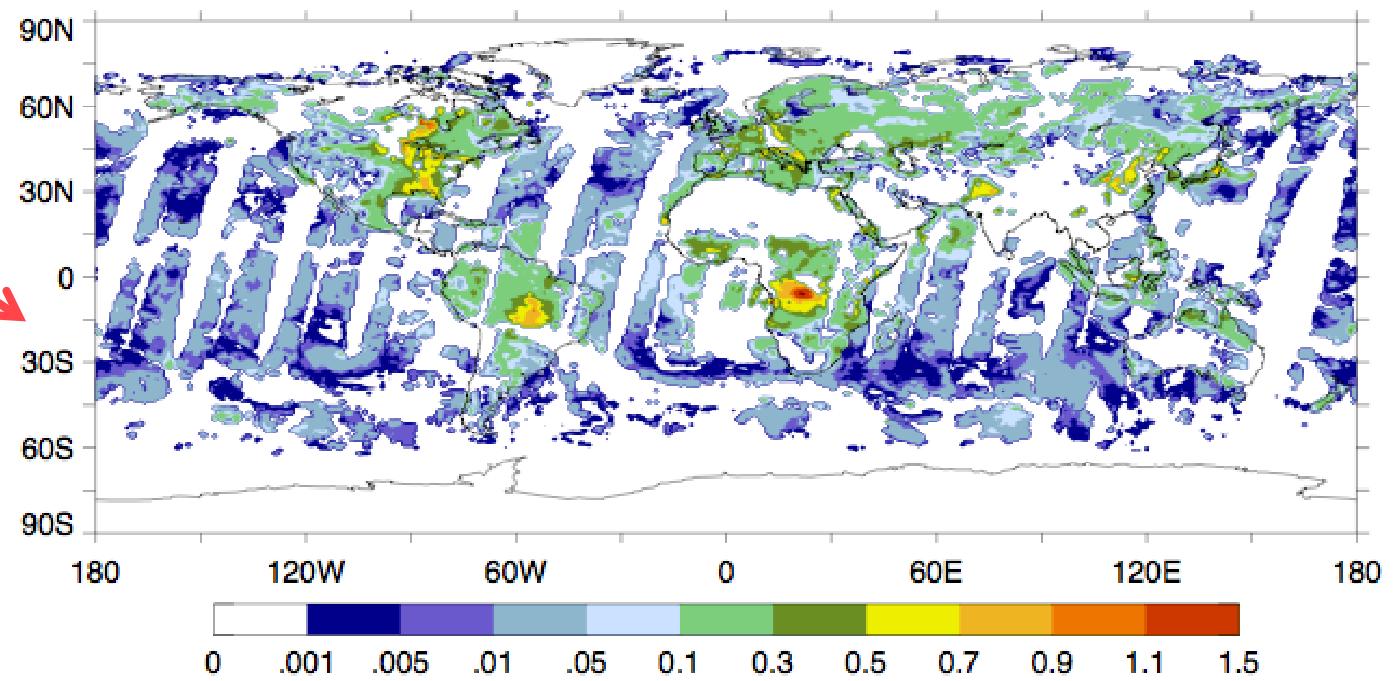
Very Sensitive to
Loading, size,
Particle shape
Absorption !!!

MODIS Aerosol Product for 24 hours

MODIS $\tau_{\text{total}}(0.55)$
(Total AOD degraded
to $2^{\circ} \times 2.5^{\circ}$)

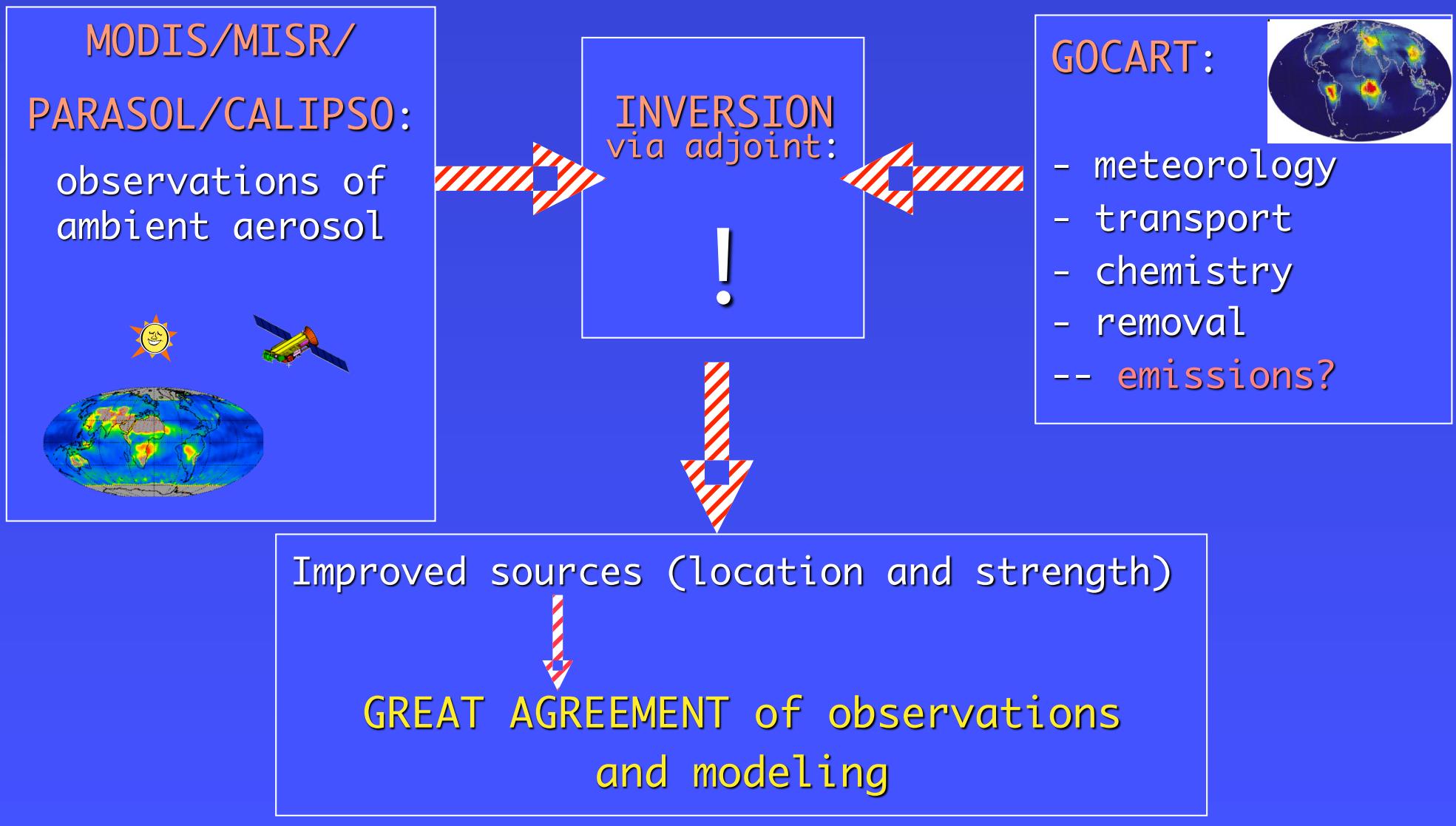


MODIS $\tau_{\text{fine}}(0.55)$
(Fine Mode AOD
(degraded to $2^{\circ} \times 2.5^{\circ}$)

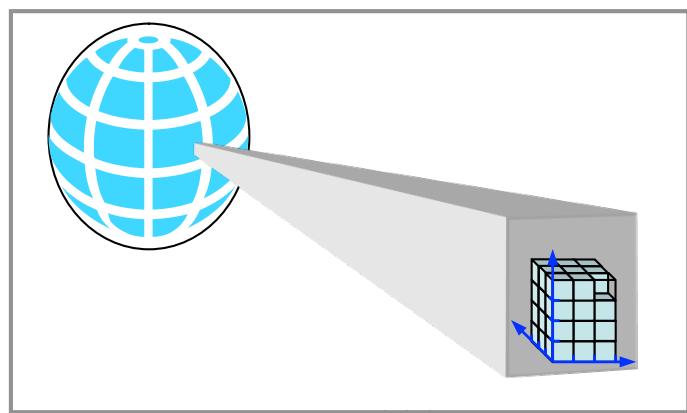


Retrieving aerosol emissions from satellites by GOCART inverse modeling

O. Dubovik, T. Lapyonok, Y. Kaufman, M. Chin,



Vector of global aerosol mass



$$\mathbf{M} = \begin{pmatrix} M_{N_p} \\ M_{(N_p-1)} \\ \dots \\ M_{(p+1)} \\ M_p \\ M_{(p-1)} \\ \dots \\ M_2 \\ M_1 \end{pmatrix}$$

Vector elements - values of aerosol mass :

$$M_p = m(t_i, x_j, y_k, z_n) \quad (p = 1, \dots, N_p)$$

Time and space coordinates

$$z_n = n \times \Delta z \quad (n = 1, \dots, N_z)$$

$$y_k = k \times \Delta y \quad (k = 1, \dots, N_y)$$

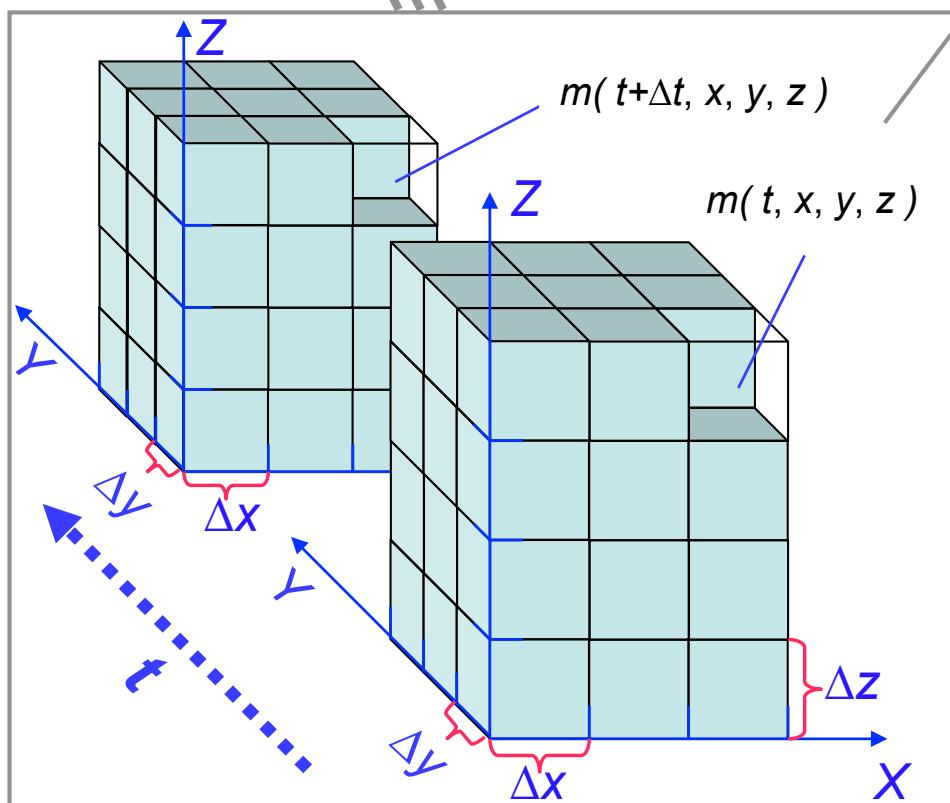
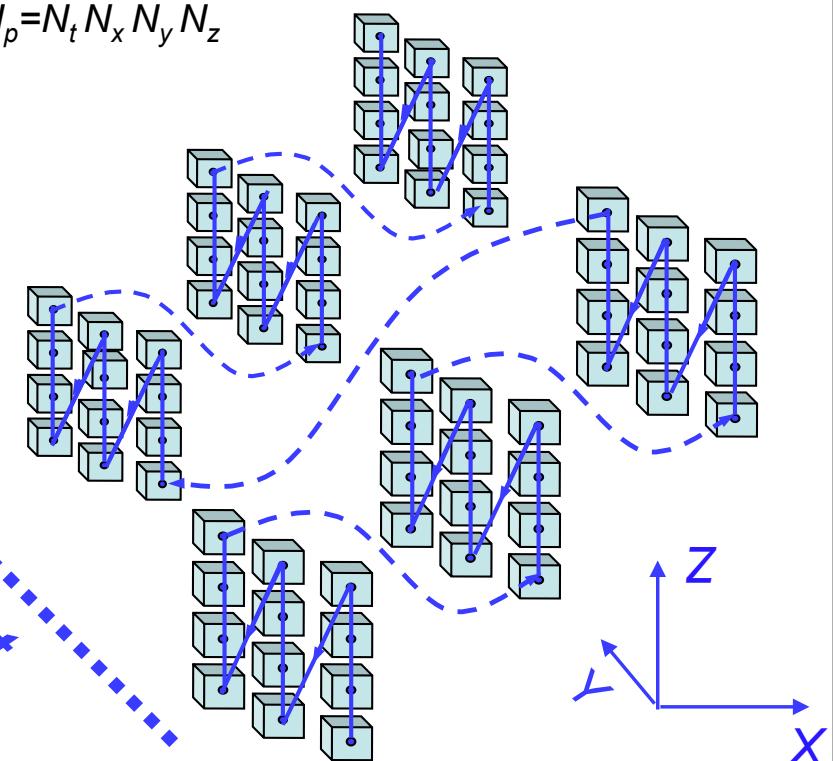
$$x_i = j \times \Delta x \quad (j = 1, \dots, N_x)$$

$$t_i = i \times \Delta t \quad (i = 1, \dots, N_t)$$

Index convention:

$$p = (i-1) N_x N_y N_z + (j-1) N_y N_z + (k-1) N_z + n$$

$$N_p = N_t N_x N_y N_z$$



Aerosol Transport:

Basic relationship:

$$M(\mathbf{x}, t + \Delta t) = T(\mathbf{x}, t) (M(\mathbf{x}, t) + S(\mathbf{x}, t)) \Delta t$$

$M(\mathbf{x}, t)$ -mass

$S(\mathbf{x}, t)$ -emission

Transport processes:

(advection, diffusion, dry deposition,
cloud convection, wet removal, etc.)

$$T(\mathbf{x}, t) = T_n T_{n-1} \dots T_2 T_1$$

Integral form :

$$M(\mathbf{x}, t) = \int_{t_0}^t T(\mathbf{x}, t) (M(\mathbf{x}, t) + S(\mathbf{x}, t)) dt$$

Matrix approximation:

$$\mathbf{M}(\mathbf{x}, t) = \mathbf{T}(\mathbf{x}, t) (\mathbf{M}(\mathbf{x}, t_0) + \mathbf{S}(\mathbf{x}, t))$$

Transport Inversion:

$$M(x,t) = T(x,t) S(x,t)$$

Aerosol
Mass

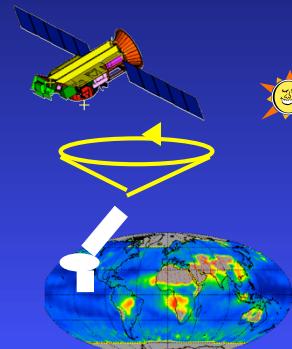
Transport
Operator

Source -
Aerosol Emission

**Least Square
Method:**

$$\hat{S} = \left(T^T C^{-1} T \right)^{-1} T^T C^{-1} M^*$$

Measured
Aerosol Mass



Dimension of the Problem:

$$M(x,t)$$



Longitude Points (~144)
X
Latitude Points (~91)
X
Vertical Layers (~30)
X
Time steps (~12 days)
 $= \sim 5,000,000$

$$S(x,t)$$



Longitude Points (~144)
X
Latitude Points (~91)
X
Time steps (~12 days)
 $= \sim 200,000$

$$T(x,t)$$



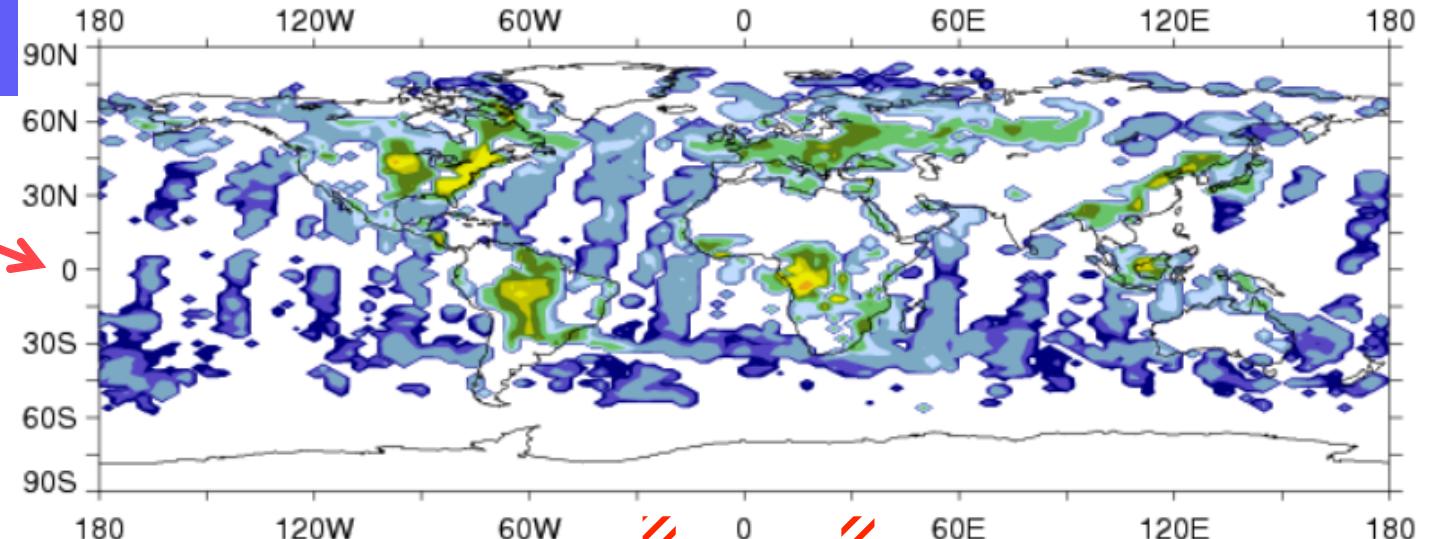
$5,000,000 \times 200,000$

Fine Mode Aerosol:

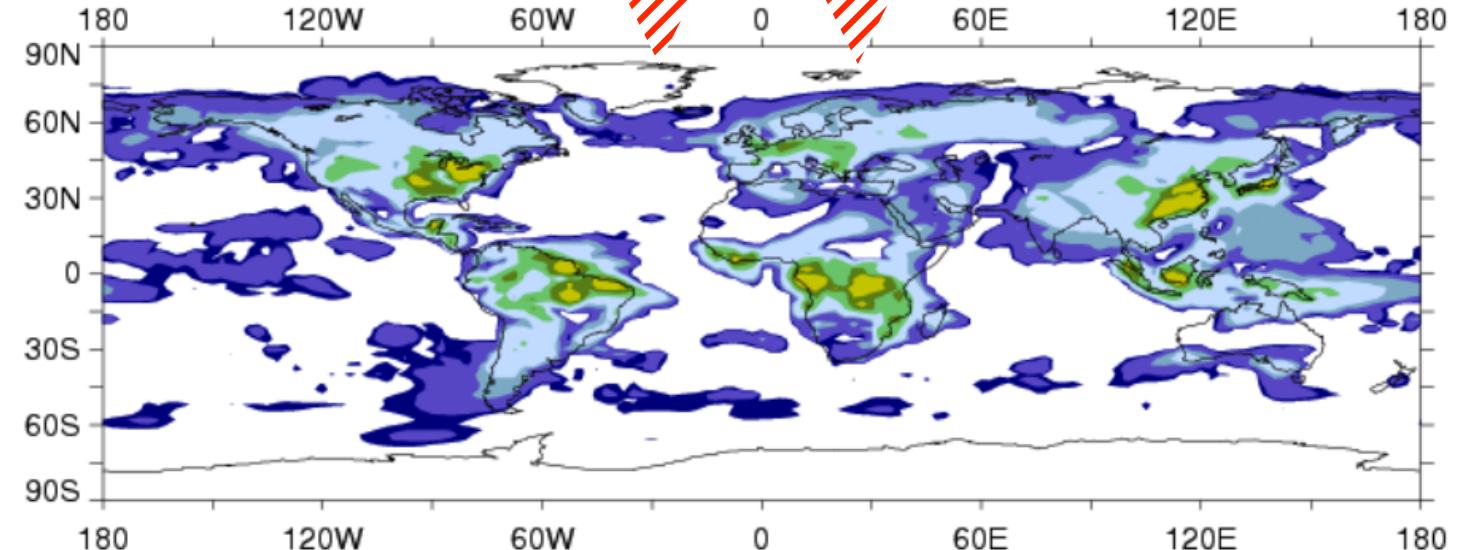
Black Carbon +
Organic Carbon +
Sulfate + ...

August 20 - 28, 2000

**MODIS+AERONET
Observations
(opt. thickness)**



**Retrieved
Emission**



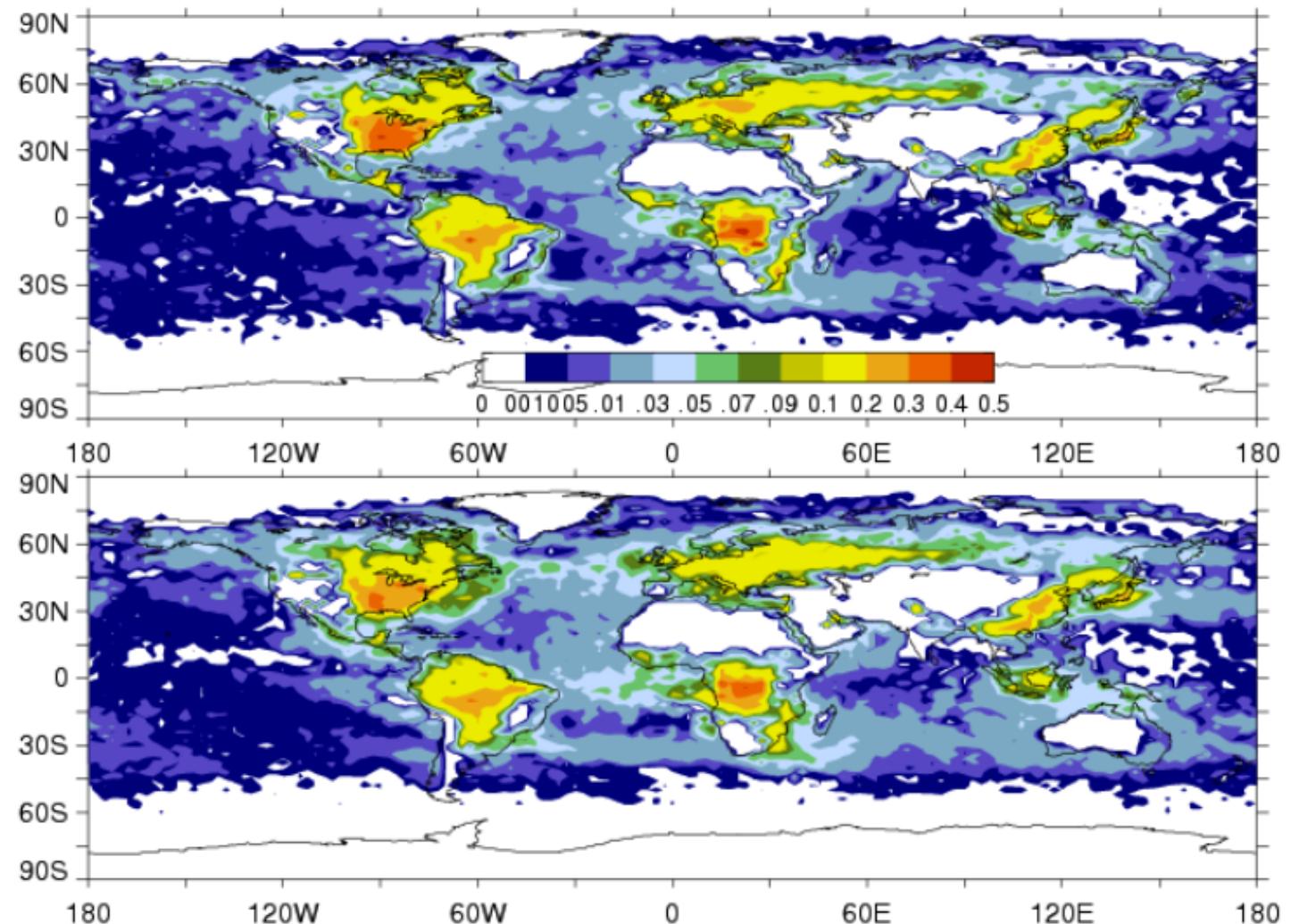
9 day average, Optical Thickness retrieval is NOT CONSTRAINED to the land

$\sigma_{\text{fit}} < \sim 0.04$ (for instantaneous τ values)

Optical Thickness
(August 20-28, 2000)

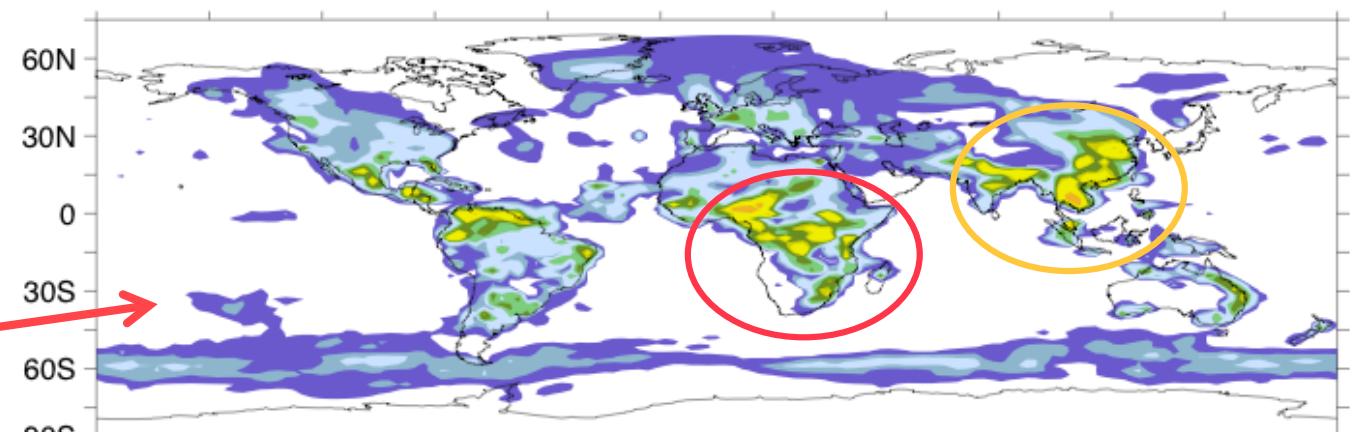
MODIS+AERONET
Observations
(Fine Mode opt.
Thickness,
(degraded to $2^{\circ} \times 2.5^{\circ}$)

Model output
using retrieved
emission

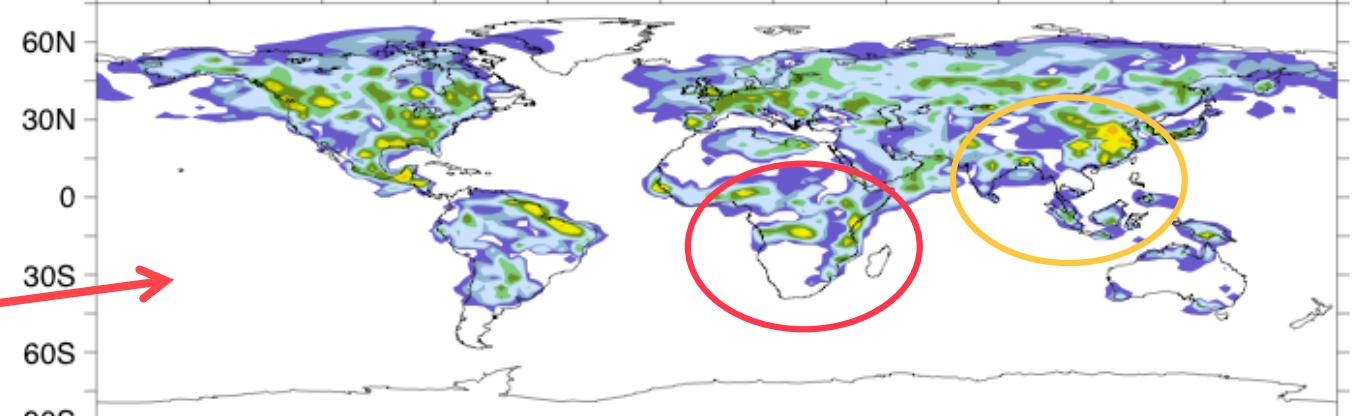


Fine Mode Aerosol: Monthly retrievals

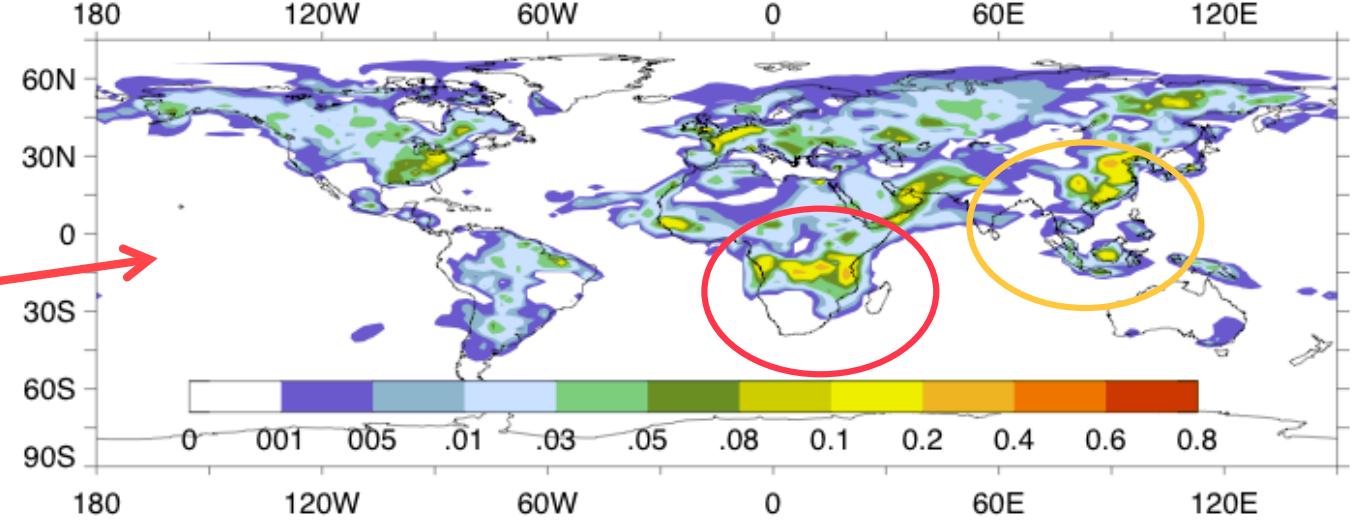
February 2001



May 2001



July 2001



0 .001 .005 .01 .03 .05 .08 .01 .02 .04 .06 .08

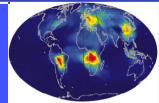
Model ≠ Observations

GOCART

output

MASS: $M(x; y; z; t)$

$2^\circ \times 2.5^\circ$, ~20 min



Components:

- BC (hydrophilic)
- BC (hydrophobic)
- OC (hydrophilic)
- OC (hydrophobic)_h
- sulfates
- dust (7 sizes) O
- sea salt(4 sizes)



MODIS

products

Aerosol optical thickness:
 $\tau(x; y; t)$



$1^\circ \times 1^\circ$,
global coverage
in ~2 days

Components:

- $\tau_{\text{fine}}(0.55\mu\text{m})$
- $\tau_{\text{coarse}}(0.55\mu\text{m})$



Better satellite
Product is
needed !!!

POLDER/PARASOL



- PARASOL (POLDER1&2)
 - Launches Dec., 2004
 - 705km polar orbit, ascending (1:30pm)
- Sensor Characteristics
 - 9 spectral bands ranging from 0.45 to 0.910 μm
 - Wide field of view lens : $\pm 51^\circ$ along track, $\pm 43^\circ$ cross track
Swath* : 1600 km ; 2100km along track
 - Up to 16 viewing directions
 - Spatial resolution: 5.3 km x 6.2 km

“independent” POLDER/PARASOL measurements :



GLOBAL: every 2 days *SPATIAL RESOLUTION*: $5.3\text{km} \times 6.2\text{km}$

VIEWS: $N_\Theta = 16$: ($80^\circ \leq \Theta \leq 180^\circ$)

INTENSITY: $N_\lambda^t = 6$: ($0.44, 0.49, 0.56, 0.67, 0.865, 1.02 \mu\text{m}$)

POLARIZATION: $N_\lambda^P = 3$: ($0.49, 0.67, 0.865 \mu\text{m}$)

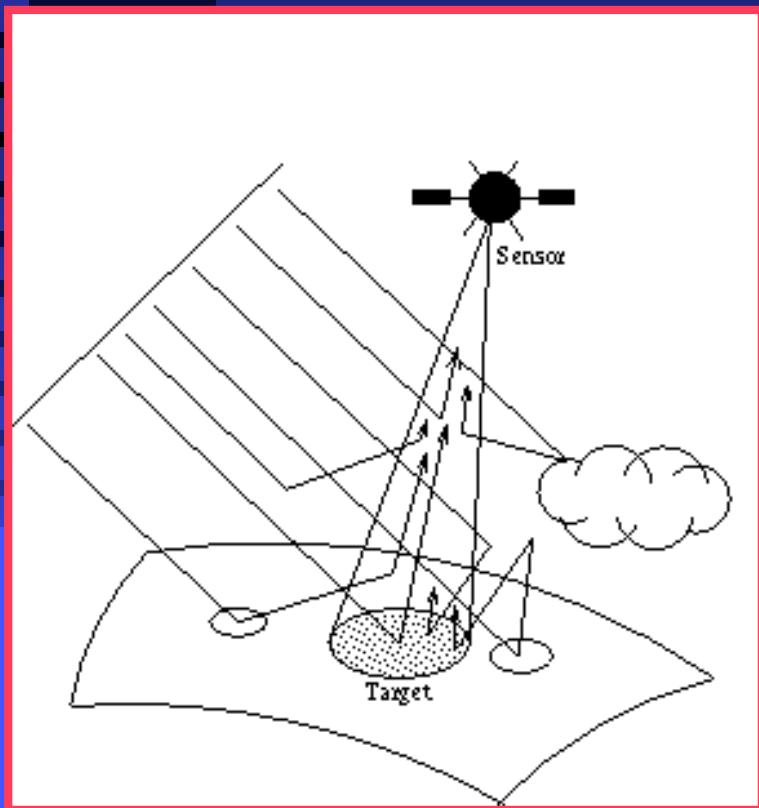
SINGLE OBSERVATION:

$$(N_\lambda^t + N_\lambda^P) \times N_\Theta = (6+3) \times 16 = 144$$

independent measurements

a lot !!!

Look-Up-Table (LUT) – conventional approach for satellite data inversion



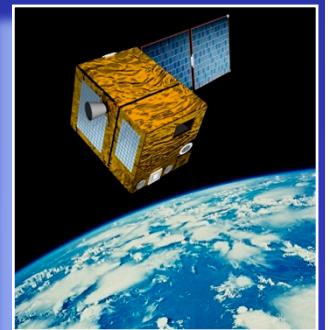
ADVANTAGES:

- simple and usually fast;

ISSUES:

- LUT can be too big for comprehensive satellite observations;
- Retrieval results are limited to a selected set of a priori assumed solutions

Present aerosol retrieval from PARASOL:



Over Ocean (Herman et al., 2005):

- Uses look-up tables
- Fits both intensity and polarizations at 0.67 and 0.87 μm
- Retrieves: AOT of fine and coarse mode, size information, non-sphericity, some height information.
- Issues: does not always provide consistency with other channels

Over Land (Deuzé et al., 2001):

- Uses look-up tables
- Fits only polarizations at 0.67 and 0.87 μm using look-up tables
- Retrieves:
AOT of fine mode only , some size information
- Issues: quite limited

Concept of optimization of aerosol retrieval from PARASOL:



Strategic principles:

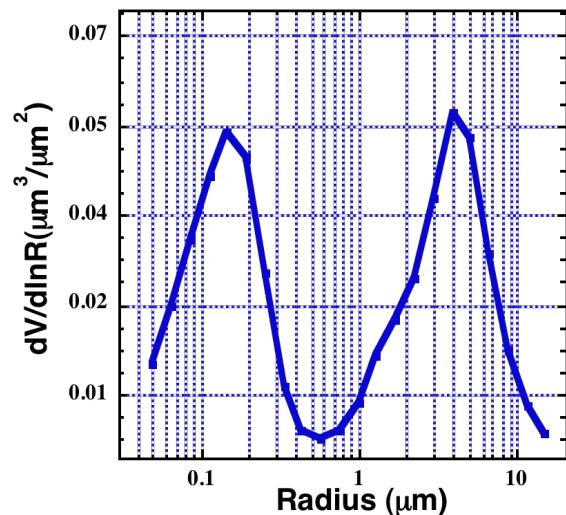
1. *More complete use of PARASOL observation:*
 - always use both intensity and polarization;
 - fit observations from all aerosol informative channels: 0.44, 0.49, 0.55, 0.67, 0.87 and 1.02 μm
2. *Simultaneously retrieve both aerosol and surface (over land)*
3. *Use continues space of solution* (i.e. not look up table)
4. *Use elaborated statistical optimization fitting* (e.g. Dubovik 2004):
 - for each single pixel;
 - multi-pixel retrieval optimization;
 - multi-instrument retrieval optimization

Aerosol is driven by 30 variables in PARASOL retrieval :

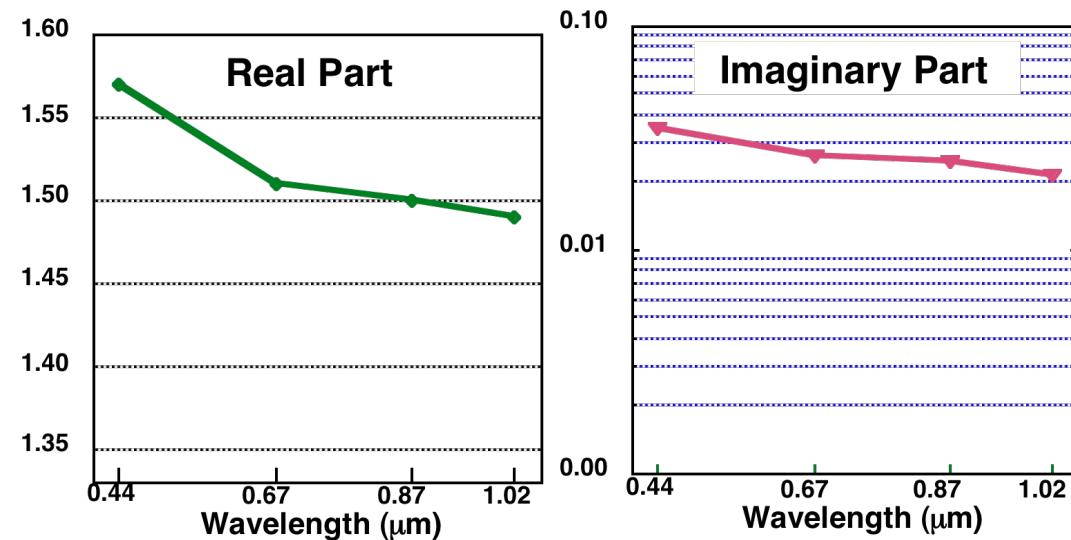
$dV/d\ln r$ - size distribution (~16 values);
 $n(\lambda)$ and $k(\lambda)$ - ref. index (6 +6 values)
 $C_{\text{spher}} (\%)$ - spherical fraction (1 value)
 h_a – mean aerosol height (1 value)

Similar to AERONET model:

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



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



Smoke



Desert Dust



Maritime

Mixing of particle shapes retrieved

$$\tau(\lambda) = C \int_{r_{\min}}^{r_{\max}} K_{\tau}^{\text{spherical}}(k; n; r) V(r) dr + (1 - C) \int_{r_{\min}}^{r_{\max}} \left(\int_{\varepsilon_{\min}}^{\varepsilon_{\max}} K_{\tau}^{\varepsilon}(k; n; r, \varepsilon) N(\varepsilon) d\varepsilon \right) V(r) dr$$

Aspect ratio distr.

spherical:

Randomly oriented spheroids :
(Mishchenko et al., 1997)

Phase Function (0.532 μm)

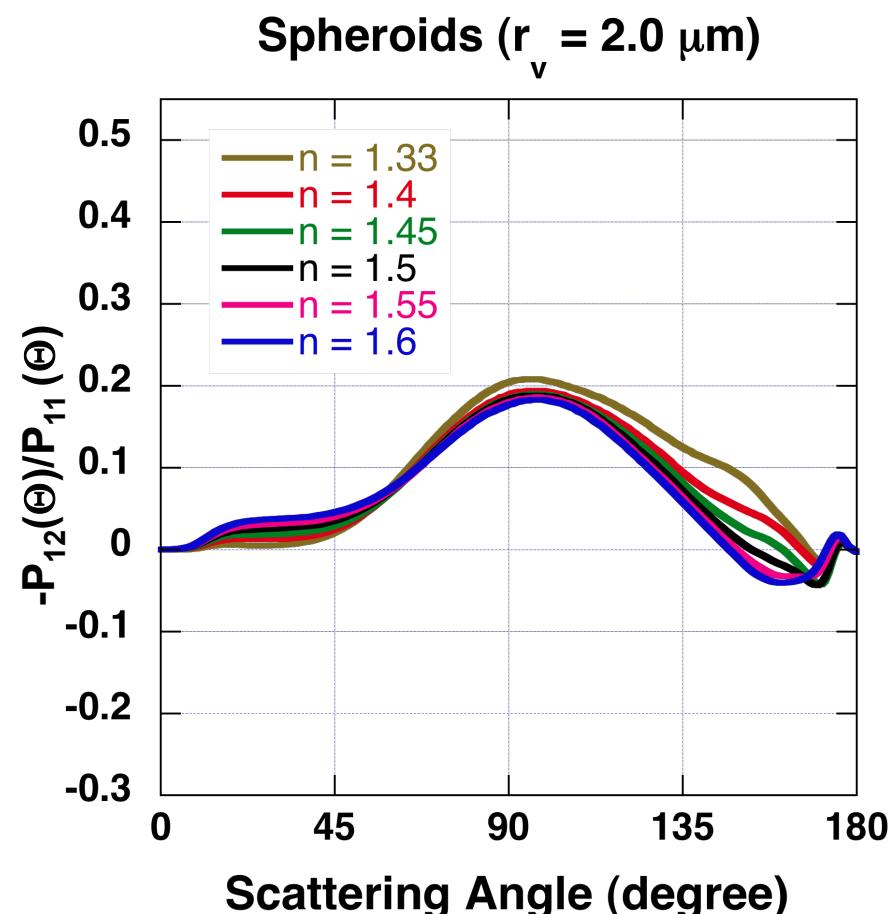
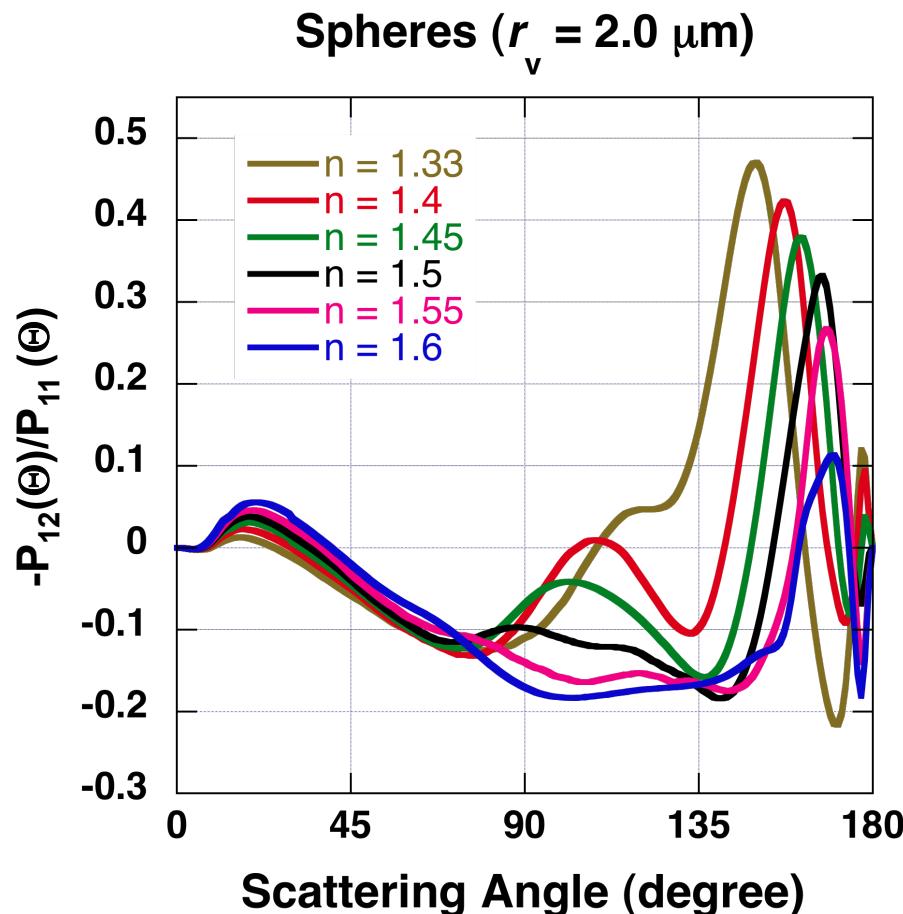
Scattering Angle (degrees)

ASSUMPTIONS:

- dV/dr - volume size distribution is the same for both components;
- non-spherical - mixture of randomly oriented polydisperse spheroids;
- aspect ratio distribution $N(\varepsilon)$ is fixed to the retrieved by Dubovik et al. 2006

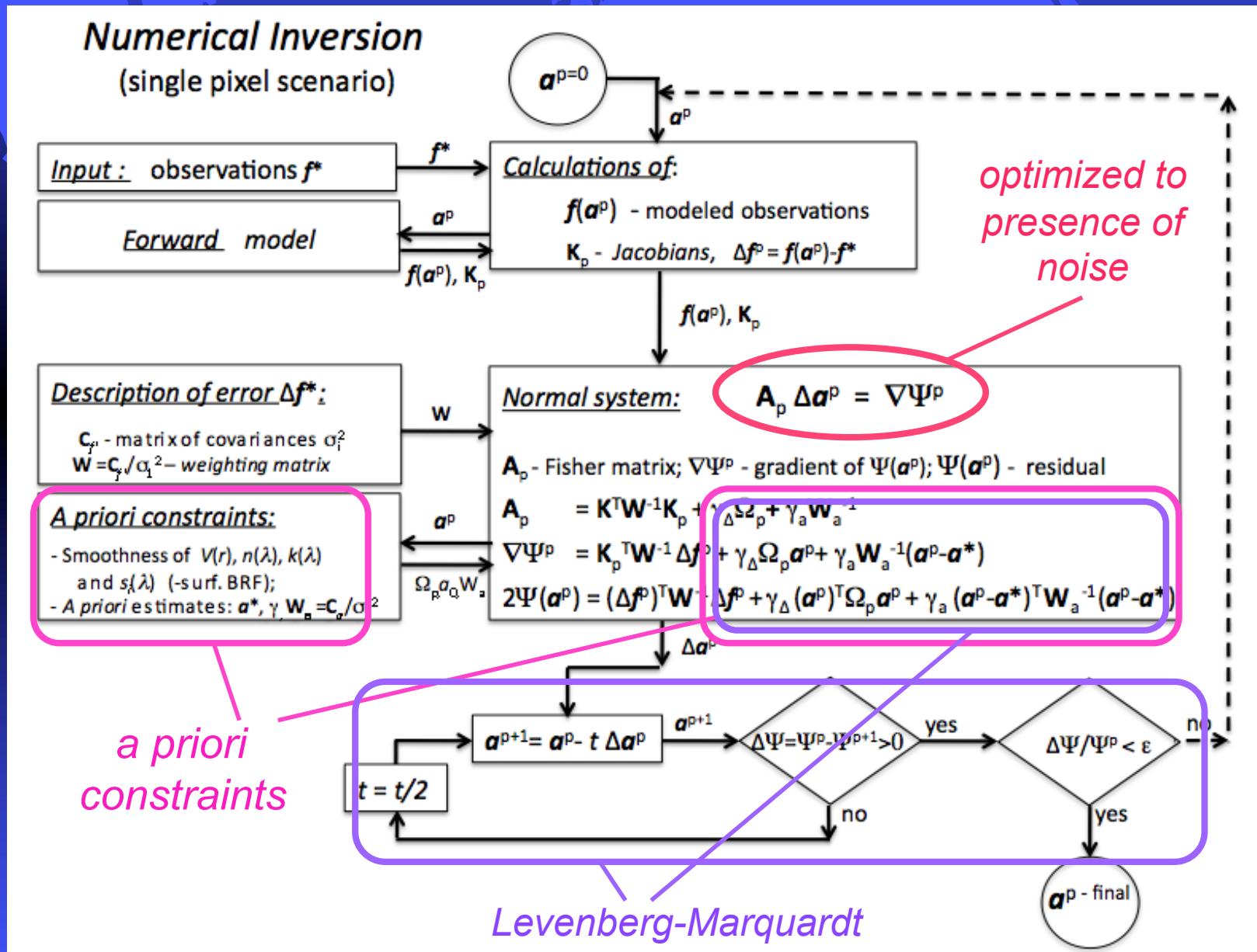
Sensitivity of polarization to particle shape

Coarse
aerosol



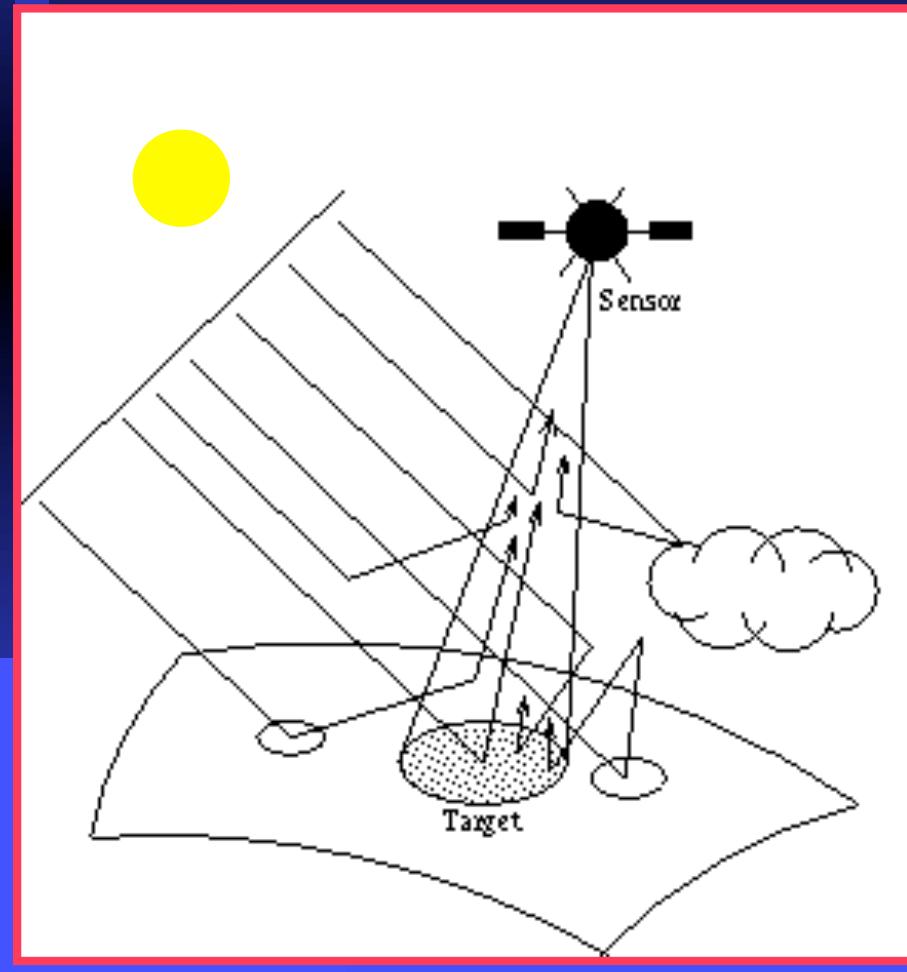
« AERONET like » statistically optimized « no look-up tables » inversion

Dubovik et al., AMT, 2011

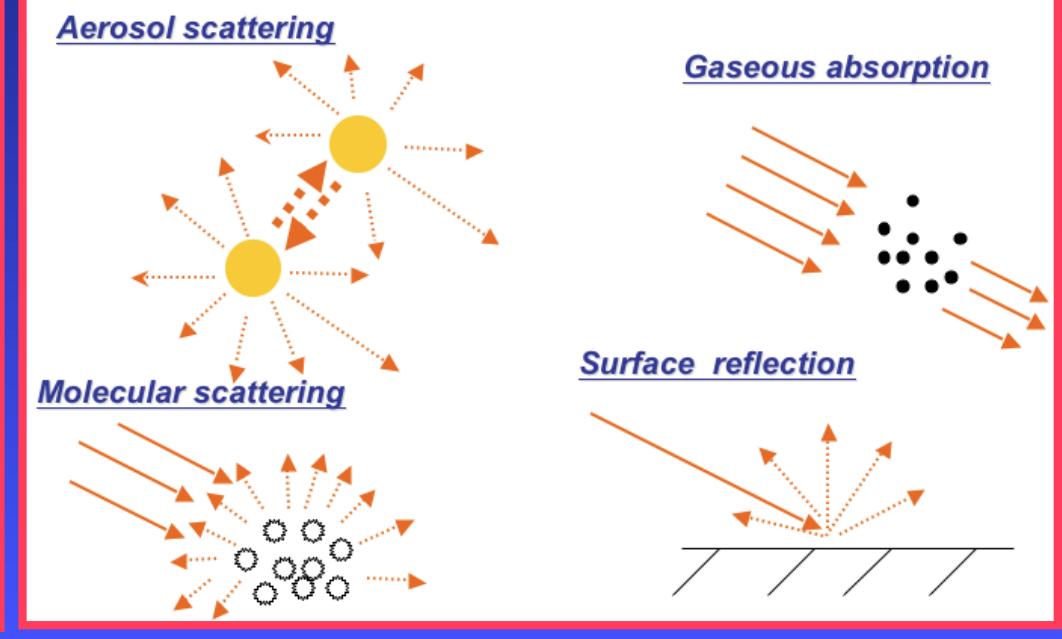


Remote Sensing from Satellite (using the solar spectrum)

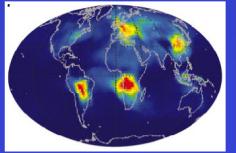
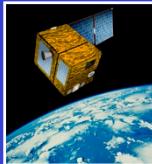
ISSUE: to distinguish aerosol contributions



Multiple scattering



Forward Model



Vector of retrieved parameters :

\mathbf{a}^{aer} - aerosol properties

\mathbf{a}^{surf} - surface properties

$\downarrow \mathbf{a}^{\text{aer}}$

$\downarrow \mathbf{a}^{\text{surf}}$

Aerosol single scattering :

Provides: $\tau(\lambda)$, $\omega_0(\lambda)$, $P_{ii}(\lambda, \Theta)$

$\tau, \omega_0, P_{ii}(\dots) \downarrow$

Surface reflectance :

Provides: Bi-directional Reflection Function (BRF) Bi-directional Polarized Reflection Function (BPRF)

$\downarrow \text{BRDF, BPRF}$

Full radiative transfer model :

Calculates detailed distribution of atmospheric radiances: $F(\lambda, \Theta, \dots)$

fixed a priori :

- molecular scattering;
- gaseous absorption;
- vertical profile of aerosol

Simulated satellite observations: $f(\mathbf{a}^p)$

« *Blind* » Test of aerosol retrieval over dark surface

Kokhanovsky, et al, The inter-comparison of major satellite aerosol retrieval, Atmos. Meas. Tech., 3, 909–932, 2010.

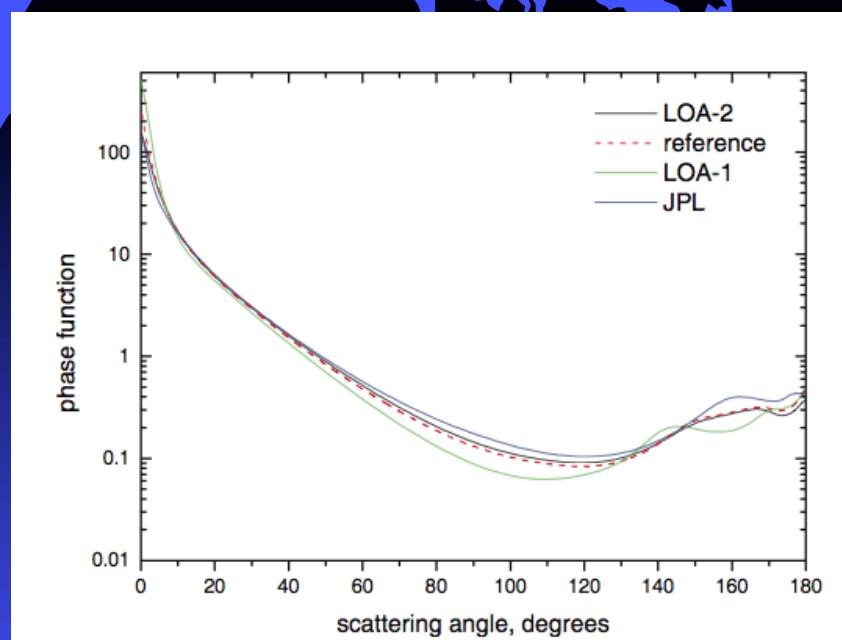
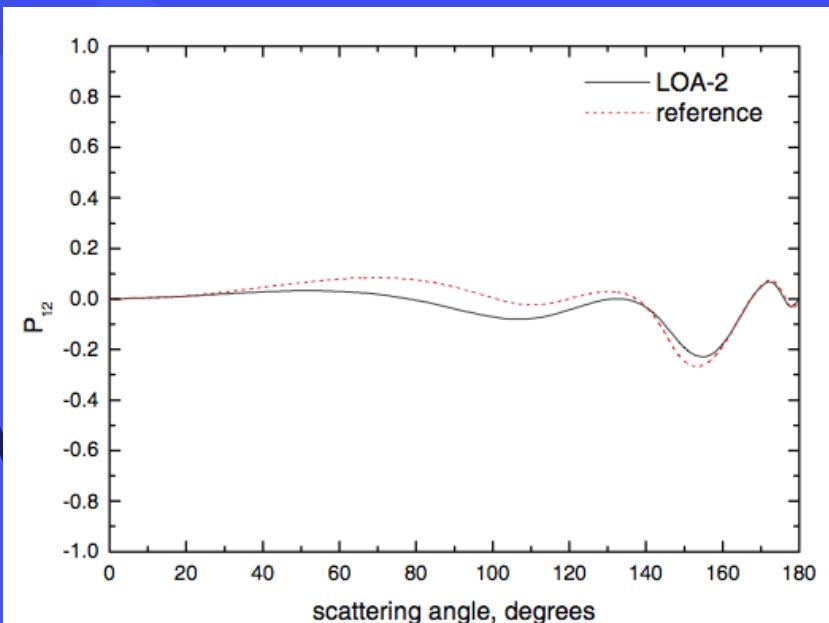
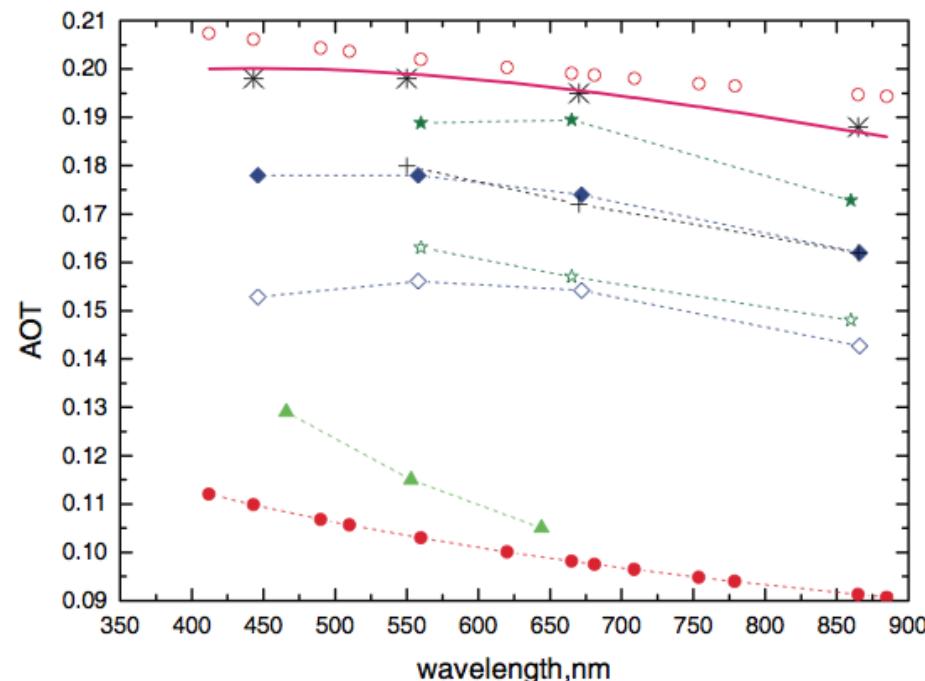
8 algorithms/5 instruments

NASA/MODIS	USA	LUT
NASB/MERIS	Belarus	RT
Swansea/AATSR	UK	RT
Oxford/AATSR	UK	LUT
JPL/MISR	USA	LUT
PSI/MISR	Switzerland	LUT
LOA-1/POLDER	France	LUT
LOA-2/POLDER	France	RT

Tests over dark surface (``Blind'' Test)

Kokhanovsky, et al, *The inter-comparison of major satellite aerosol retrieval, Atmos. Meas. Tech., 3, 909–932, 2010.*

- MERIS/NASB-1
- MERIS/NASB-2
- ▲ MODIS/NASA
- ◇ MISR/PSI
- ◆ MISR/JPL
- + POLDER/LOA-1
- * POLDER/LOA-2
- ★ AATSR/SU
- AATSR/OU



Bi-Directional Surface Reflectance

$$\rho_{\text{sfc}}(\vartheta_1, \varphi_1; \vartheta_2, \varphi_2) = \rho_0 M_i(k) F_{HG}(\Theta) H(h)$$

To be retrieved in each wavelength

ρ_0

- controls amplitude level

k

- controls bowl/bell shape

Θ

- controls forward/backward scattering

h

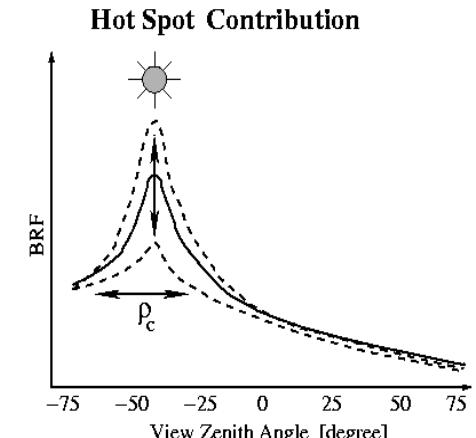
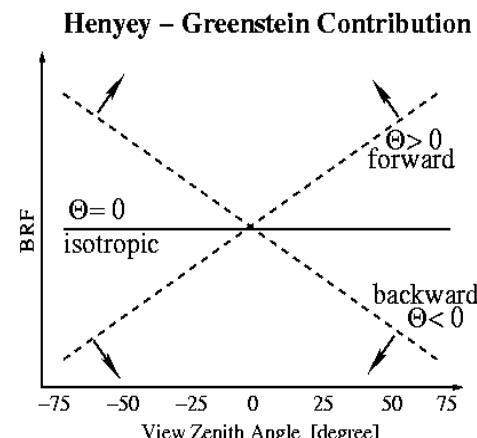
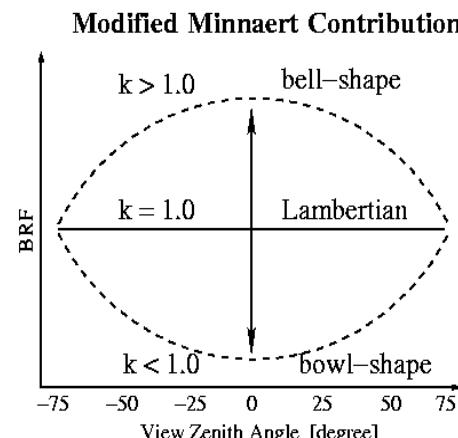
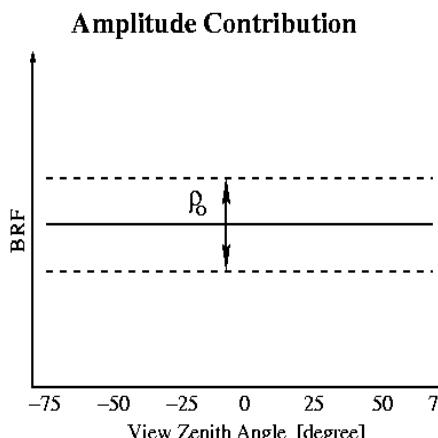
- controls hot spot peak

ρ_0

k

Θ

h



Polarized Reflectance of the Surface:

1. Nadal and Bréon, (1999):

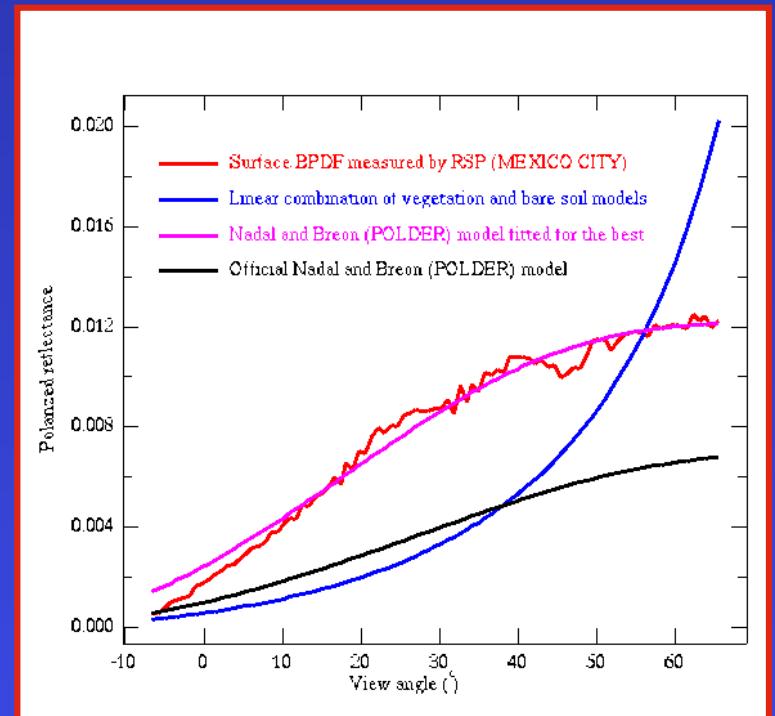
$$R_p^{\text{surf}}(\theta_s, \theta_v, \varphi_r) = \alpha \left[1 - \exp\left(-\beta \frac{F_p(\gamma)}{\mu_s + \mu_v}\right) \right]$$

(α and β - empirical parameters)

2. Maignan et al., (2009):

$$R_p^{\text{surf}}(\theta_s, \theta_v, \varphi_r) = \frac{B \exp(-\tan(\alpha_i)) \exp(-v) F_p(\gamma)}{4(\mu_0 + \mu_l)}$$

(B - empirical parameter)



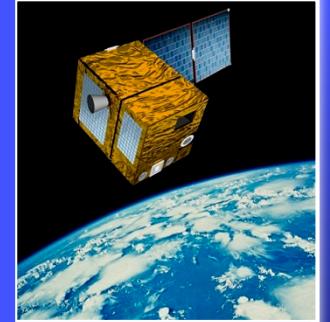
F. Waquet

**Spectrally
independent !!!**

parameters to retrieve:

AEROSOL:

- $dV(r)/dlnr$ (16 bins from 0.07 to 10 mm); $N_r = 16$
- $n(\lambda)$ $N_\lambda = 6$
- $k(\lambda)$ $N_\lambda = 6$
- Fraction of spherical particles $N_\lambda = 1$
- Aerosol height $N_\lambda = 1$

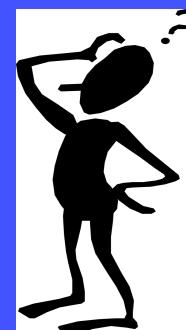


SURFACE:

- BRF (3 parameters for each λ) $N = 3 \times 6 = 18$
- BPRF (parameters for each) $N_\lambda = 6$



TOTAL = 54

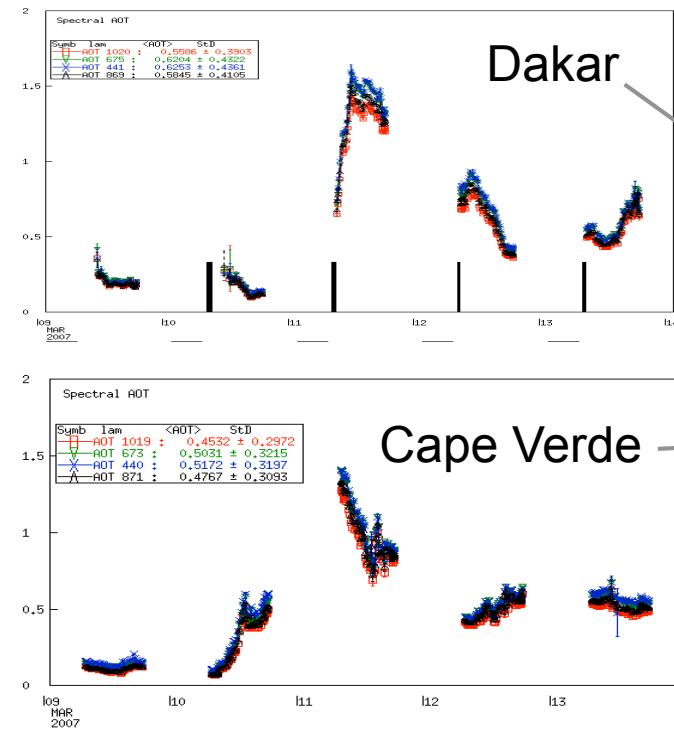


Satellite aerosol retrievals have some fundamental limitations, especially in some “difficult conditions” e.g. over bright surfaces.

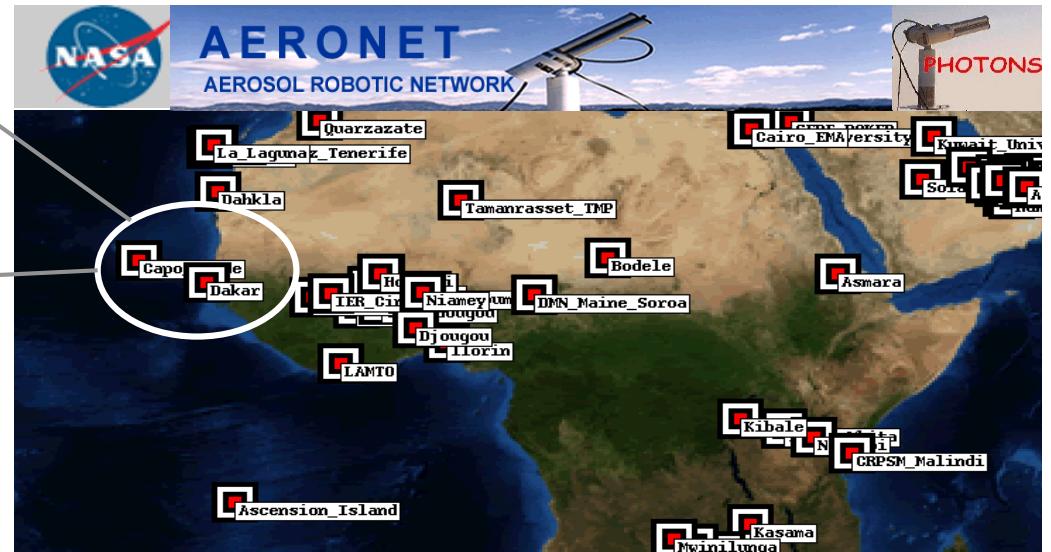


Some additional constraint on the retrieval could do good...

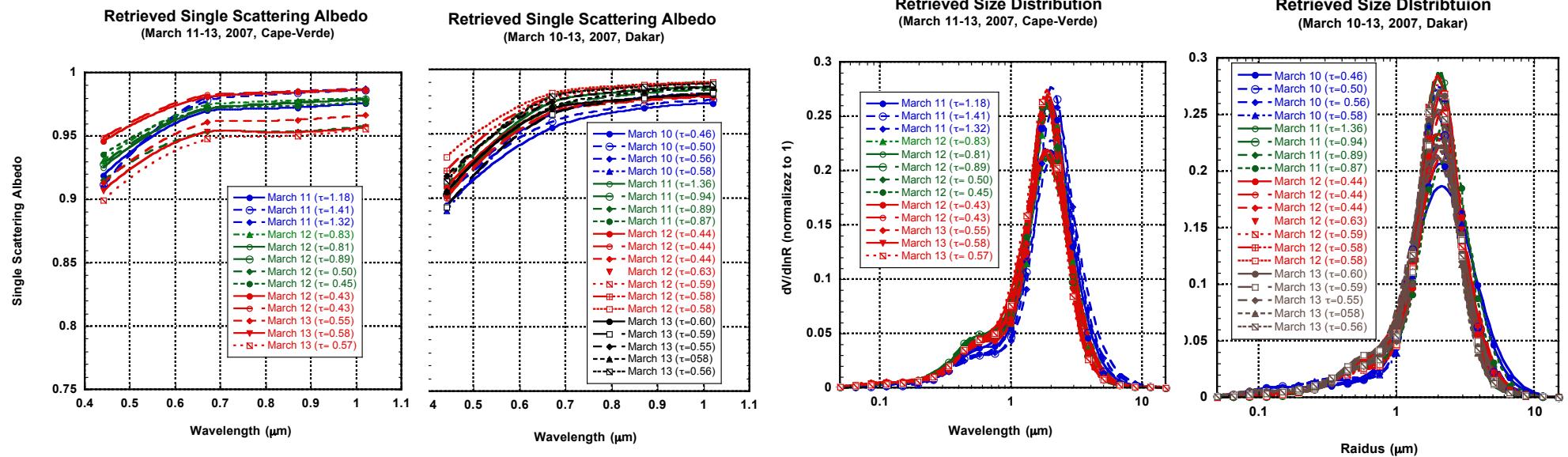




Saharan dust outbreak observed by August 9 -13, 2007



AERONET retrievals over Dakar and Cape Verde during August 9 -13, 2007



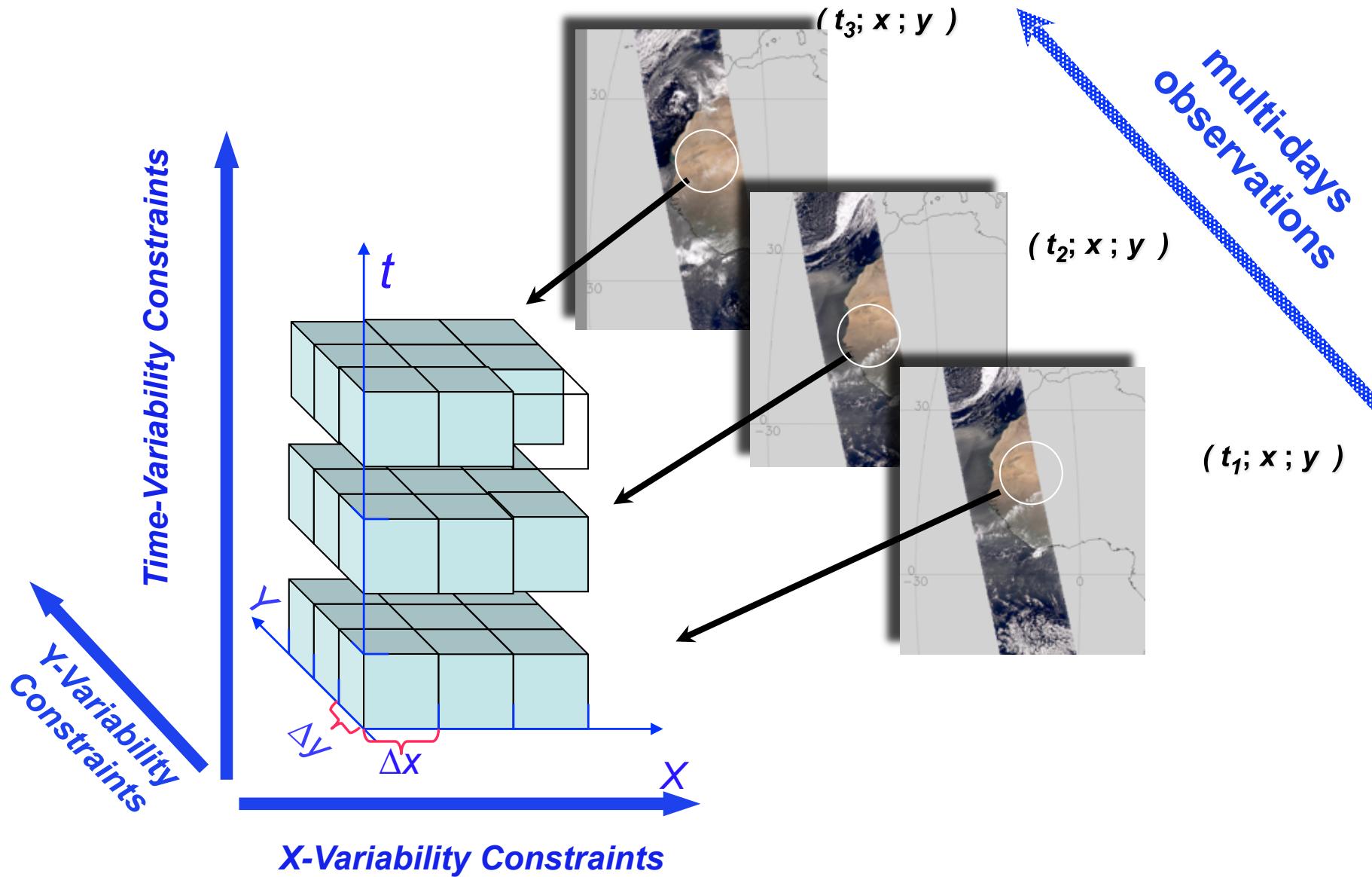
- Surface reflectance variability is limited;
- AERONET and other observations suggest aerosol properties are stable within:
 - $\tau(\lambda)$
 - size distribution shape
 - $\omega_0(\lambda)$, $n(\lambda)$, $k(\lambda)$
 - 30 min - 1 hour;
 - hours - days;
 - hours - days;



This can be used as extra information/constrain in the retrieval



The concept of multi-pixel retrieval



Single - Pixel Retrieval:

O. Dubovik
 M. Herman
 J.-L. Deuzé
 F. Ducos
 D. Tanré

f_j^* - PARASOL data:

Angular measurements (~15 angles) of
 - Intensity ($\lambda = 0.49; 0.67; 0.87; 1.02 \mu\text{m}$)
 - Polarization ($\lambda = 0.49; 0.67; 0.87 \mu\text{m}$)

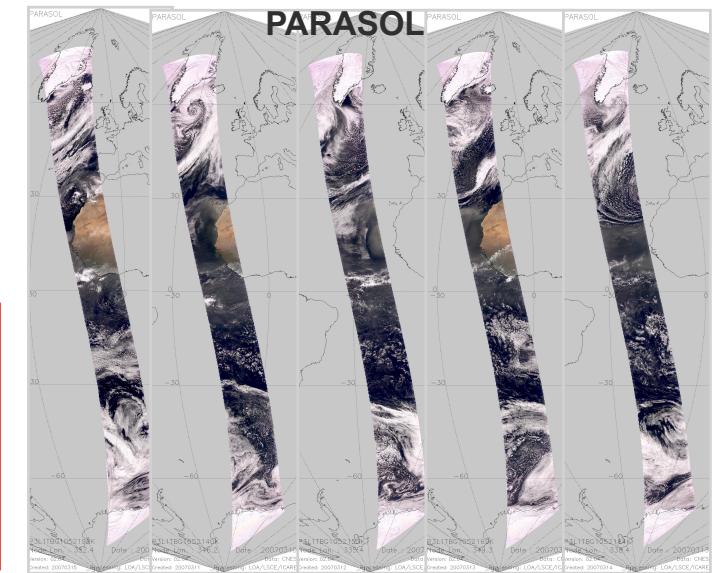
a_j - Parameters to be retrieved:

-Aerosol properties:
 - size distribution; - real refractive index
 - imaginary refractive index; - particle shape
 -Surface properties (over land):
 - BRF parameters; - BPRF parameters

$$\begin{cases} f_j^* \\ O_j^* \end{cases} = \begin{pmatrix} \mathbf{F}_j \\ \mathbf{D}_j \end{pmatrix} \mathbf{a}_j + \begin{pmatrix} \Delta_j^m \\ \Delta_j^a \end{pmatrix}$$

A Priori Constraints limiting derivatives (e.g. Dubovik 2004) of

- **for aerosols** (e.g. in AERONET, Dubovik and King 2000) :
 - aerosol size distribution variability over size range;
 - spectral variability of complex refractive index;
- **for surface** (e.g. in AERONET/satellite retrievals, Sinuyk et al. 2007) :
 - spectral variability of BRF/ PBRF parameters.



Multi-term LSM statistically optimized Solution (Dubovik and King 2000, Dubovik 2004) :

$$\mathbf{a}_j = \left(\mathbf{F}_j^T \mathbf{W}_j^{-1} \mathbf{F}_j + \gamma_j \Omega_j \right)^{-1} \left(\mathbf{F}_j^T \mathbf{W}_j^{-1} \mathbf{f}_j^* \right)$$

$$\text{, where } \Omega_j = \mathbf{D}_j^T \mathbf{D}_j; \mathbf{W}_j = \frac{1}{\varepsilon_f^2} \mathbf{C}_f; \quad \gamma_j = \frac{\varepsilon_f^2}{\varepsilon_a^2}$$

Multi - Pixel Retrieval:

$$\left(\begin{array}{c} \mathbf{f}_1^* \\ O_1^* \\ \mathbf{f}_2^* \\ O_2^* \\ \mathbf{f}_3^* \\ O_3^* \\ \vdots \\ O_t^* \\ O_x^* \\ O_y^* \end{array} \right) = \left(\begin{array}{ccc} \mathbf{F}_1 & 0 & 0 \\ \mathbf{D}_1 & 0 & 0 \\ 0 & \mathbf{F}_2 & 0 \\ 0 & \mathbf{D}_2 & 0 \\ 0 & 0 & \mathbf{F}_3 \\ 0 & 0 & \mathbf{D}_3 \end{array} \right) \left(\begin{array}{c} \mathbf{a}_1 \\ \mathbf{a}_2 \\ \mathbf{a}_3 \end{array} \right) + \left(\begin{array}{c} \Delta_1^m \\ \Delta_1^a \\ \Delta_2^m \\ \Delta_2^a \\ \Delta_3^m \\ \Delta_3^a \\ \Delta_t^a \\ \Delta_x^a \\ \Delta_y^a \end{array} \right)$$

Single-Pixel Data (PARASOL measurements and physical a priori constraints) **are used by the same way as in Single-Pixel retrieval.**

Multi-Pixel a priori constraints (e.g.Dubovik et al. 2008):

- limited **spatial** variability of each aerosol /surface parameter
- limited **temporal** variability of each aerosol /surface parameter

NOTE: degree of variability constraints (smoothnes) can be different and adequately chosen for each parameter

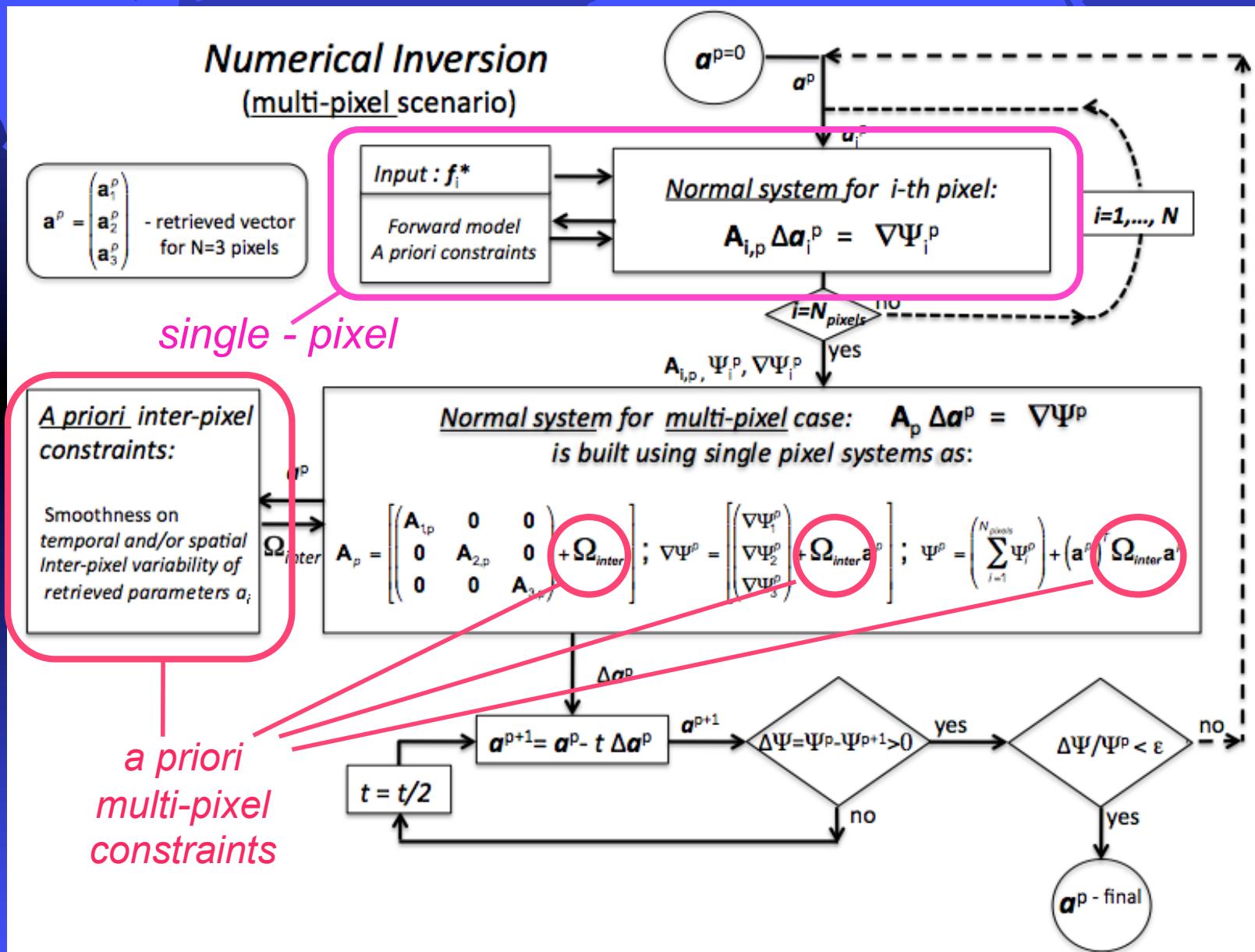
Multi-term LSM Multi-Pixel Solution:

$$\left(\begin{array}{c} \mathbf{a}_1 \\ \mathbf{a}_2 \\ \mathbf{a}_3 \end{array} \right) = \left[\begin{array}{ccc} \mathbf{F}_1^T \mathbf{W}_1^{-1} \mathbf{F}_1 & 0 & 0 \\ 0 & \mathbf{F}_2^T \mathbf{W}_2^{-1} \mathbf{F}_2 & 0 \\ 0 & 0 & \mathbf{F}_3^T \mathbf{W}_3^{-1} \mathbf{F}_3 \end{array} \right] \left(\begin{array}{ccc} \gamma_1 \Omega_1 & 0 & 0 \\ 0 & \gamma_2 \Omega_2 & 0 \\ 0 & 0 & \gamma_3 \Omega_3 \end{array} \right) + \gamma_x \Omega_x + \gamma_y \Omega_y + \gamma_t \Omega_t \left[\begin{array}{c} \mathbf{F}_1^T \mathbf{W}_1^{-1} \Delta \mathbf{f}_1^p \\ \mathbf{F}_2^T \mathbf{W}_2^{-1} \Delta \mathbf{f}_2^p \\ \mathbf{F}_3^T \mathbf{W}_3^{-1} \Delta \mathbf{f}_3^p \end{array} \right]$$

, where $\Omega_x = \mathbf{D}_x^T \mathbf{D}_x$; $\Omega_y = \mathbf{D}_y^T \mathbf{D}_y$; $\Omega_t = \mathbf{D}_t^T \mathbf{D}_t$; $\gamma_x = \frac{\varepsilon_f^2}{\varepsilon_x^2}$; $\gamma_y = \frac{\varepsilon_f^2}{\varepsilon_y^2}$; $\gamma_t = \frac{\varepsilon_f^2}{\varepsilon_t^2}$

« PARASOL » statistically optimized « no look-up tables » multi-pixel inversion

Dubovik et al., AMT, 2011



Observational conditions:

- Geometry is the same as for PARASOL over Banizoumbu (as in the example for actual PARASOL inversions)
- Surface is bright;
- Aerosol loadings: 16 cases for $\tau(0.44) = 0.01 - 4$;
- Aerosol types: Dust, Biomass Burning (original from AERONET)
- Aerosol height – 3 km



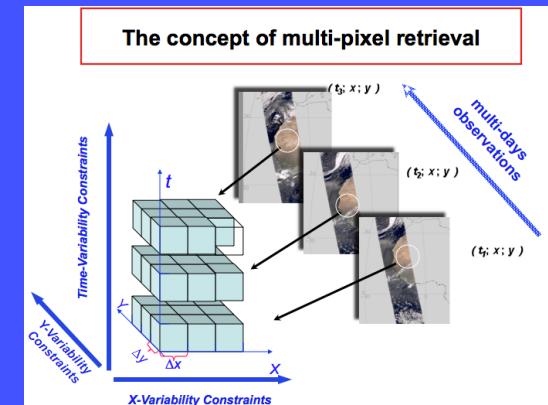
Retrieved parameters:

AEROSOL:

- $dV(r)/dlnr$ (16 bins from 0.07 to 10 μm);
- $n(\lambda)$, $k(\lambda)$, $\omega_0(\lambda)$
- Aerosol height
- Fraction of spherical particles

SURFACE:

- BRF 3 parameters for each λ);
- BPRF (1 parameter for each λ)



SPATIAL – TEMPORAL:

- 4 pixels for each of 4 days

Stringent test conditions:

-The same initial guess for all retrievals:

- no a priori information about surface type;
 - no a priori information about aerosol type
 - no a priori information about aerosol loading;
- The test were also done for vegetated surface;
- The synthetic data are calculated using original non-simplified AERONET data;
- Random noise: 1% for intensity, 0.5% for degree of linear polarization.



Single Initial Guess:

Aerosol Properties

$C_v = C_0$ (corresponding to the value of τ_{aer} (0.44)~0.05);
 $dV(r_i)/d\ln r = 0.1$; ($i = 1, \dots, N_r$)
 $C_{\text{sph}} = 0.7$
 $n(\lambda_i) = 1.4$ ($i = 1, \dots, N_\lambda$)
 $k(\lambda_i) = 0.005$ ($i = 1, \dots, N_\lambda$)

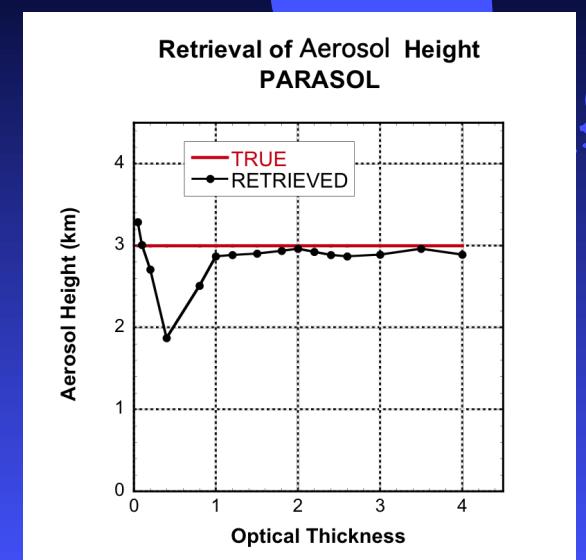
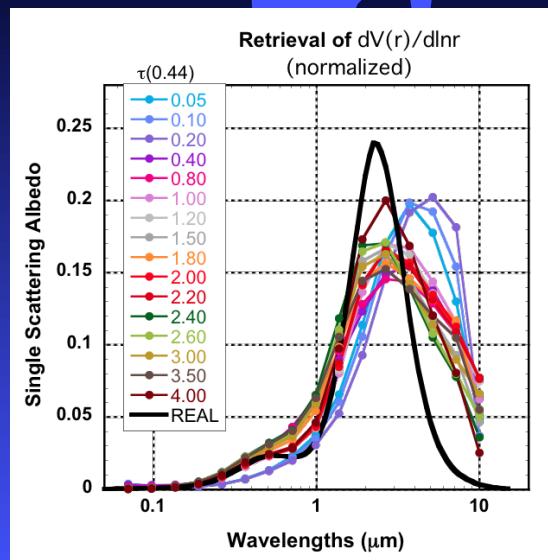
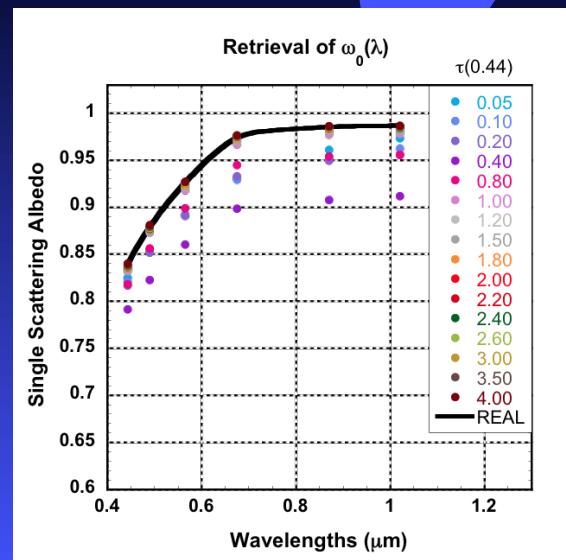
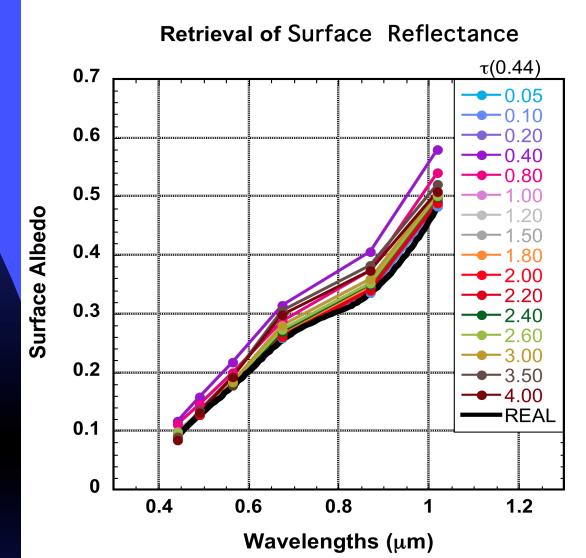
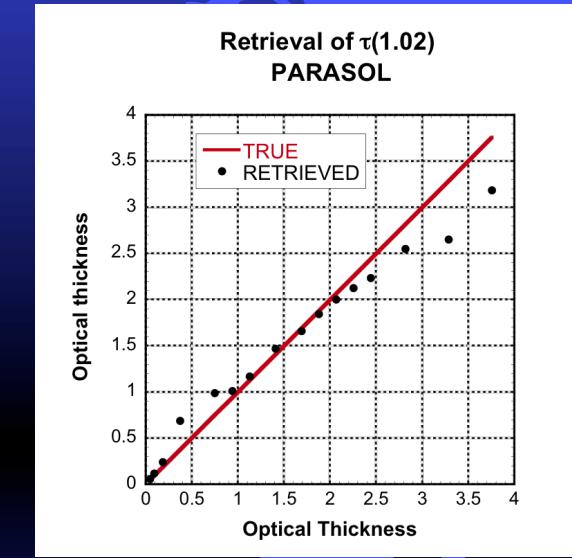
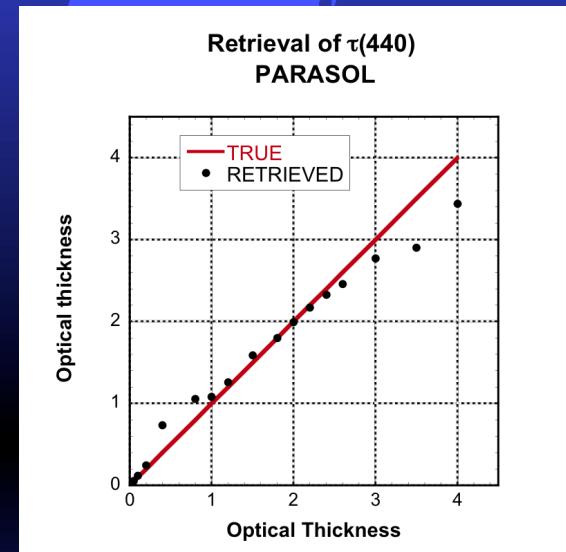
Surface Reflectance

$\rho_0(\lambda_i) = 0.05$ ($i = 1, \dots, N_\lambda$)
 $\kappa(\lambda_i) = 0.75$ ($i = 1, \dots, N_\lambda$)
 $\theta(\lambda_i) = -0.1$ ($i = 1, \dots, N_\lambda$)
 $h_0(\lambda_i) = \rho_0(\lambda_i)$ ($i = 1, \dots, N_\lambda$)
 $B(\lambda_i) = 0.03$ ($i = 1, \dots, N_\lambda$)

PARASOL: 0.44, 0.49 (*p+*), 0.565, 0.675 (*p+*), 0.87(*p+*), 1.02 μm

NO NOISE ADDED !!! (minor noise is always present)

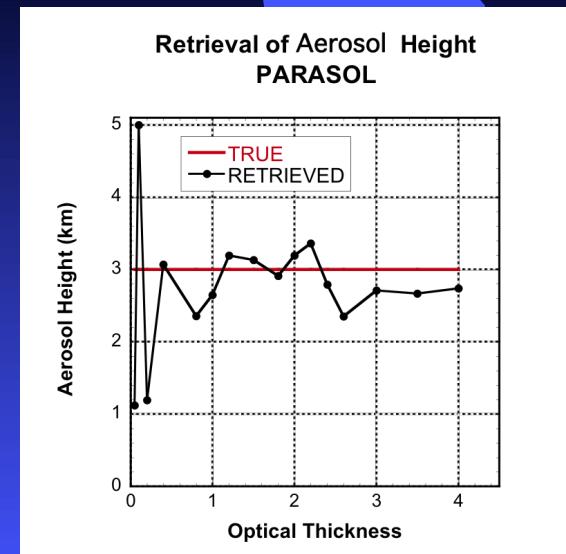
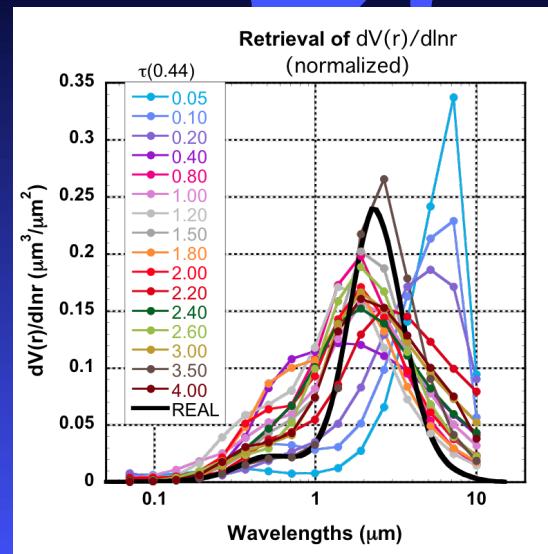
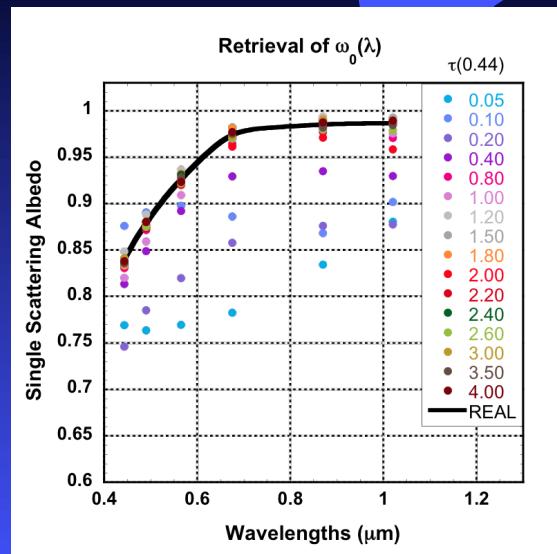
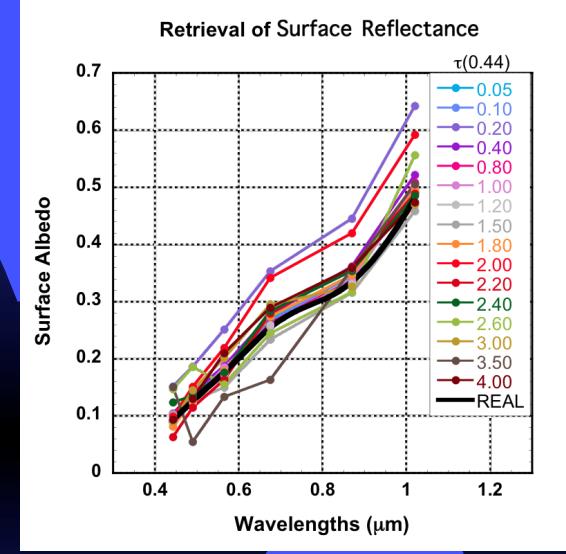
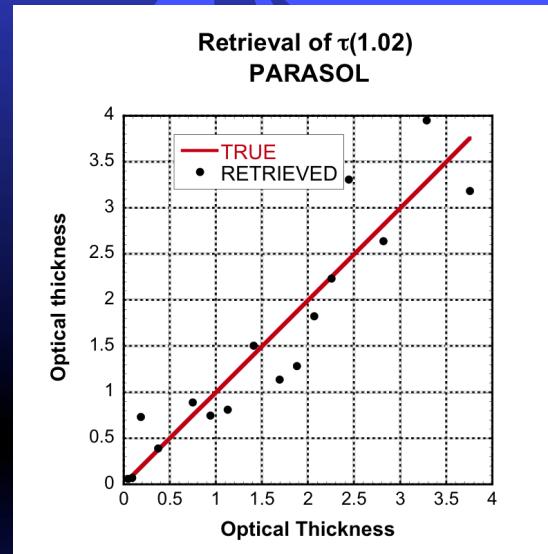
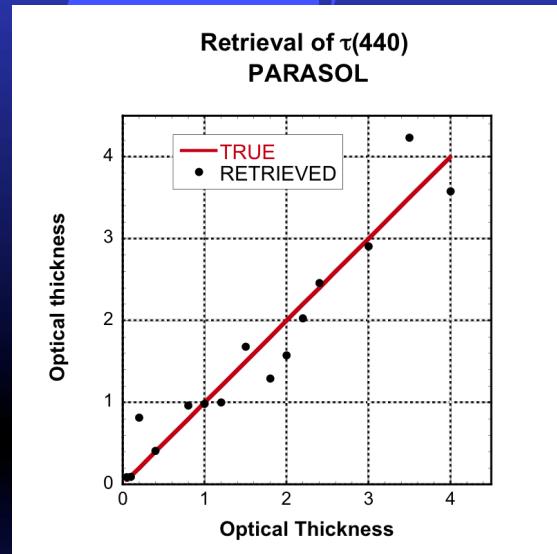
Single-Pixel Retrieval, Desert Dust aerosol (non-spherical!!!)



PARASOL: 0.44, 0.49 (*p+*), 0.565, 0.675 (*p+*), 0.87(*p+*), 1.02 μm

NOISE ADDED: 1% for $I(\lambda)$, 0.005 for $Q(\lambda)/I(\lambda)$ and $U(\lambda)/I(\lambda)$!!!

Single-Pixel Retrieval, Desert Dust aerosol (non-spherical!!!)

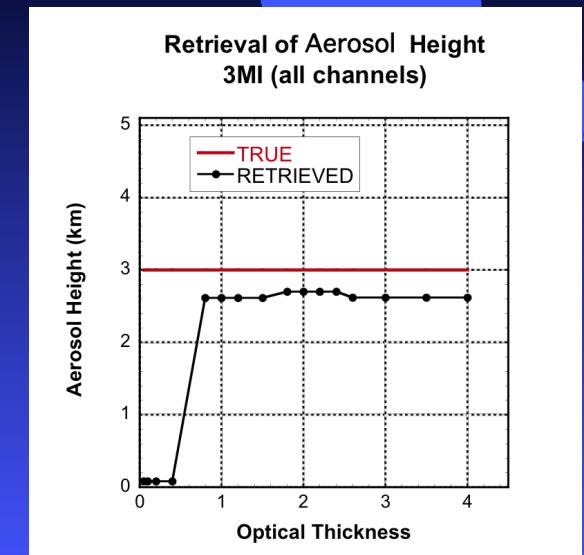
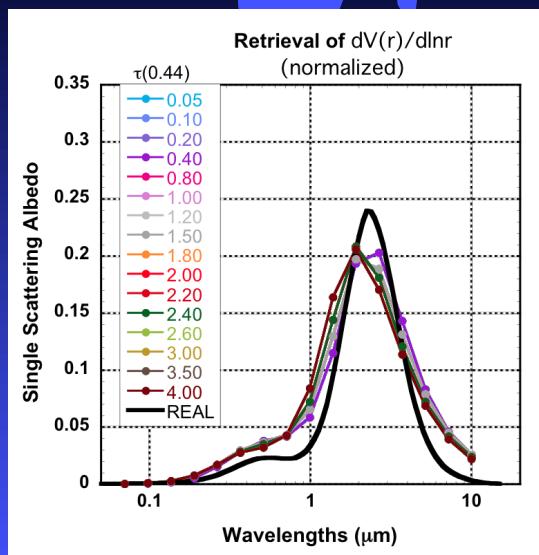
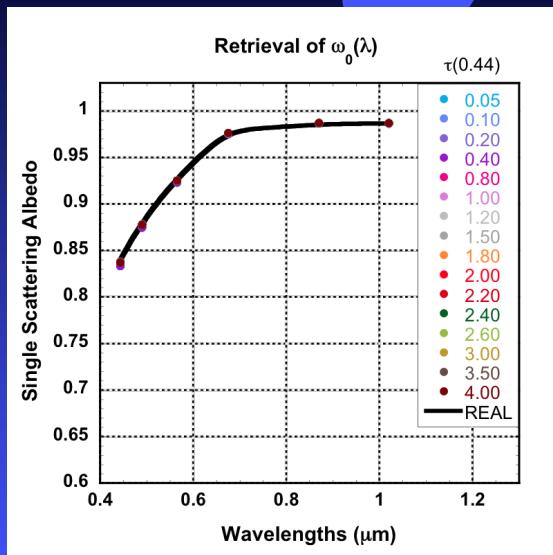
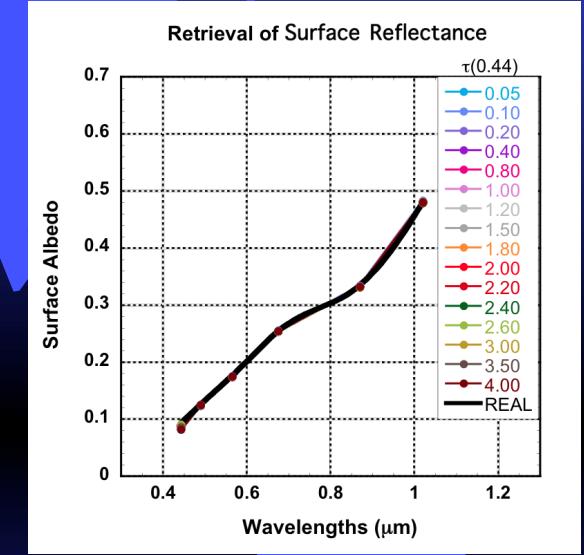
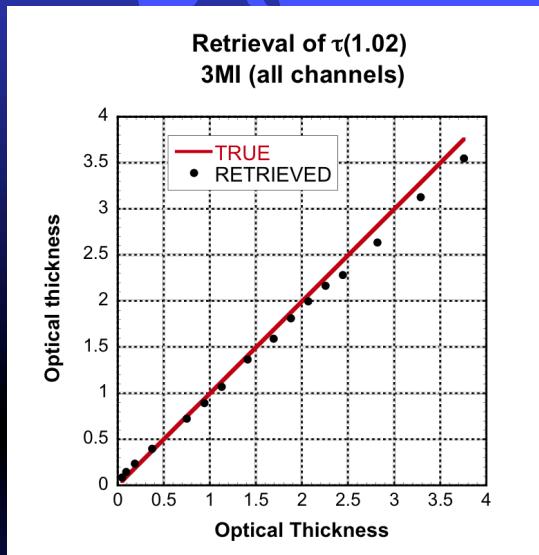
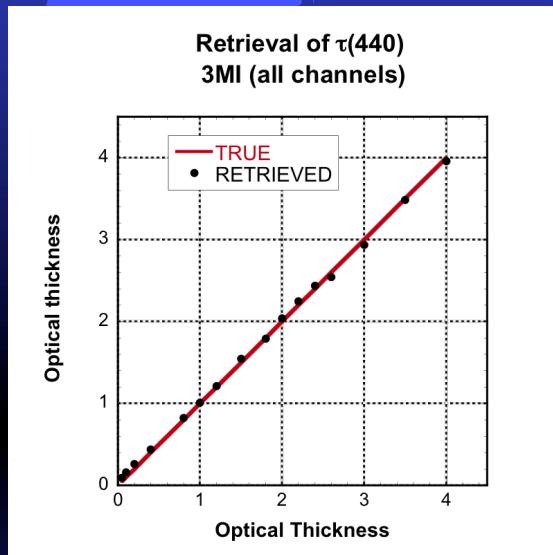


PARASOL: 0.44, 0.49 (p+), 0.565, 0.675 (p+), 0.87(p+), 1.02 μm

NOISE ADDED: 1% for $I(\lambda)$, 0.005 for $Q(\lambda)/I(\lambda)$ and $U(\lambda)/I(\lambda)$!!!

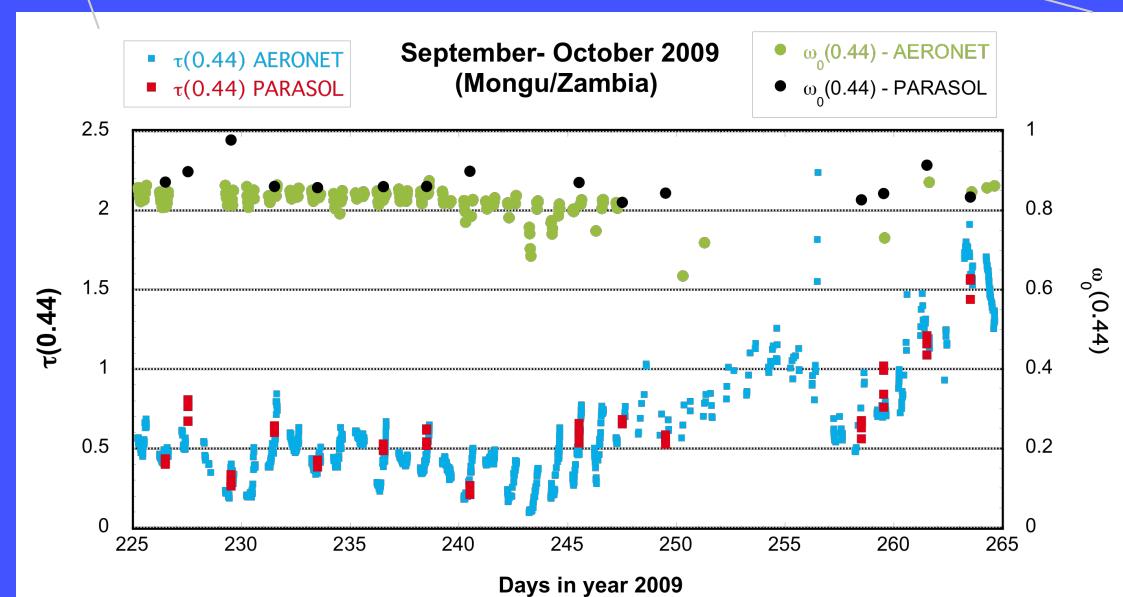
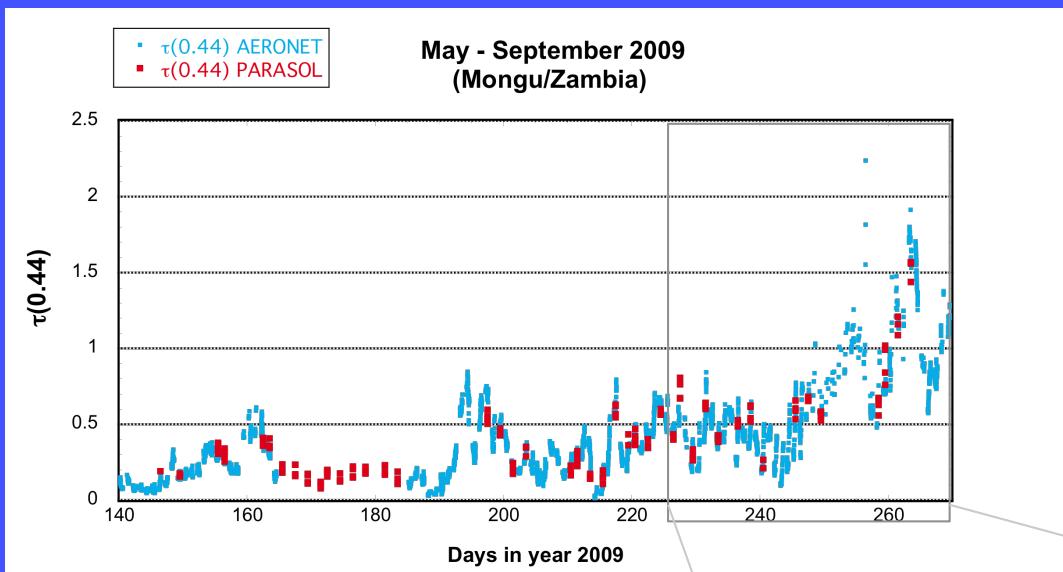
Multi-Pixel Retrieval (i.e. temporal and spatial variability of surface and aerosol is limited)

Desert Dust aerosol (non-spherical!!!)



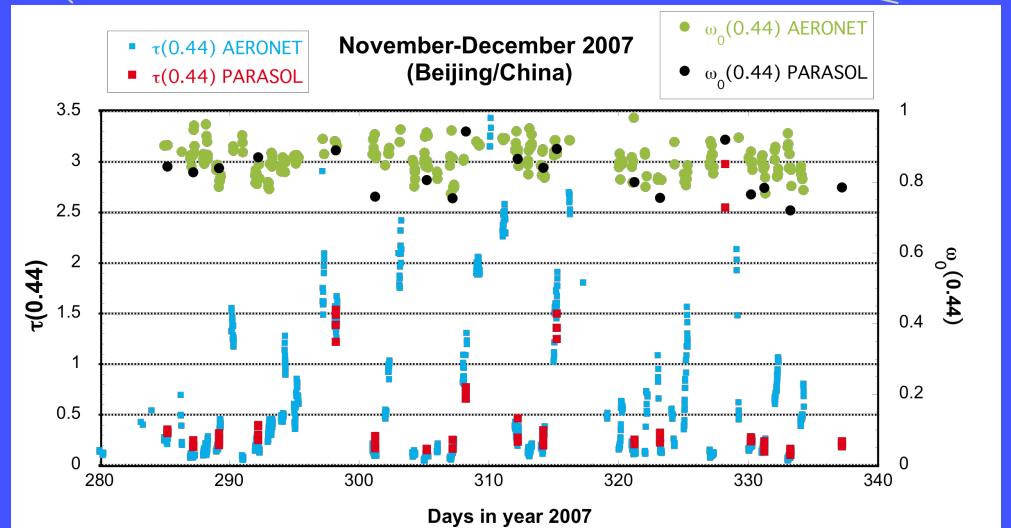
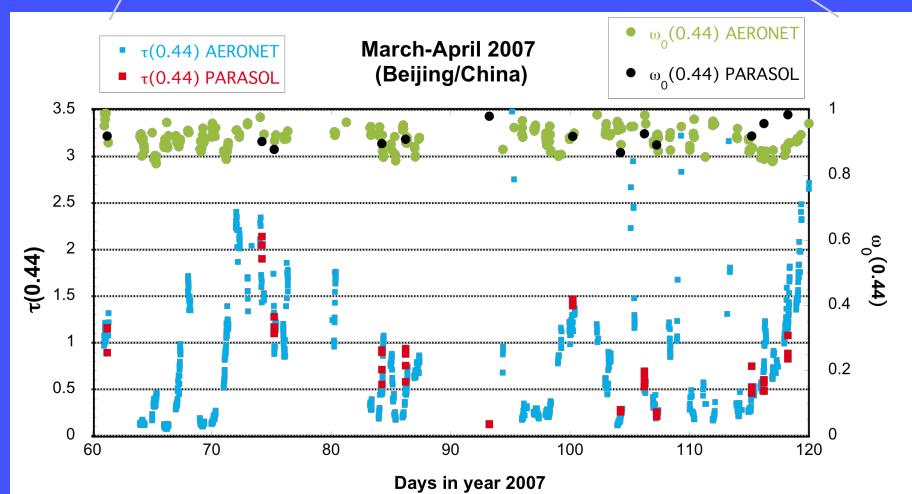
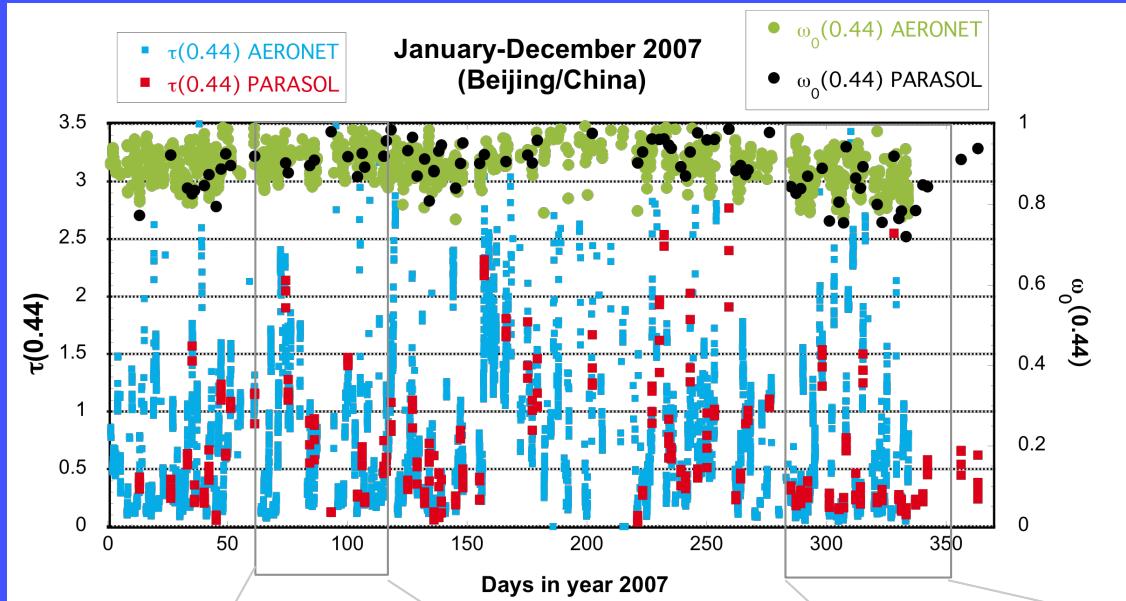
Inversion of real PARASOL data

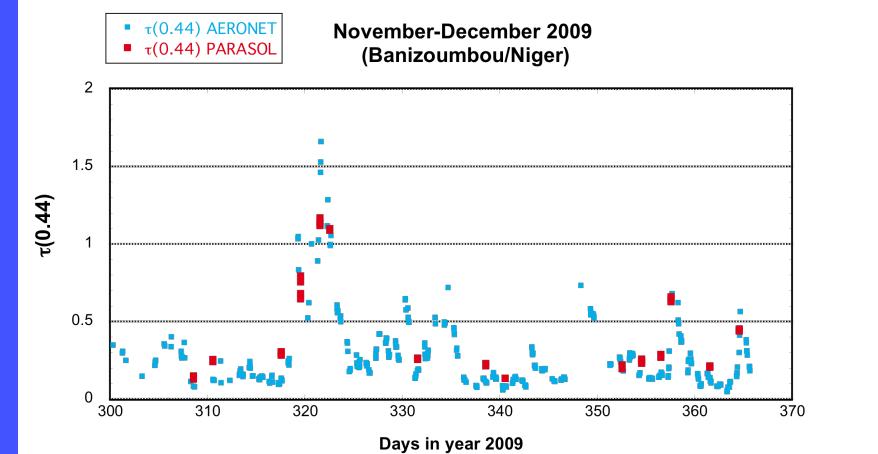
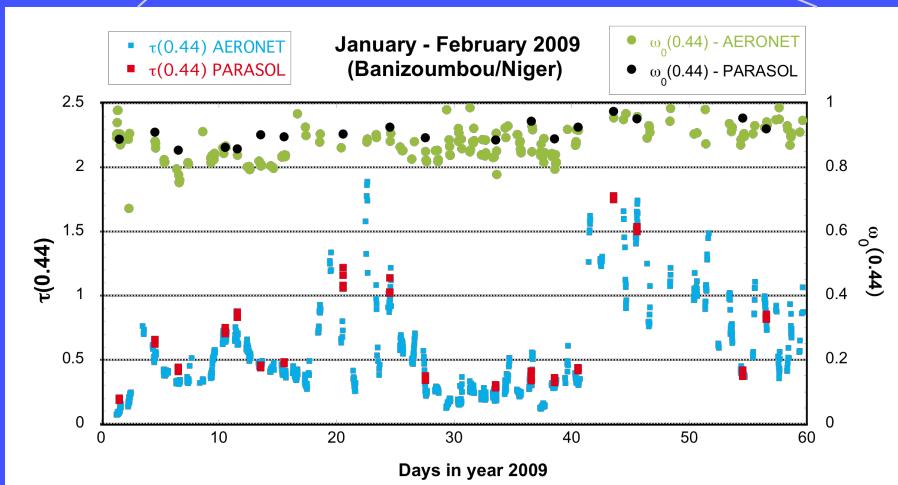
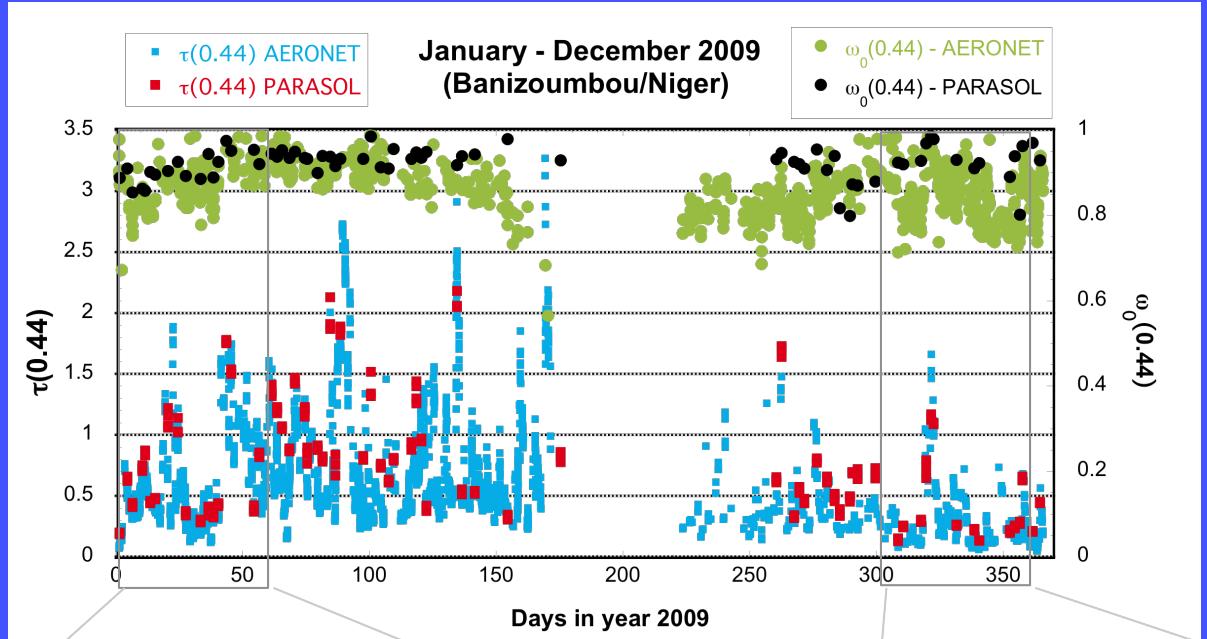
Biomass aerosol Mongu/Zambia



Inversion of real PARASOL data

(urban/industrial aerosol
Beijing/China)





Inversion of real PARASOL data



Dust and biomass
Banizoumbu/Niger

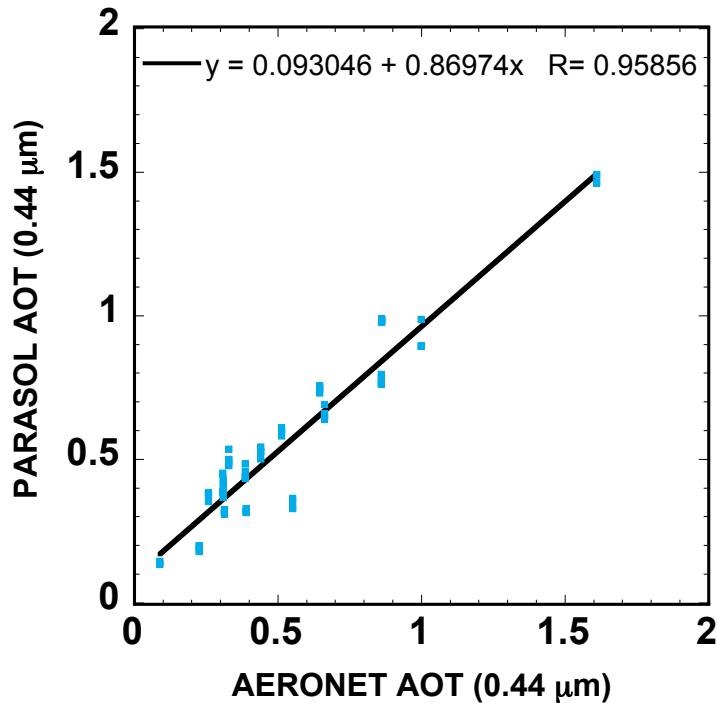
Optical Thickness

PARASOL versus AERONET

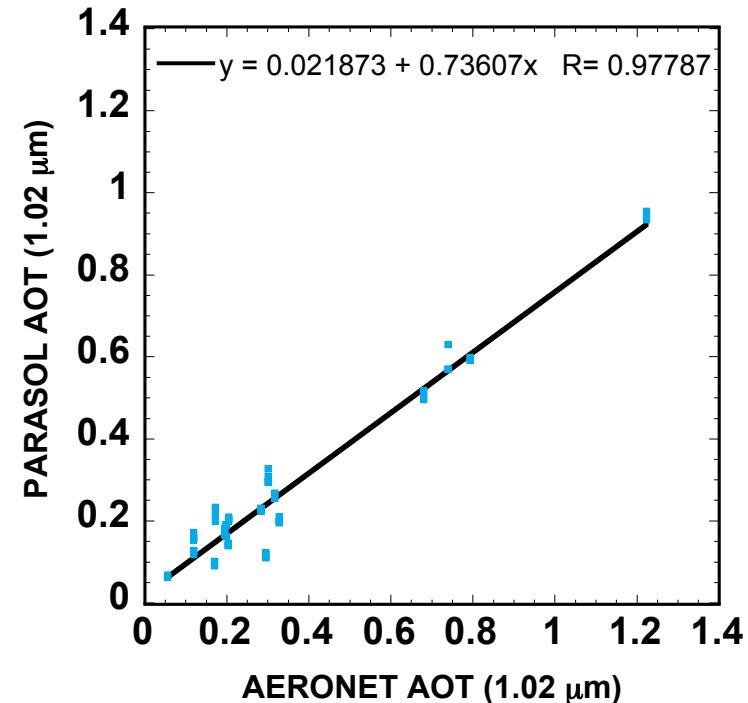
0.44 μm

1.02 μm

Banizoumbou, Niger
(January–February 2009)



Banizoumbou, Niger
(January–February 2009)





Dust and biomass
Banizoumbu/Niger

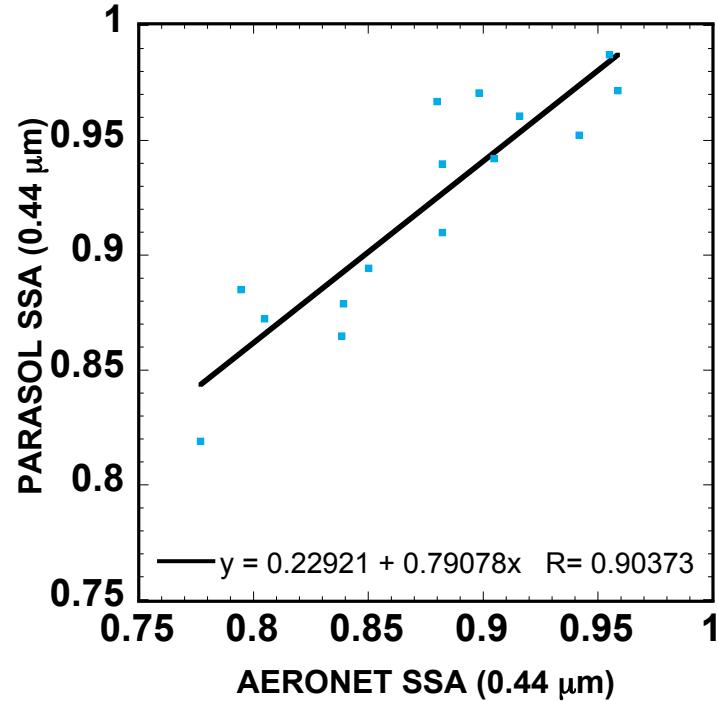
Single Scattering Albedo

PARASOL versus AERONET

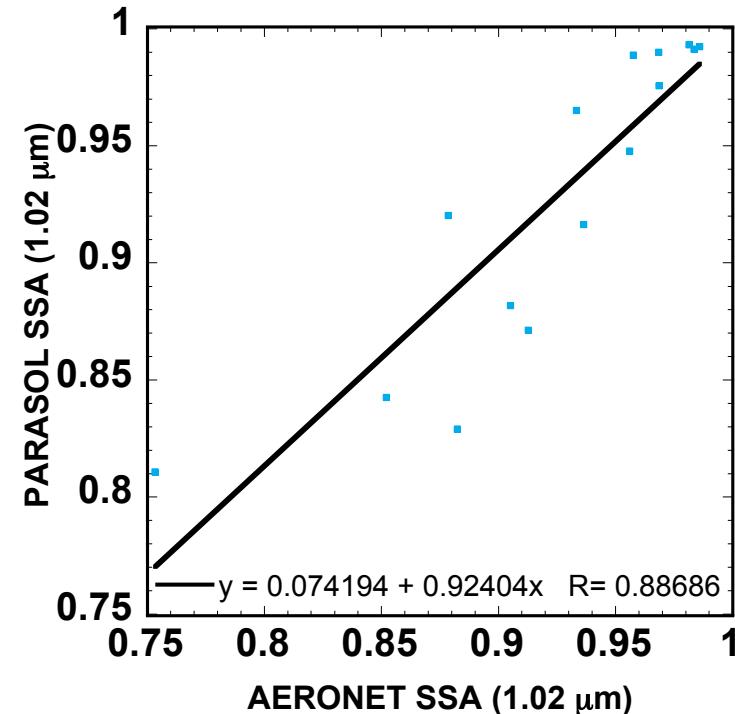
0.44 μm

1.02 μm

Banizoumbou, Niger
(January-February 2009)



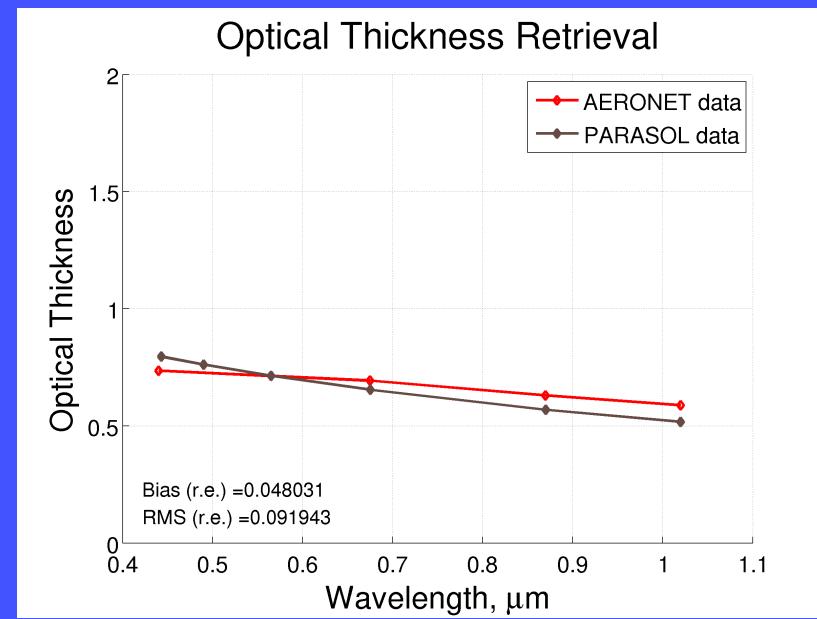
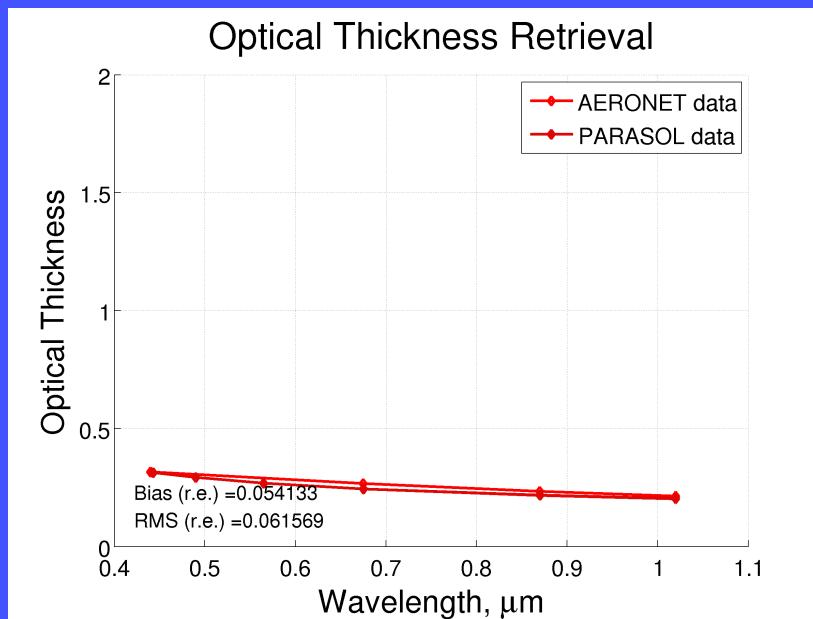
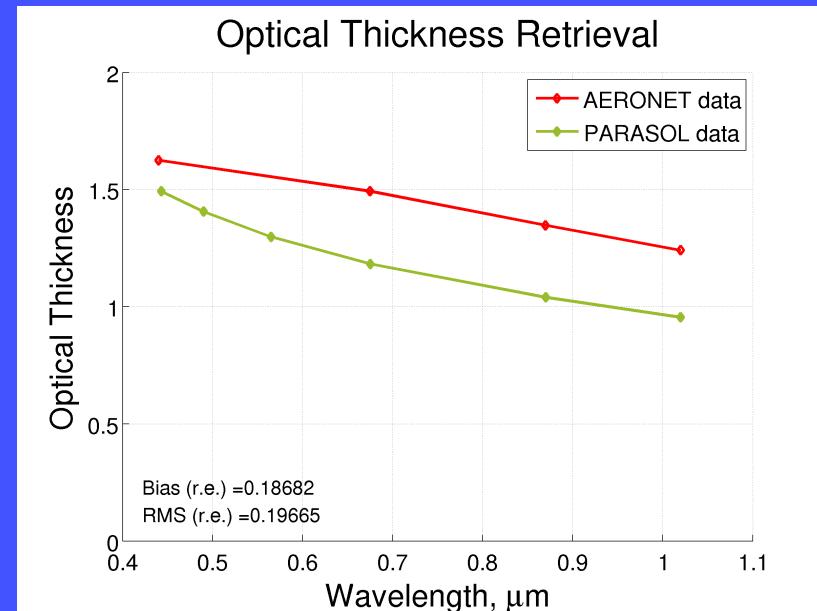
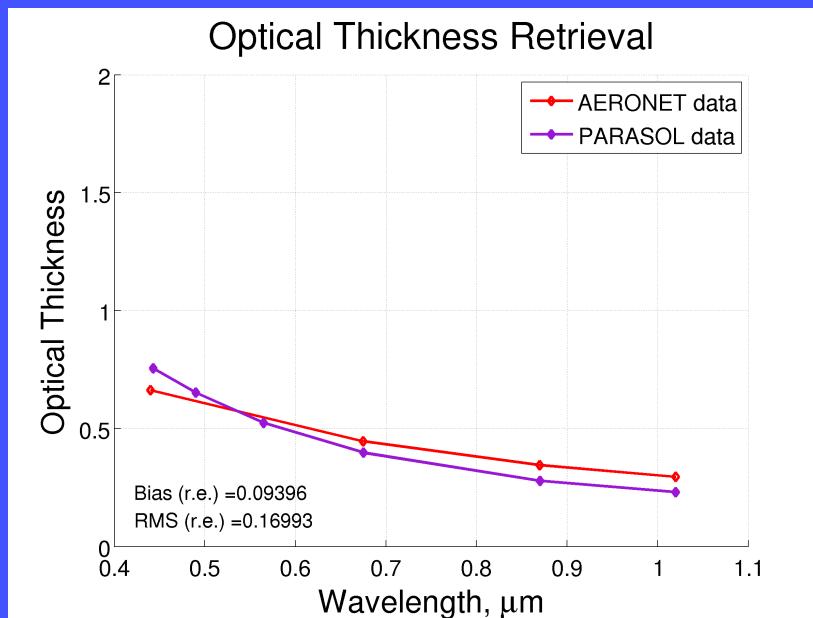
Banizoumbou, Niger
(January-February 2009) 9c





PARASOL versus AERONET

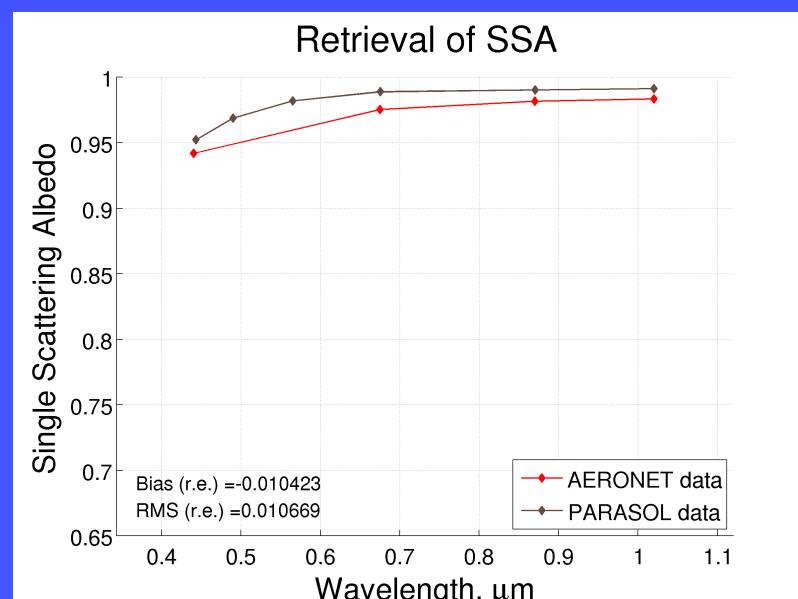
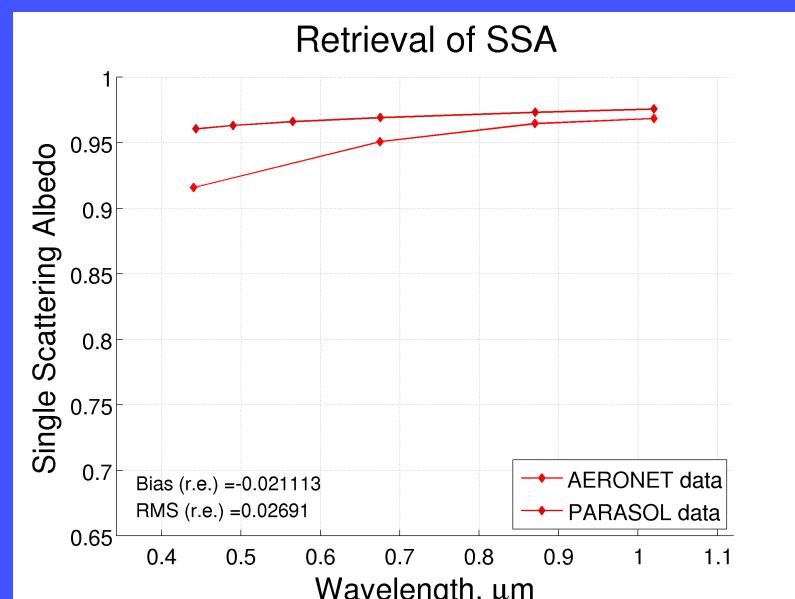
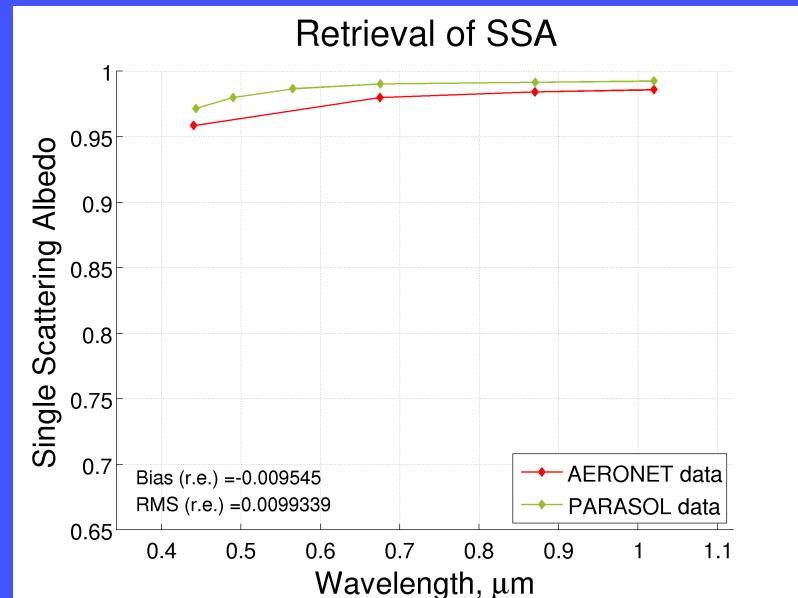
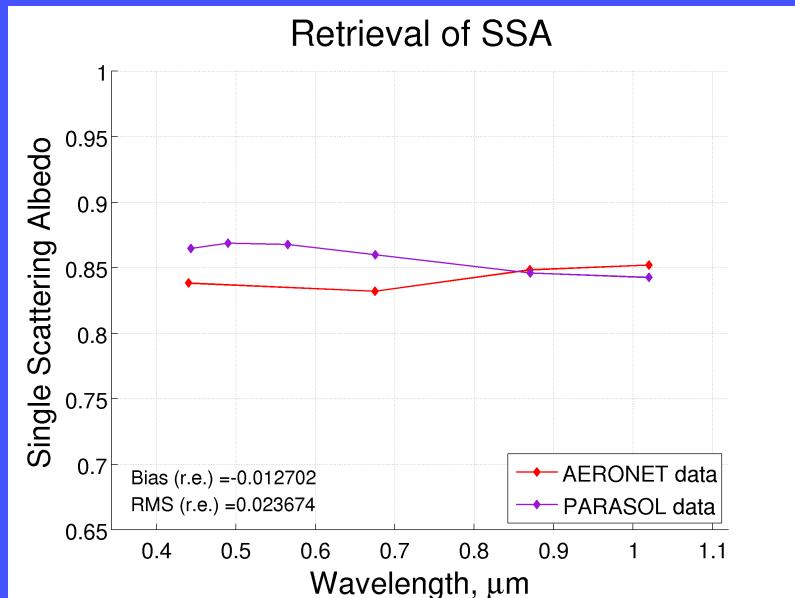
Dust and biomass
Banizoumbu/Niger





PARASOL versus AERONET

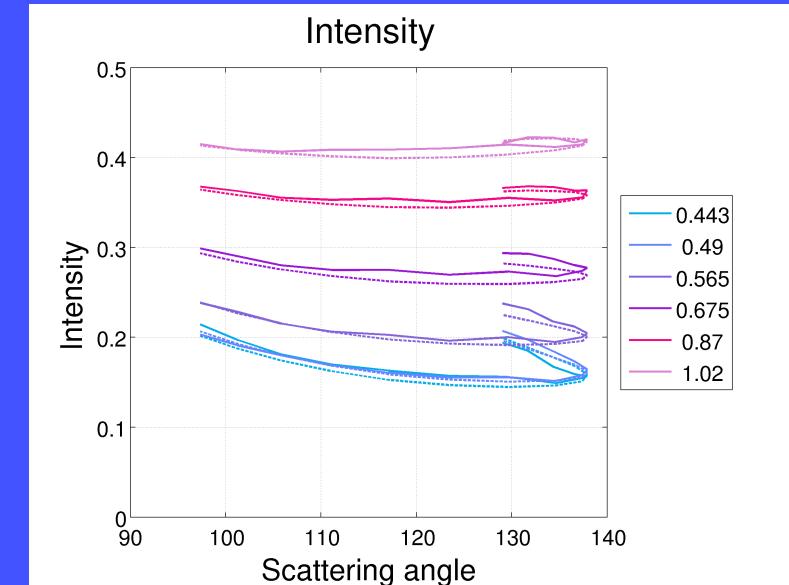
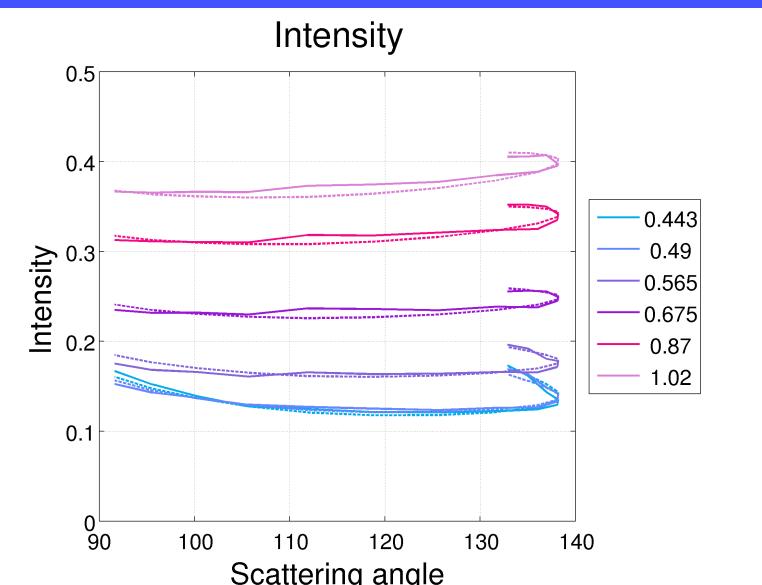
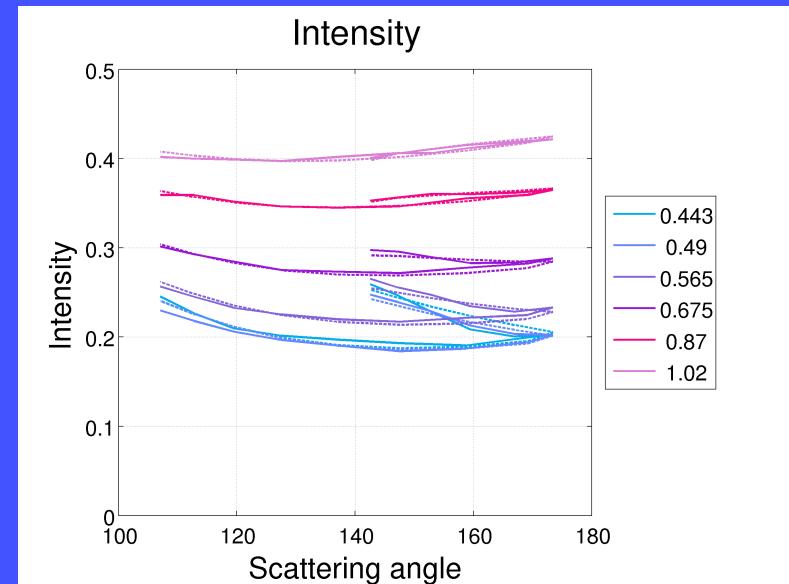
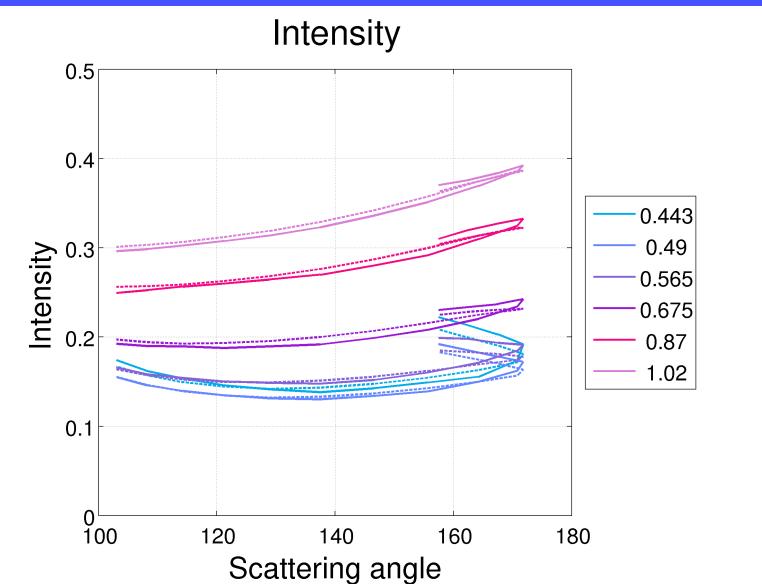
Dust and biomass
Banizoumbu/Niger





Fit of PARASOL observations

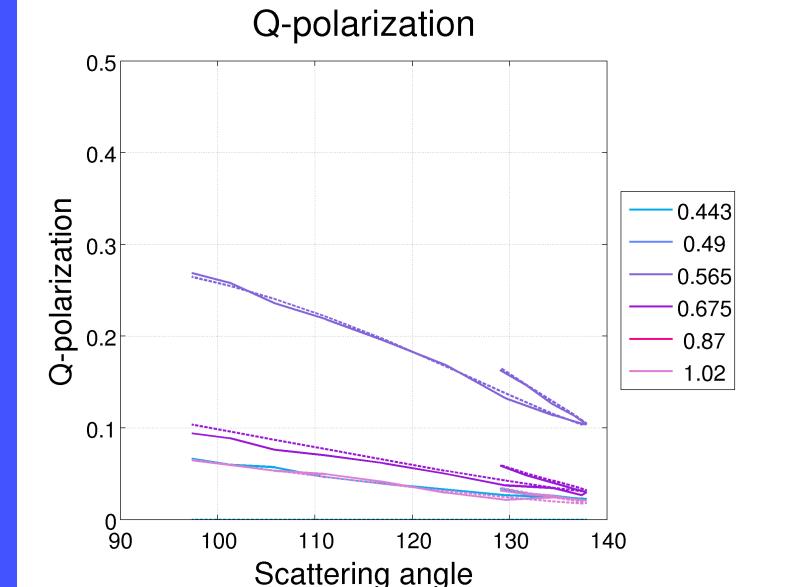
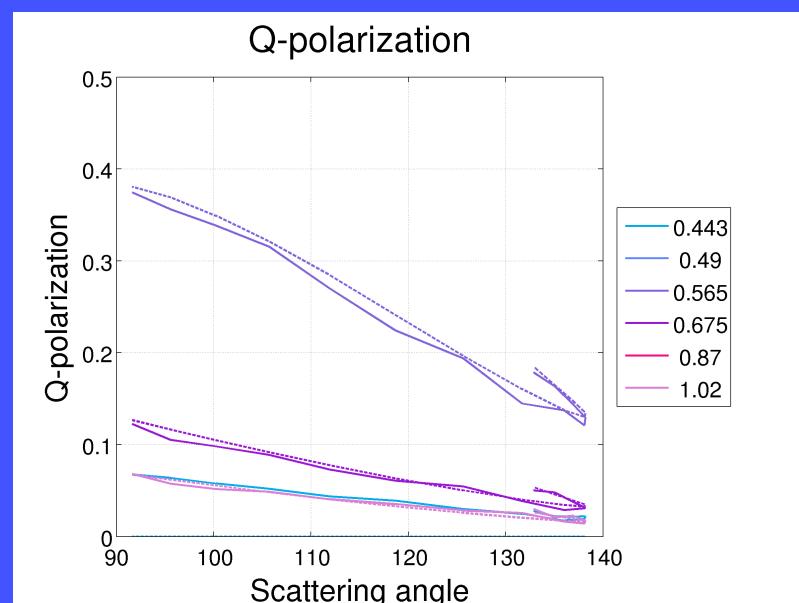
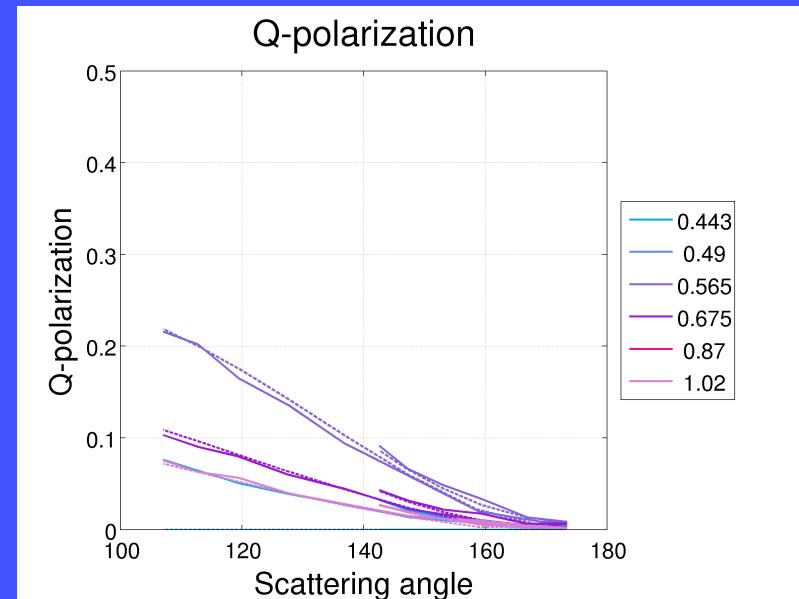
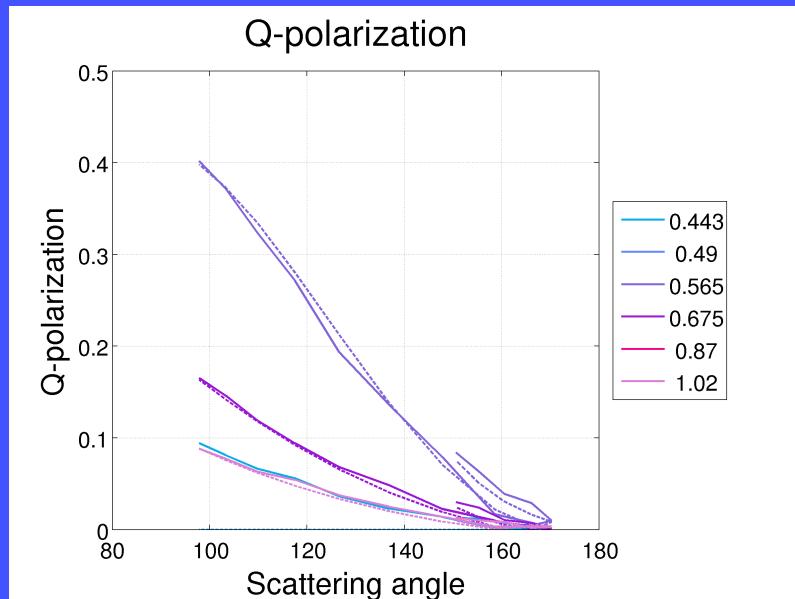
Dust and biomass
Banizoumbu/Niger





Fit of PARASOL observations (Q/I in plane of scattering)

Dust and biomass
Banizoumbu/Niger



Conclusions/Perspectives:

1. **Inverse modeling** – *promising approach for synergy of modeling and remote sensing*

Potential for improvement:

- using enhanced products from advanced satellite sensors retrievals



2. **New PARASOL algorithm** – *promising*

Potential for improvement:

- producing global aerosol products
- multi-sensor retrieval:

