

# **Potential of multiwavelength lidars for particles characterization: expectations and challenges**

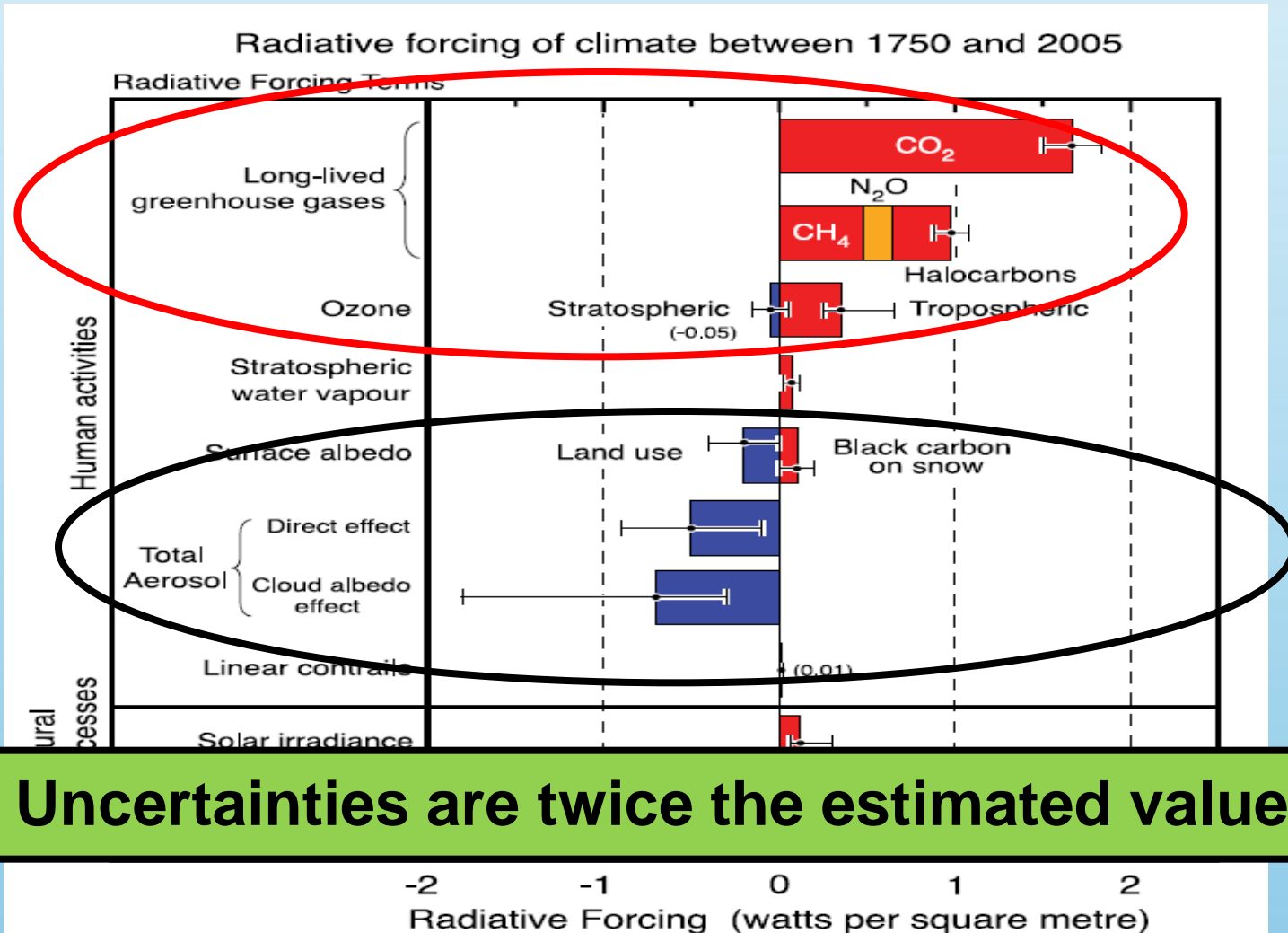


**Igor Veselovskii**

**Physics Instrumentation Center, Russia**

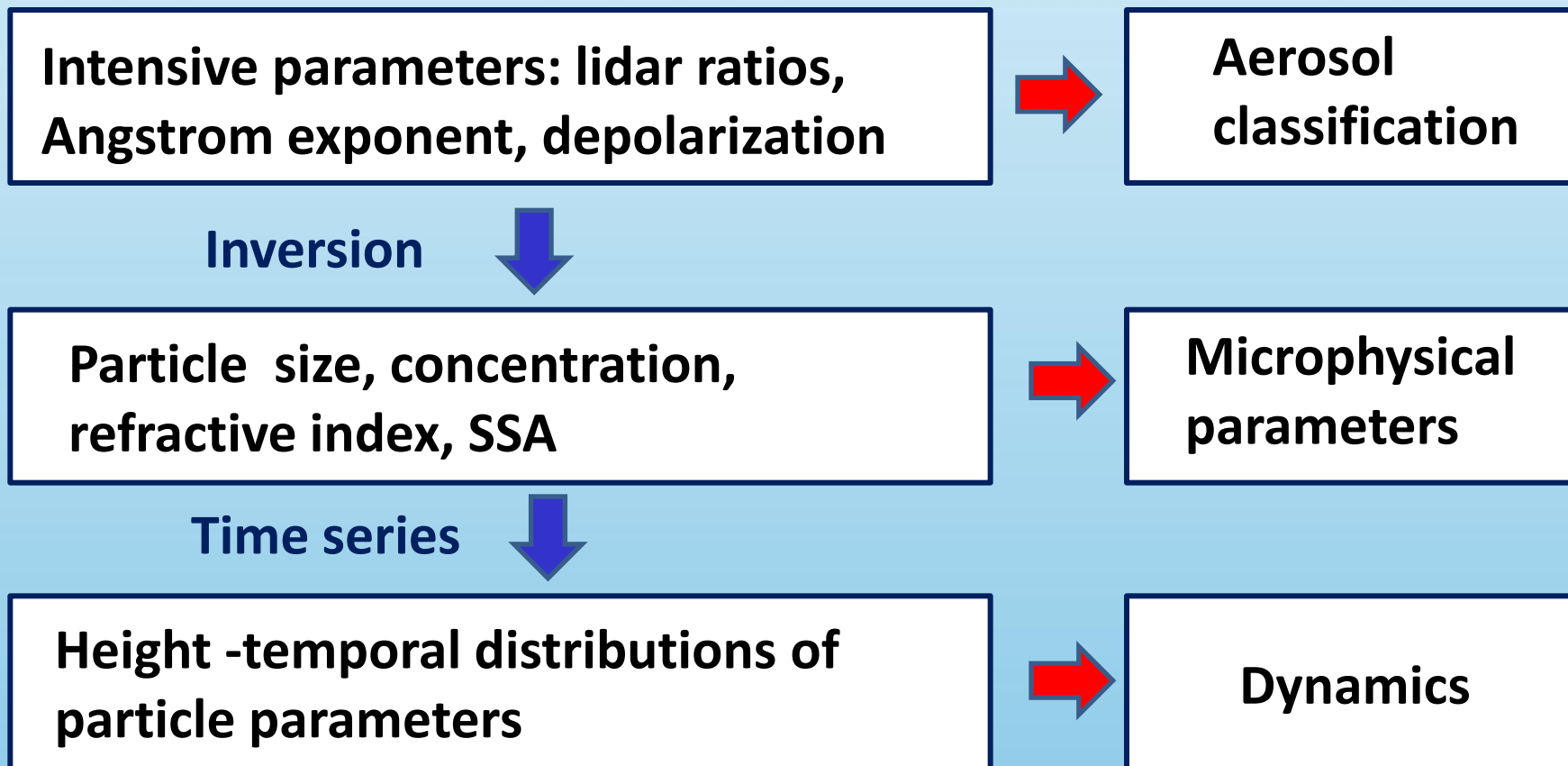
# MOTIVATION

There is a current concern about the effects of atmospheric aerosol on climate



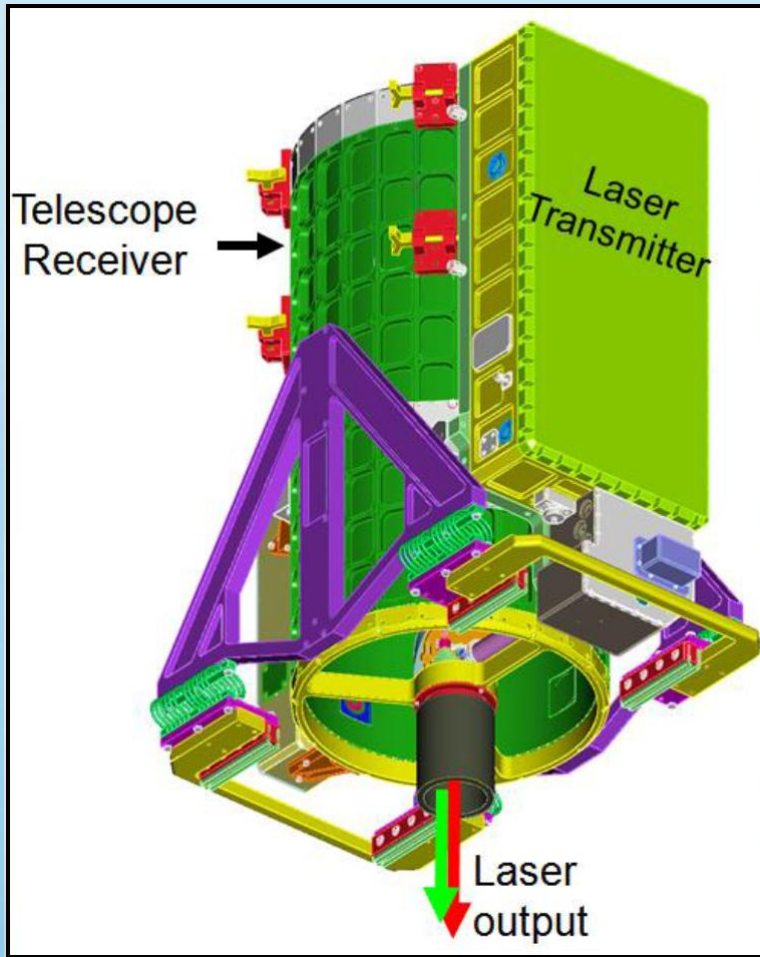
# Potential of multiwavelength lidar

MW Raman (HSRL) lidar provides backscattering  $\beta$ , extinction  $\alpha$  and depolarization  $\delta$  at multiple wavelengths. From these we can obtain:



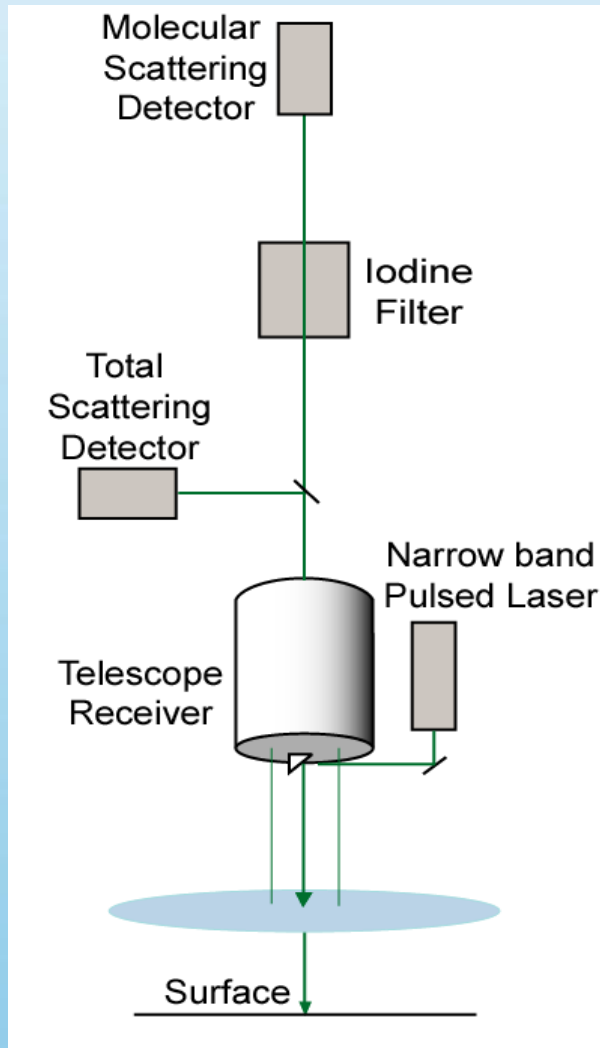
# Configuration of lidar for ACE mission is still the subject of discussions.

## Multiwavelength HSRL

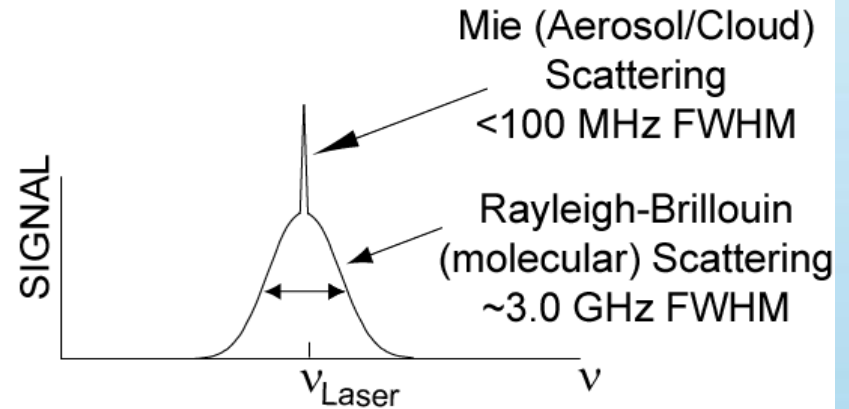


- Backscatter at 3 wavelengths ( $3\beta$ ) : 355, 532, 1064 nm
- Extinction at 2 wavelengths ( $2\alpha$ ) : 355, 532 nm
- Depolarization at 355, 532, and 1064 (dust and contrails/cirrus applications)
- It is always desirable to reduce the number of channels.
- Retrieval should be tolerant to the input data noise

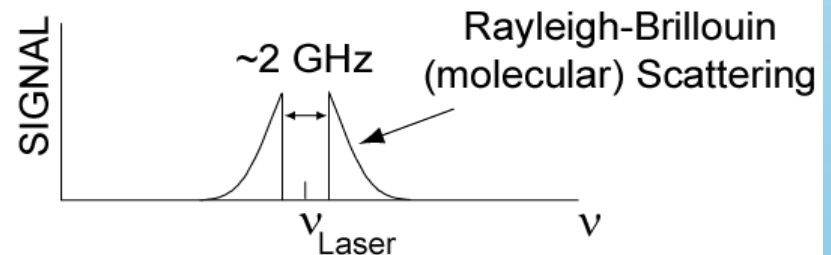
# High Spectral Resolution Lidar (HSRL) Technique Iodine Vapor Filter Implementation



## Atmospheric Scattering



## Effect of Iodine Vapor Notch Filter



# Challenges of multiwavelength technique

- **Small number of data**
- **Unknown complex refractive index and particle size distribution**
- **Significant input errors (up to 20%)**
- **Necessity to process large volume of data**
- **Particle nonsphericity**
- **Spectral and size dependence of complex refractive index**
- **Mixture of particles**

# Two approaches to inversion

Müller et al. 1999  
Böckmann 2001  
Veselovskii et al. 2002

Calculation of  
 $\alpha$  and  $\beta$

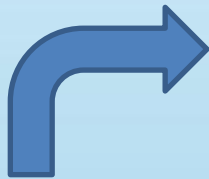
Particle  
parameters

Lidar signals

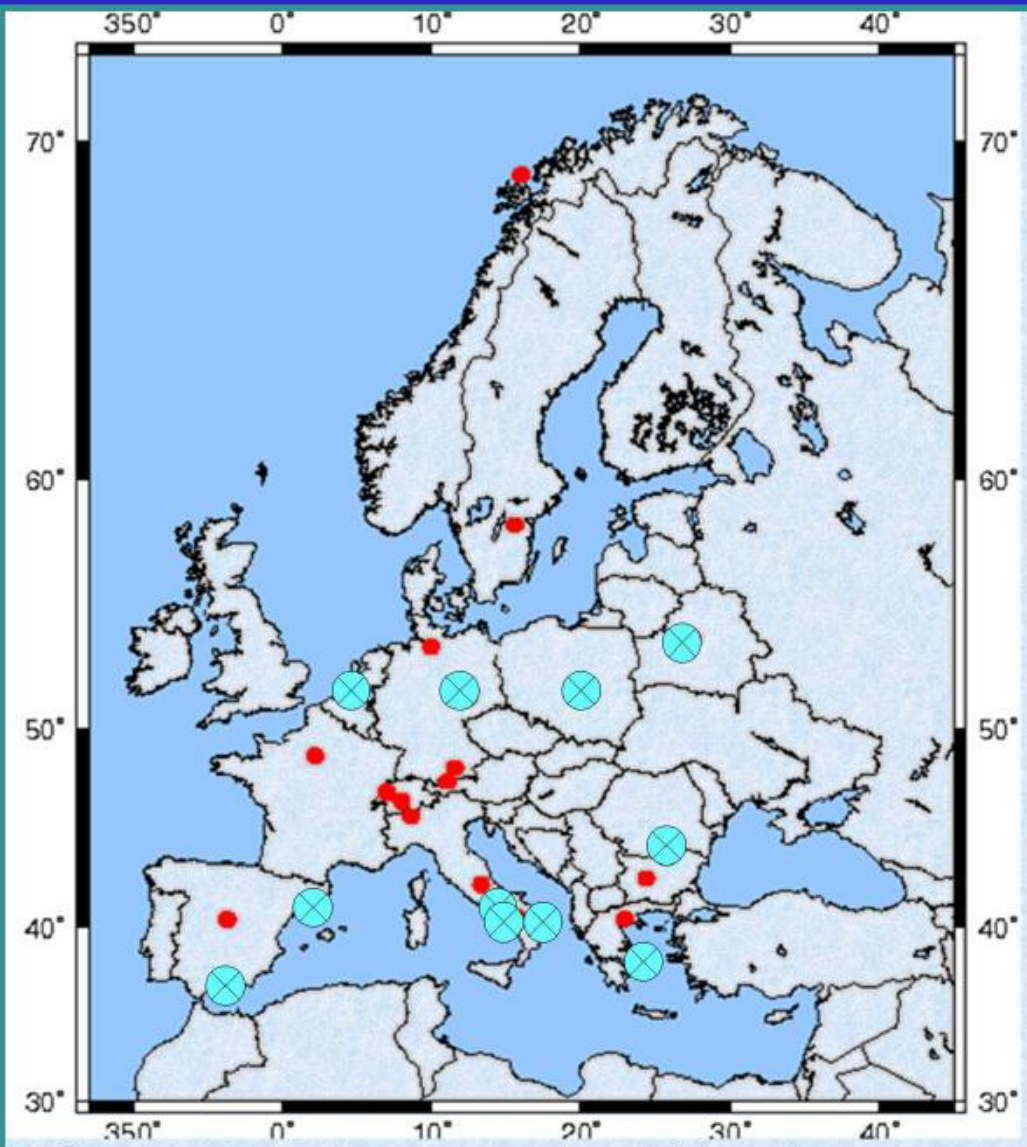
Chaikovskii, Dubovik 2011

Particle  
parameters

(Using model PSD  
from Sun photometer)



# LIRIC becomes popular and useful within EARLINET



LIRIC is employed !!!

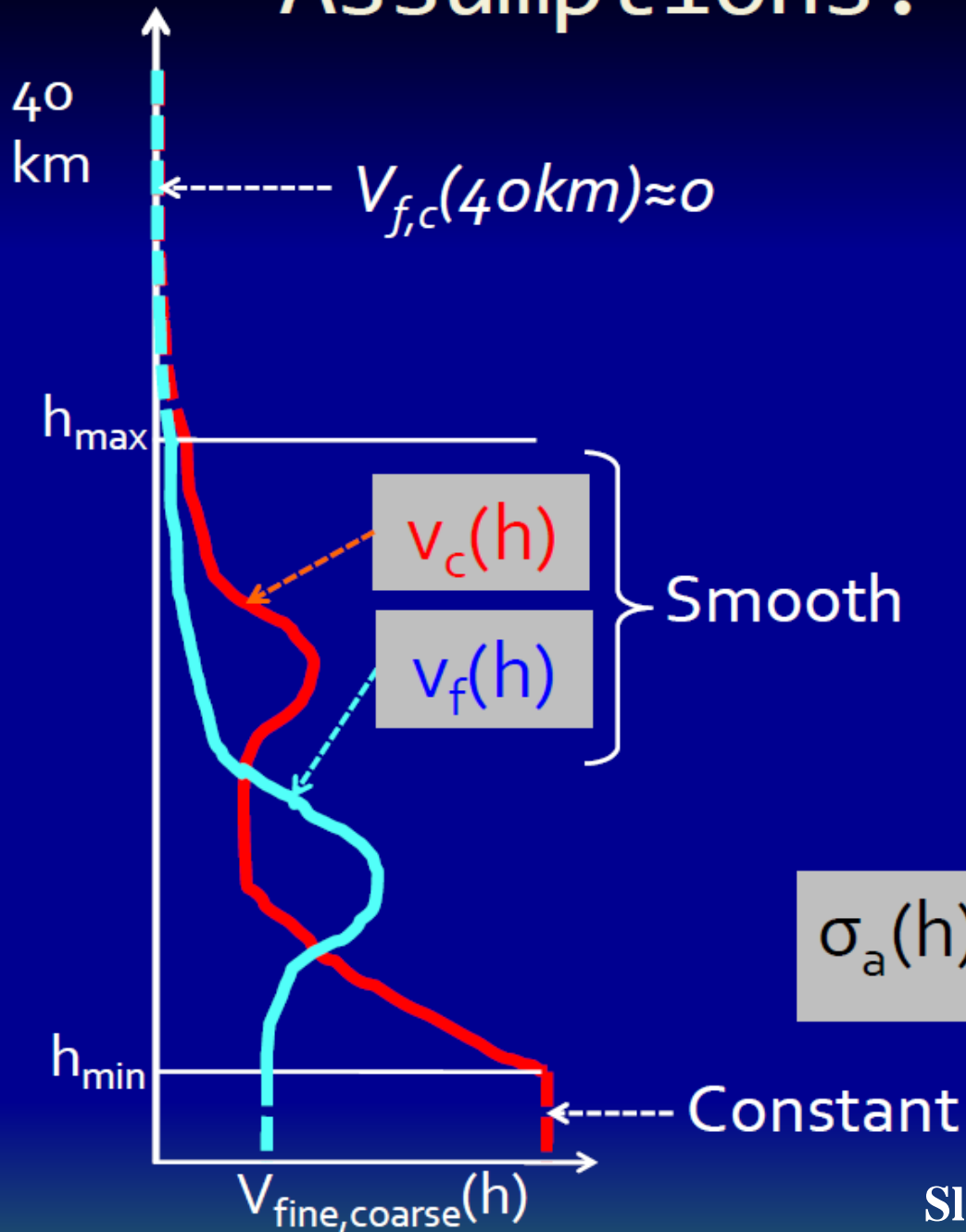


no LIRIC yet ...



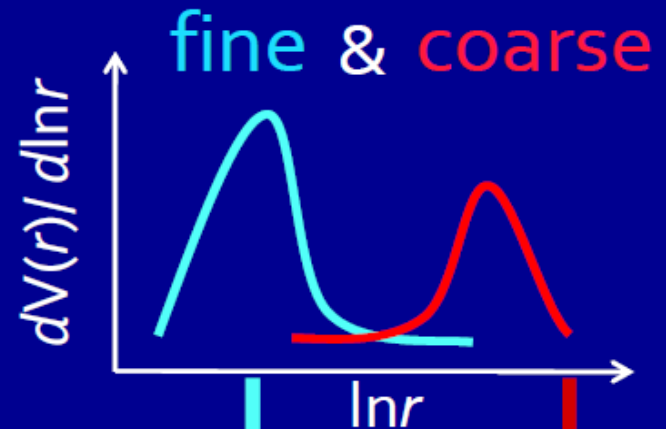


# Assumptions:



Height independent:

- $dV(r)/d \ln r$ ,
- $n(\lambda), k(\lambda)$
- $\omega_o(\lambda), P_{ii}(\lambda, \theta)$

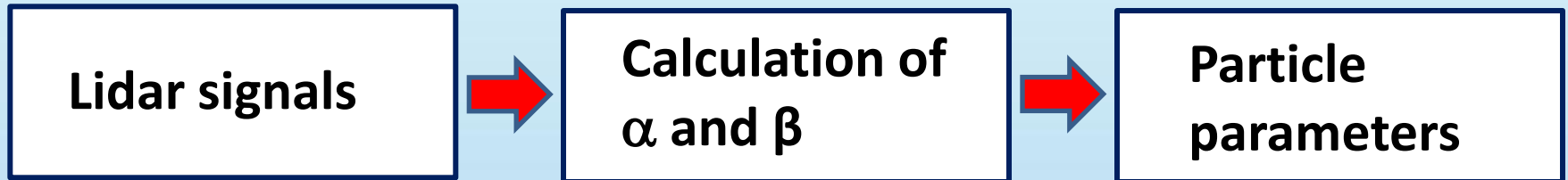


$$\sigma_a(h) = v_f(h)\tau_f^{ext} + v_c(h)\tau_c^{ext}$$

# Limitations of approach

- 1. Column extinction from Sun photometer is used for calibration, so the lidar profiles should be extrapolated to the ground.**
- 2. Approach may fail if the layers with different parameters exist.**
- 3. Sun photometer measurements are not always available.**

# We follow the “traditional” approach



- Joint use of  $\alpha$  and  $\beta$  - key for successful retrieval.
- The most practical configuration of Raman lidar is based on tripled Nd:YAG laser:
  - Three elastic channels and two nitrogen Raman (3+2)
  - Backscattering  $\beta$  – 355, 532, 1064 nm
  - Extinction  $\alpha$  – 355, 532 nm

# Two Approaches to Retrieval

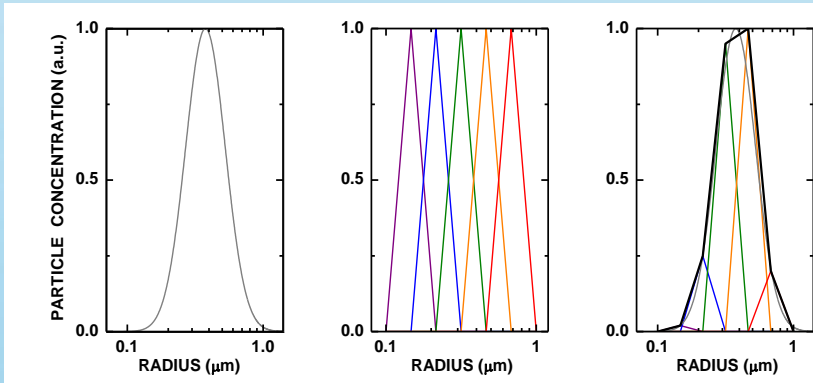
Optical data ( $\alpha$  or  $\beta$ ) at different  $\lambda$  are calculated from equation:

$$g_i = \int_0^{\infty} K_i(m, r, \lambda) \frac{dV(r)}{dr} dr$$

$$\mathbf{K}^T \mathbf{v} = \mathbf{g}$$

$\mathbf{K}$  – discrete kernels  
 $\mathbf{v}$  – discrete volume

## Inversion with regularization

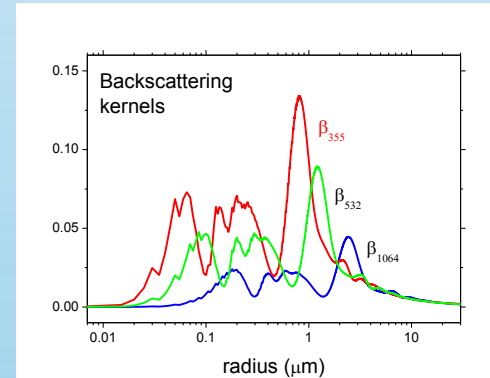


$$\mathbf{v} = \mathbf{B}\mathbf{x}$$

$$\mathbf{g} = \mathbf{K}^T \mathbf{B}\mathbf{x} = \mathbf{A}\mathbf{x}$$

$$\mathbf{x} = (\mathbf{A}^T \mathbf{A} + \gamma \mathbf{H})^{-1} \mathbf{A}^T \mathbf{g}$$

## Kernels expansion



$$\mathbf{v} = \mathbf{K}\mathbf{x} + \mathbf{v}_{\perp} = \mathbf{v}_g + \mathbf{v}_{\perp}$$

$$\mathbf{g} = \mathbf{K}^T \mathbf{K} \mathbf{x} + \mathbf{K}^T \mathbf{v}_{\perp} = \mathbf{K}^T \mathbf{K} \mathbf{x}$$

$$\mathbf{x} = (\mathbf{K}\mathbf{K}^T)^{-1} \mathbf{g}$$

# The problem is underdetermined!

We make a set of initial guesses about:

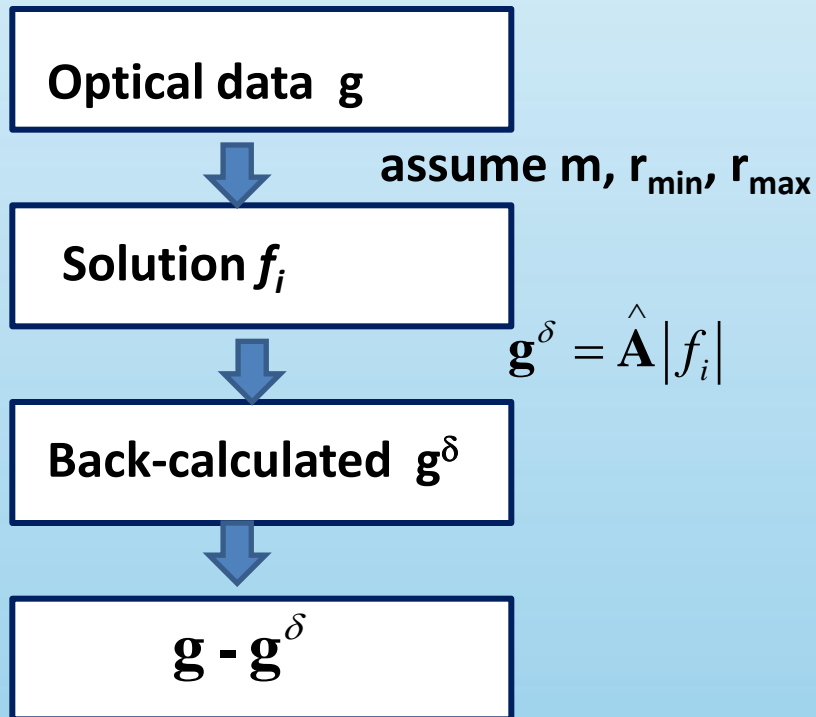
- Real and imaginary parts of CRI  $m_R, m_I$
- Maximal and minimal particle radii  $r_{\max}, r_{\min}$   
(inversion interval)

Instead a single solution we have a family of solutions.

Solutions are selected on a base of **discrepancy**.

# Two ways to calculate the discrepancy

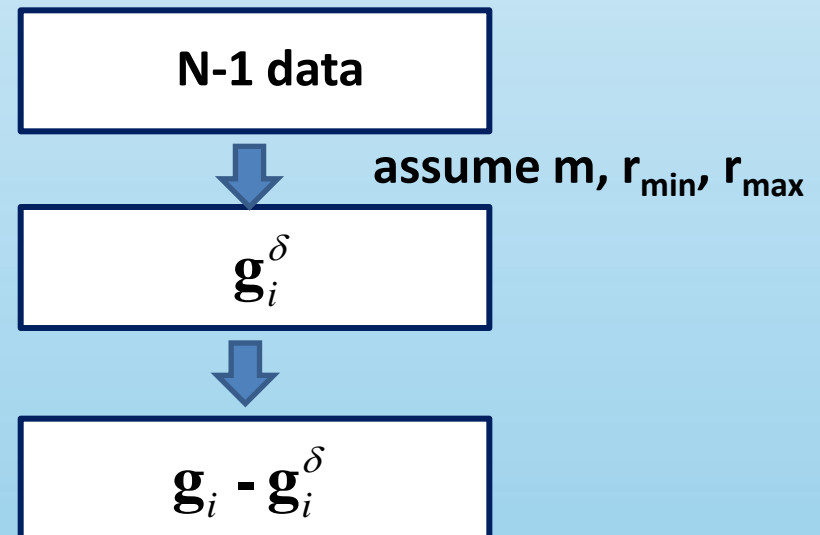
## Inversion with regularization



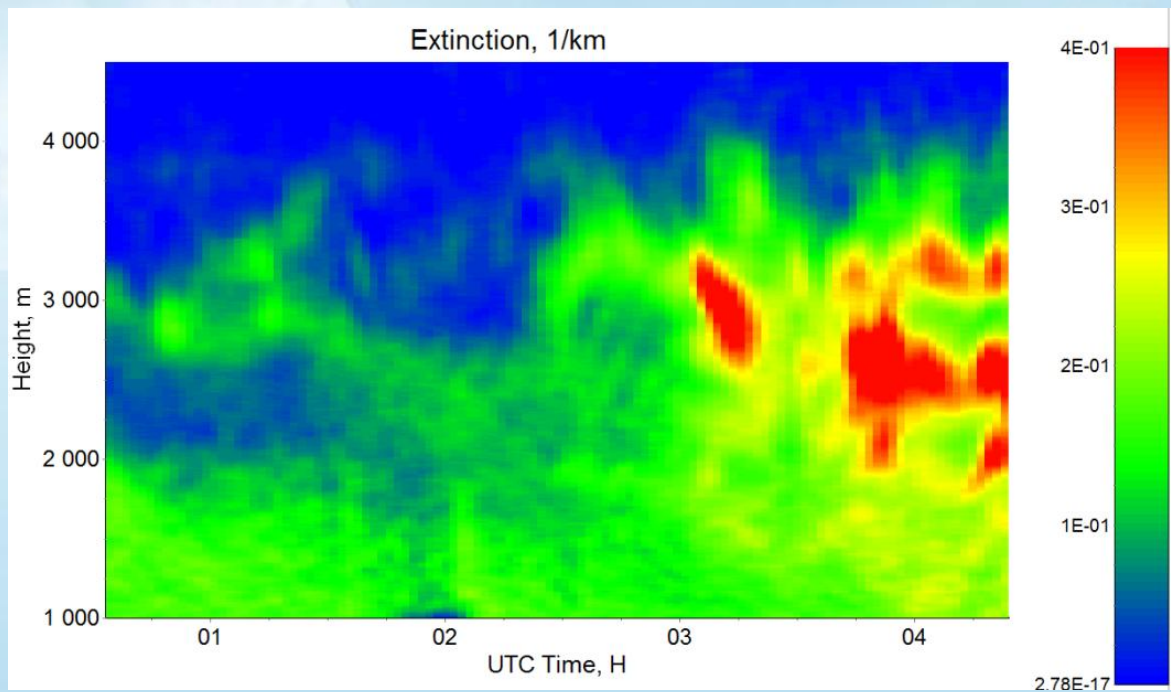
Discrepancy is minimized by adjusting Lagrange multiplier, so it controls the smoothness of solution

## Kernels expansion

One optical data  $g_i$  is estimated from the rest of  $N-1$  measurements



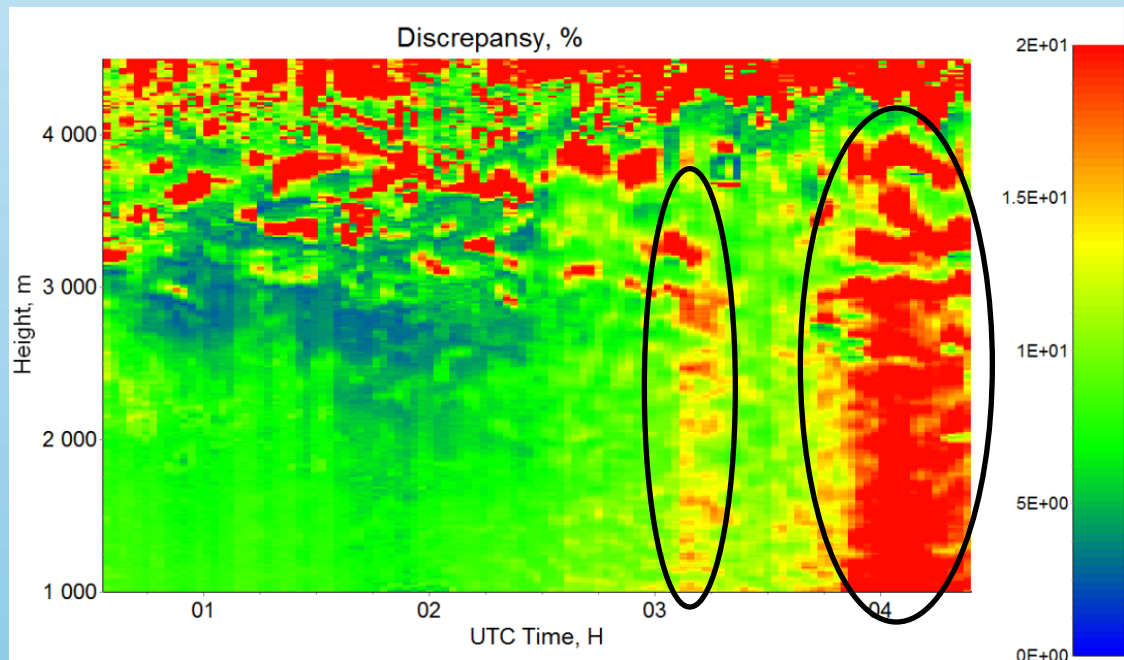
Discrepancy describes the consistency of optical data for the found solution



**Example of “data quality control” via discrepancy**

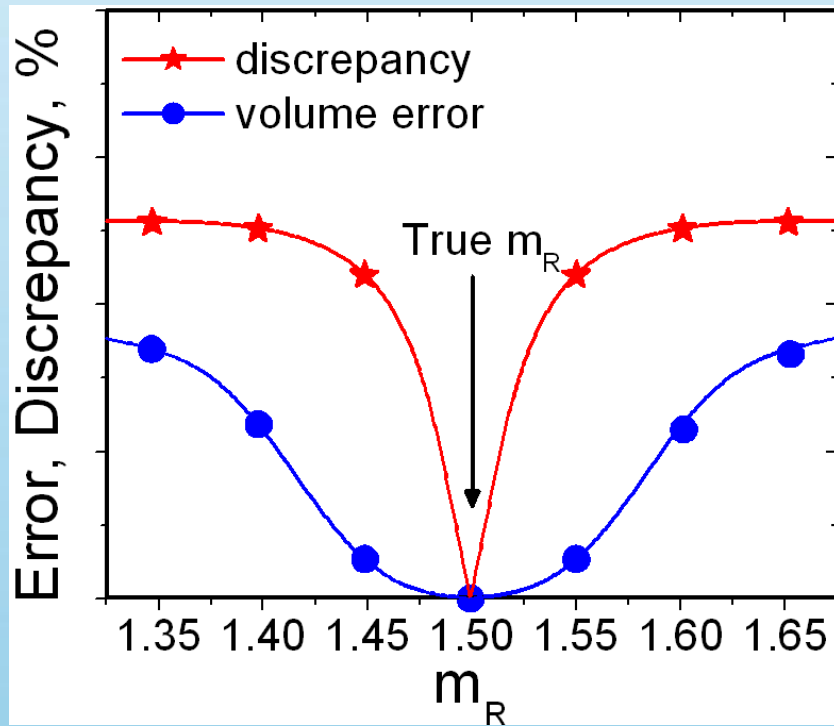
**Extinction at 355 nm calculated by Raman**

**Discrepancy of 3+1 data  
In the areas marked with red the data are inconsistent**

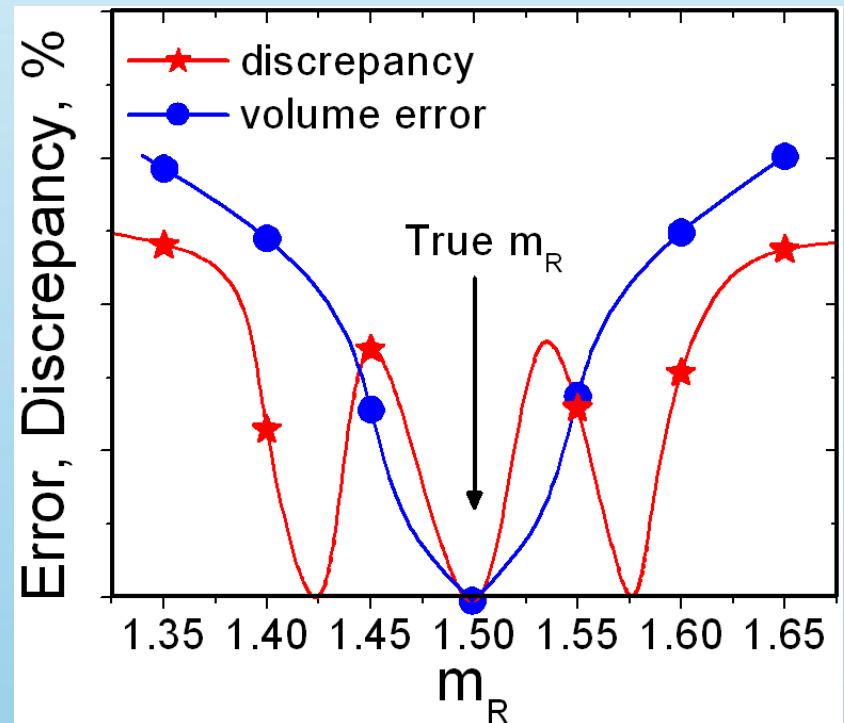


# Estimation of complex refractive index

“Dream” case



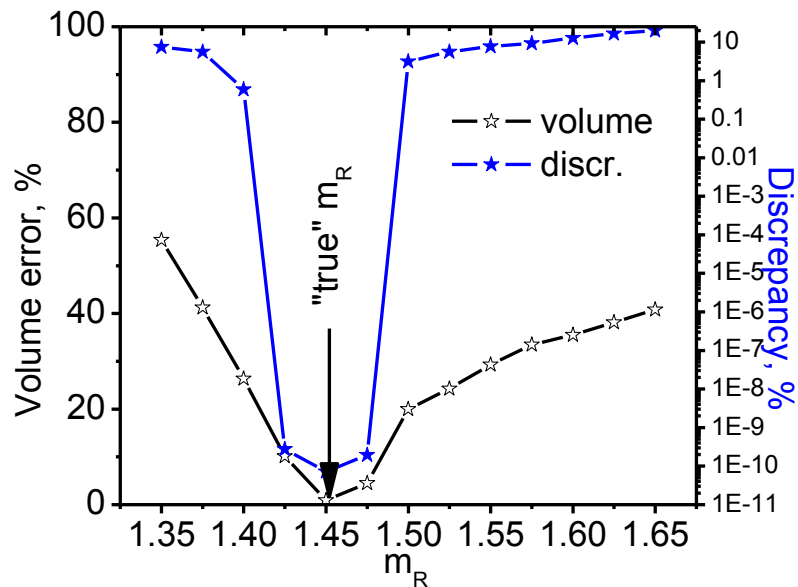
“Nightmare” case



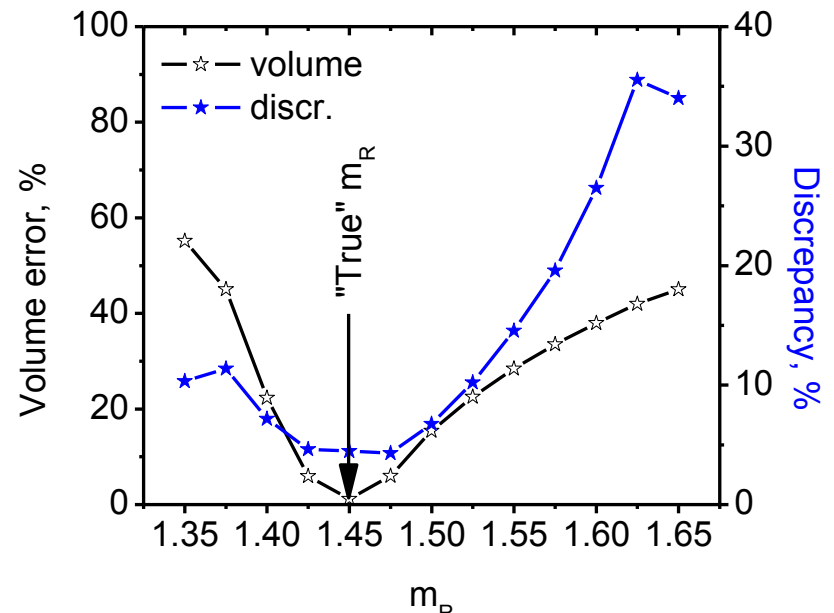


# Modeling of realistic case

## Inversion with regularization

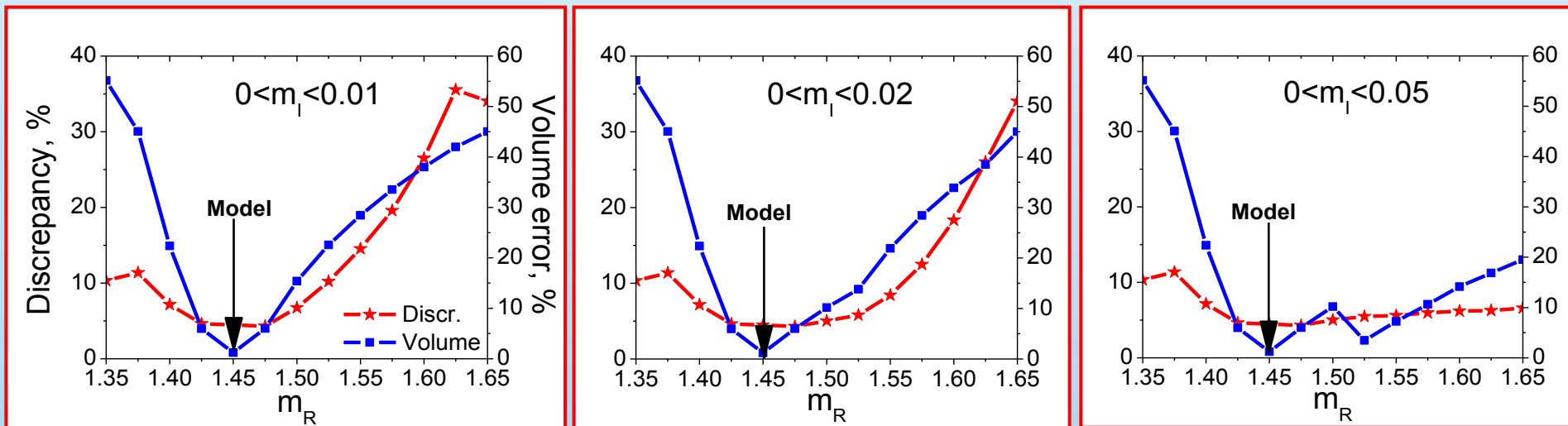


## Kernels expansion



Simulation was performed for the fine mode particles

# Result depends on the range of imaginary part variation

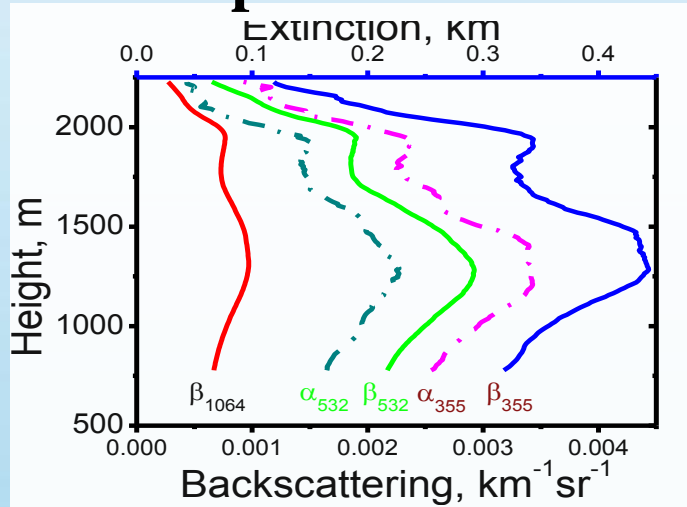


Example of simulation for the fine mode of PSD. Different ranges of  $m_i$  variation are considered.

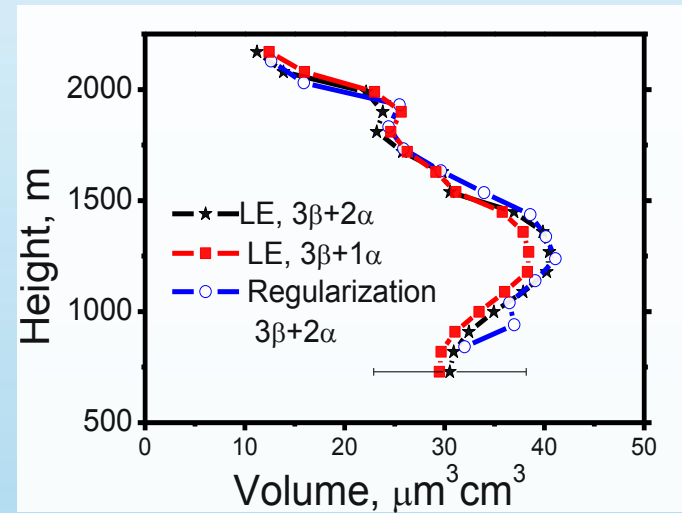
Model value of CRI is  $m=1.45-i0.005$

# Comparison of regularization and linear estimation techniques

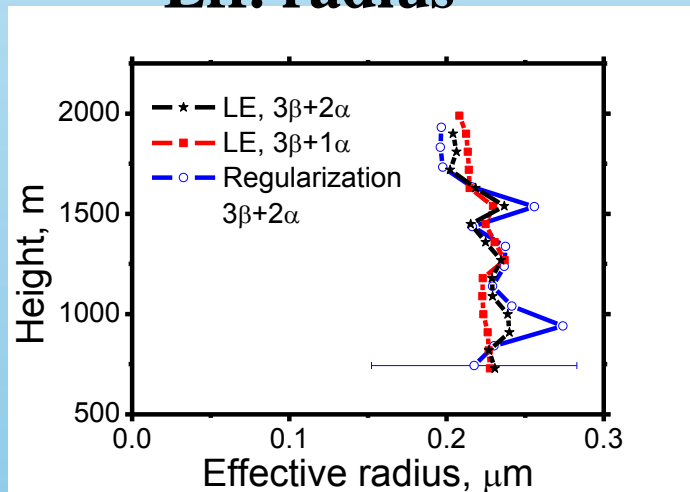
## Optical data



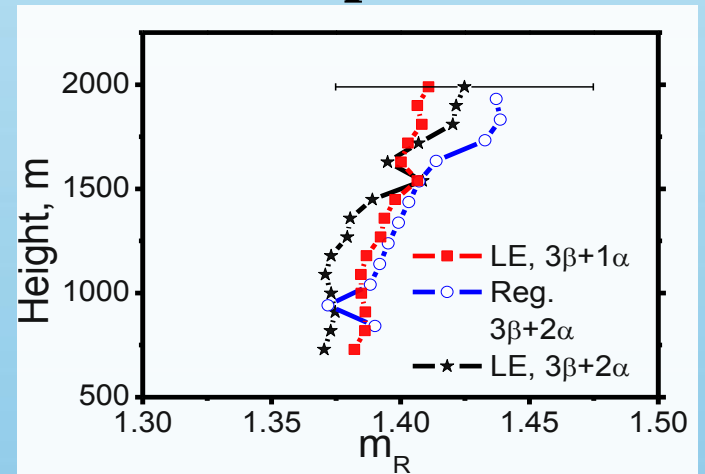
## Volume



## Eff. radius



## Real part



# DISCOVER-AQ 2011 CAMPAIGN

The P-3B aircraft carried a suite of nine scientific instruments including NASA LARC HSRL system.

14 flights occurred during June 27 - July 31 period over Baltimore – Washington area.

GSFC multiwavelength Raman lidar performed the measurements from the ground

## *Lidar parameters:*

Telescope aperture            400 mm

Laser power at 355 nm – 20 W

## Operational wavelengths:

elastic – 355, 532, 1064 nm

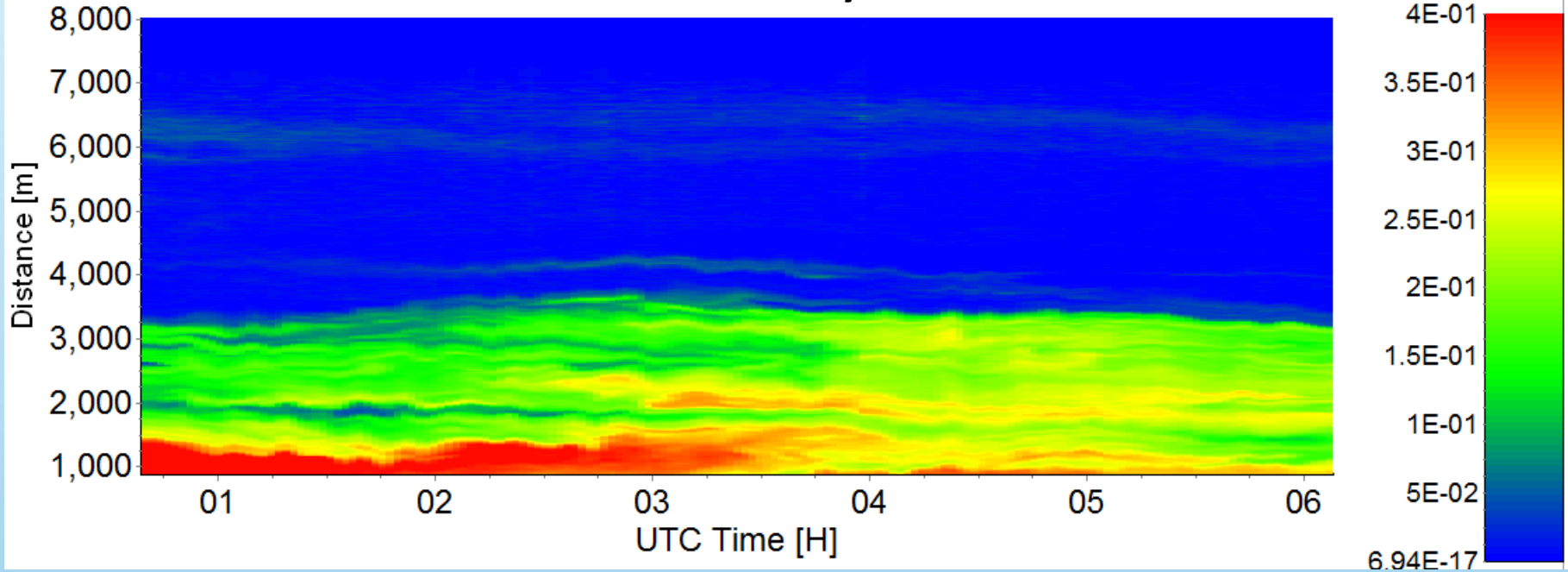
Raman – 387, 608, 408 nm

- Temporal resolution of the measurements – 2 min.
- Measurements are vertical, height resolution 15 m.
- Sonde data are from Beltsville (~5 miles apart)



# 20 – 21 July measurements

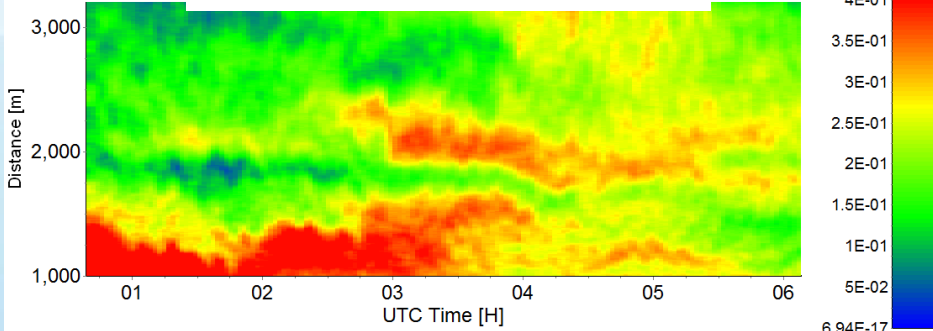
Extinction at 355 nm by Klett



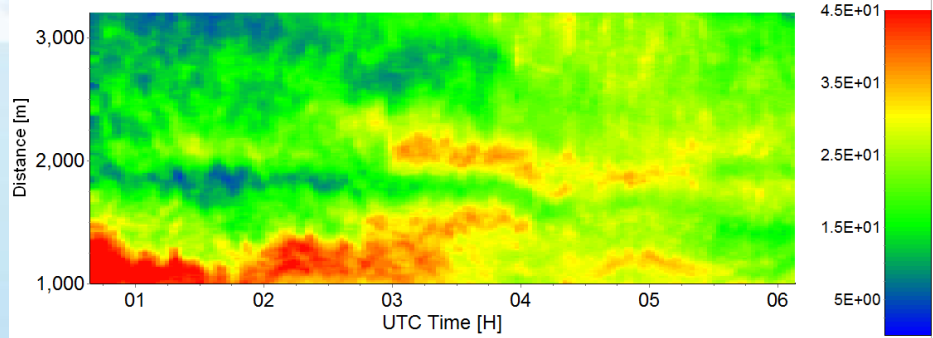
**Aerosol is represented mainly by sulfates and biomass burning products. RH is insufficient for significant hygroscopic growth.**

# Retrieval of height – temporal distributions of particle parameters

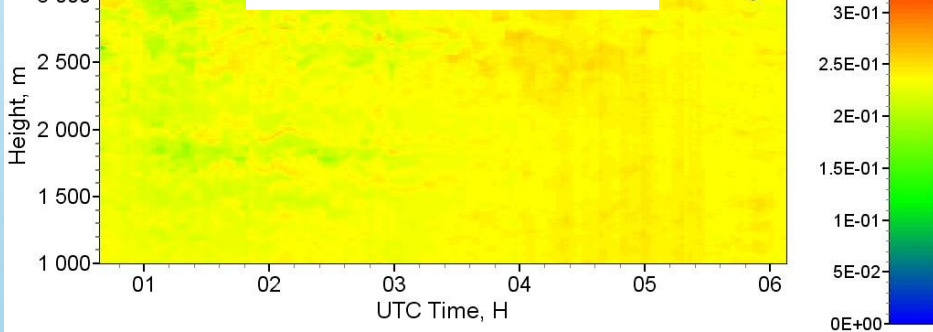
### Extinction at 355 nm, $\text{km}^{-1}$



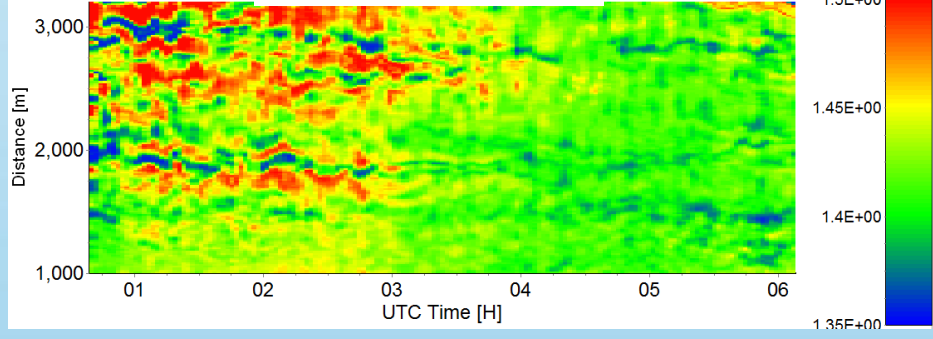
### Volume density



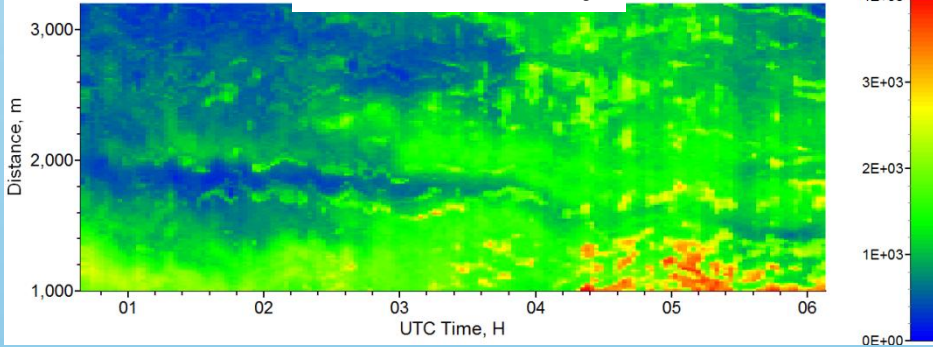
### Effective radius, $\mu\text{m}$



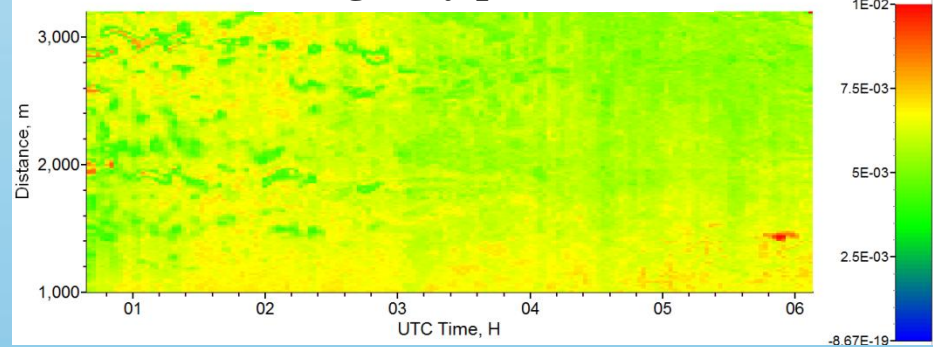
### Real part of CRI



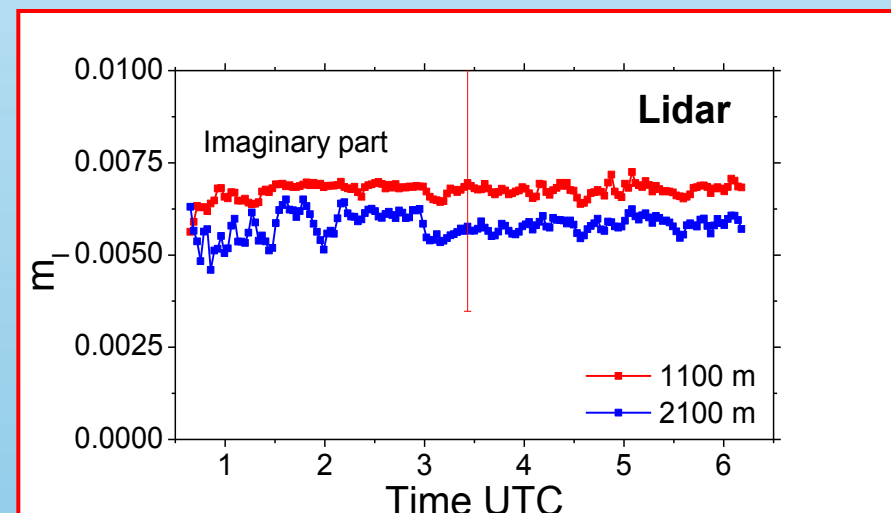
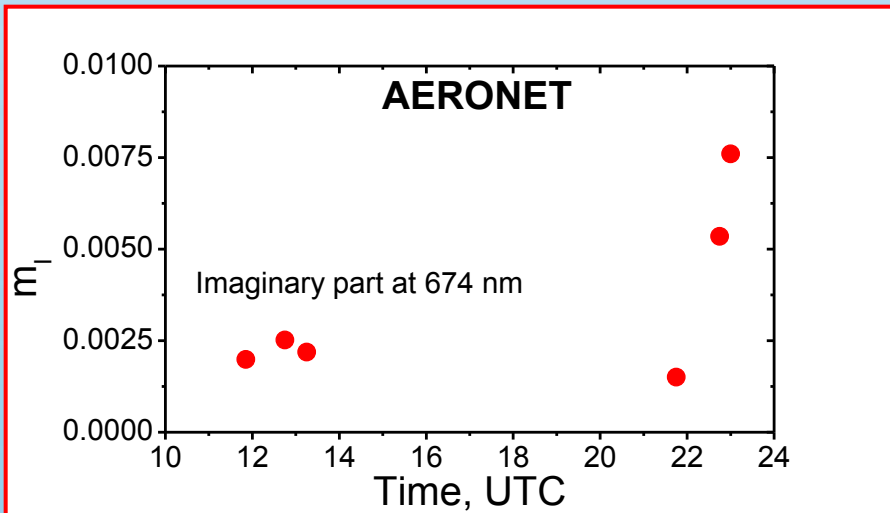
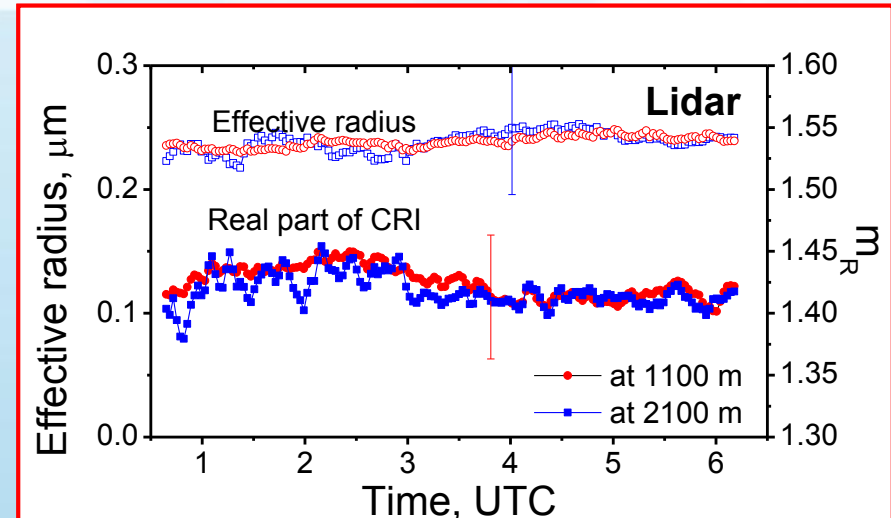
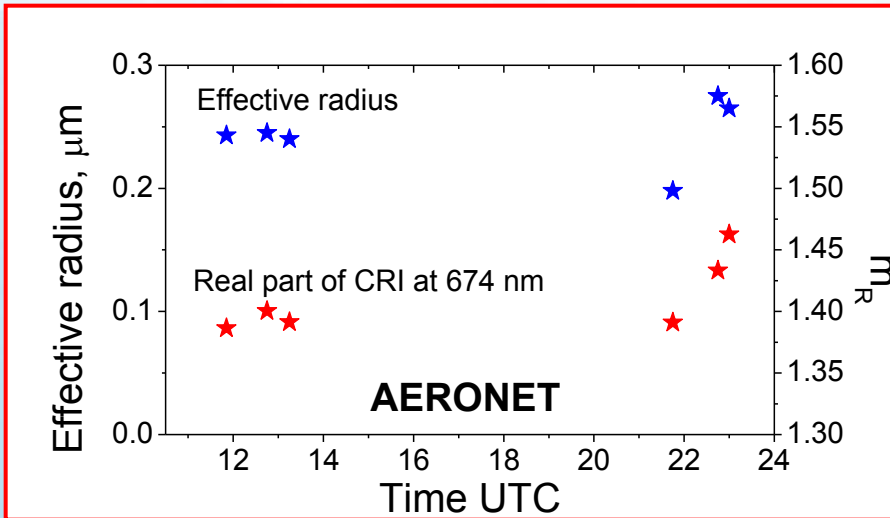
### Number density



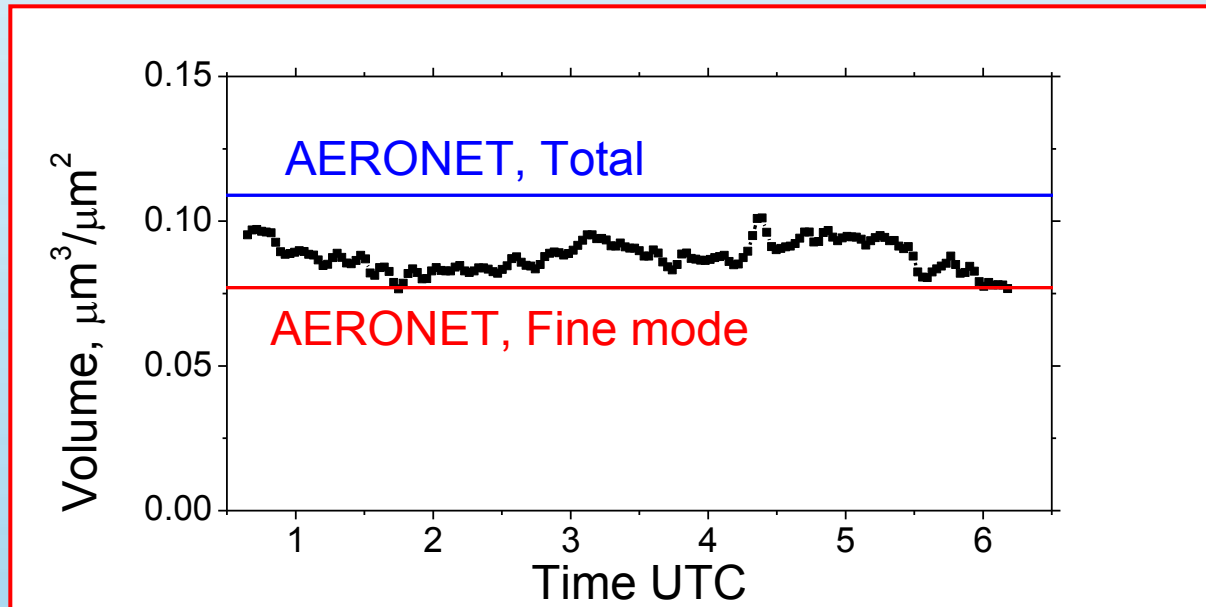
### Imaginary part of CRI



# Comparison with AERONET



# Lidar derived column volume

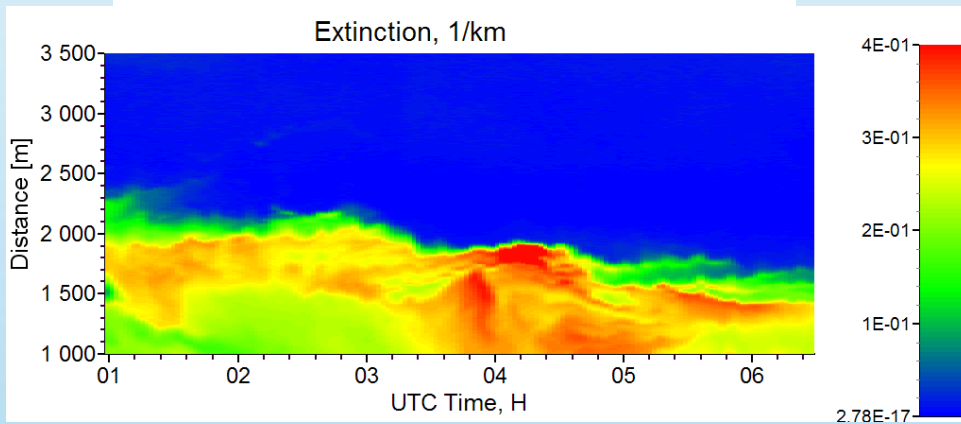


**Volume profiles are extrapolated as constant below 1000 m.  
For comparison AERONET results at 23:00 UTC are shown.**



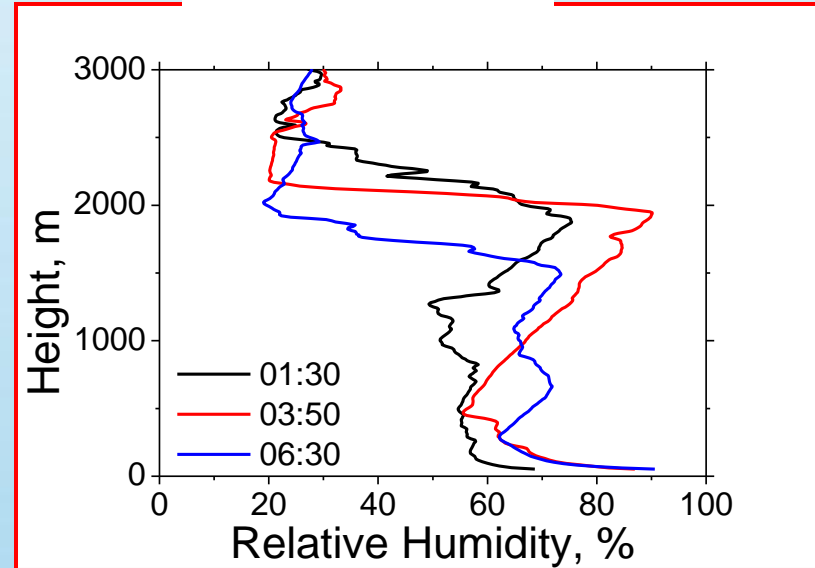
# 21 – 22 July measurements

## Extinction at 355 nm by Klett

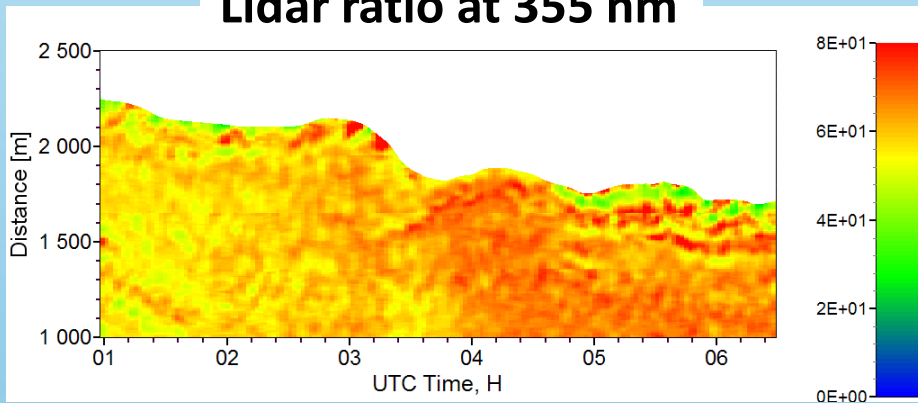


**At 03:50 RH is increased up to 90% near the PBL top**

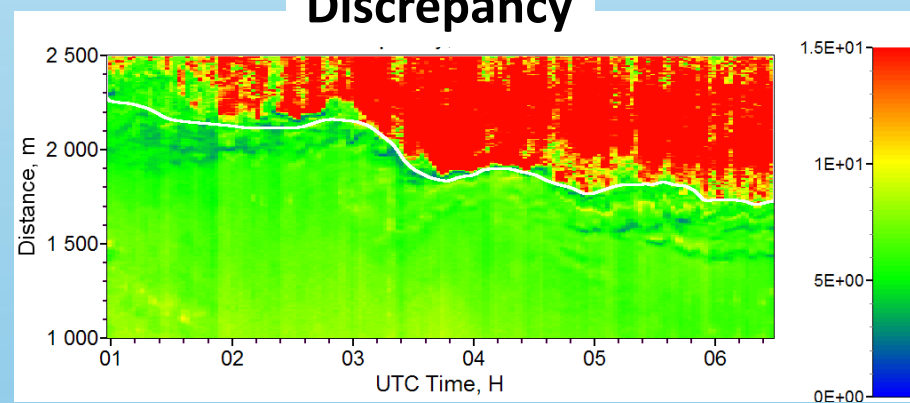
## RH from sonde



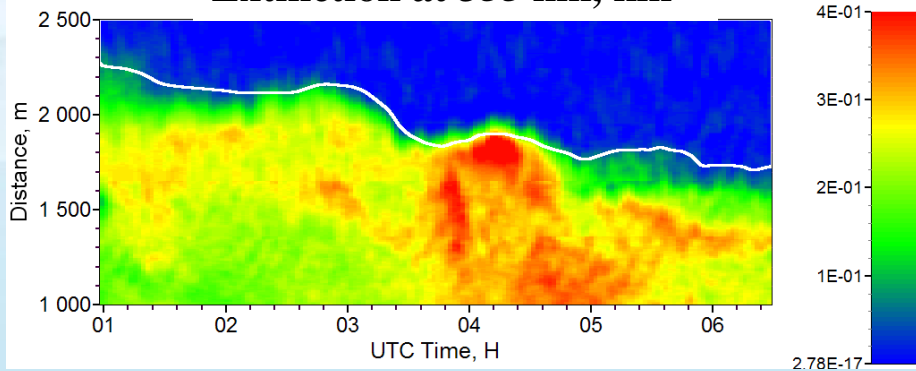
## Lidar ratio at 355 nm



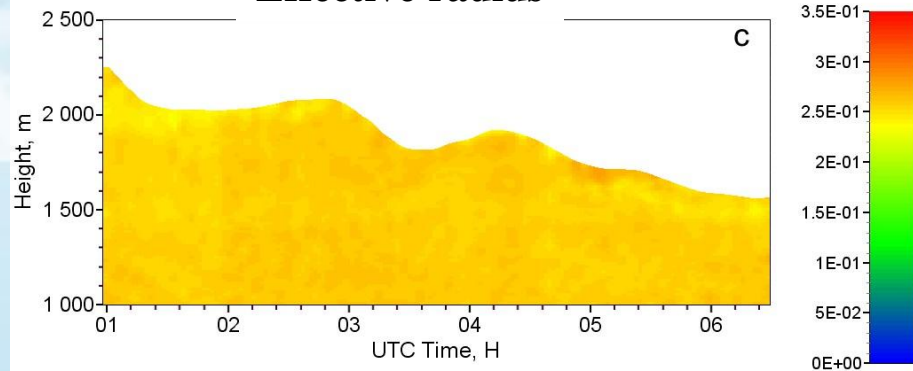
## Discrepancy



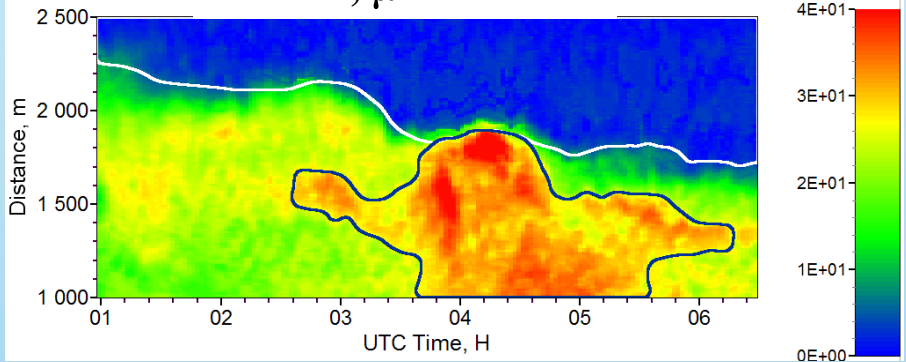
### Extinction at 355 nm, $\text{km}^{-1}$



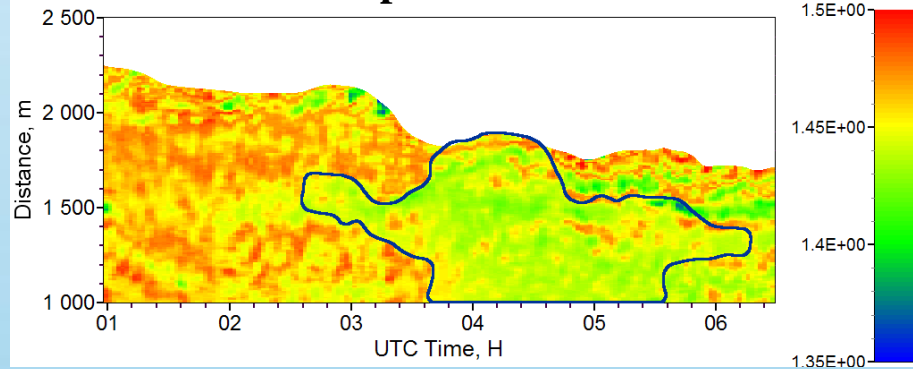
### Effective radius



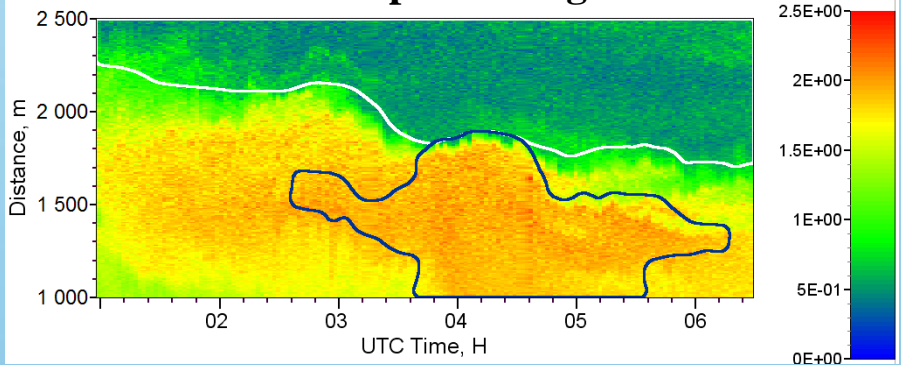
### Volume, $\mu\text{m}^3/\text{cm}^3$



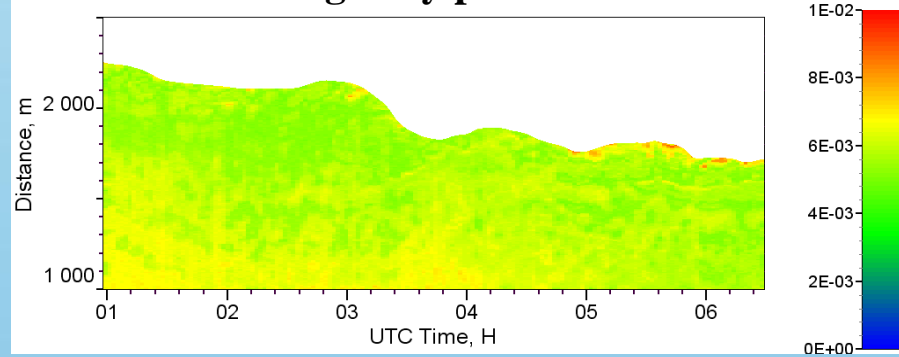
### Real part of CRI



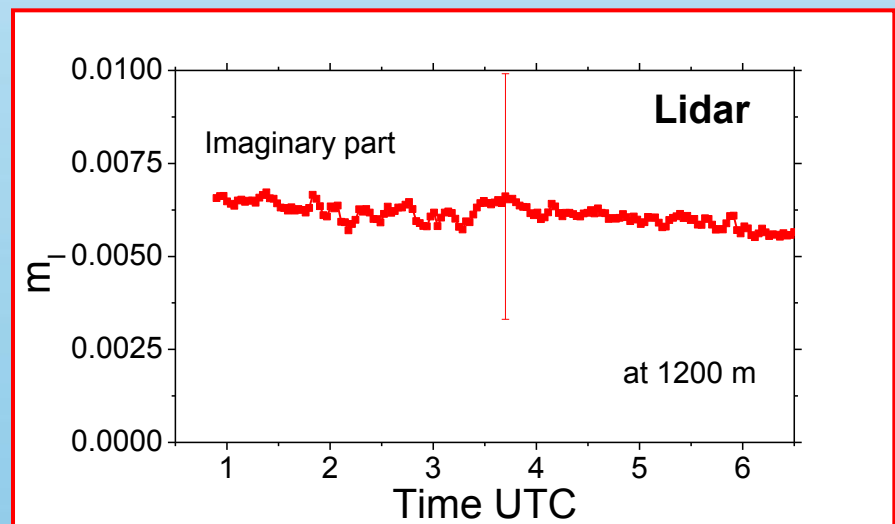
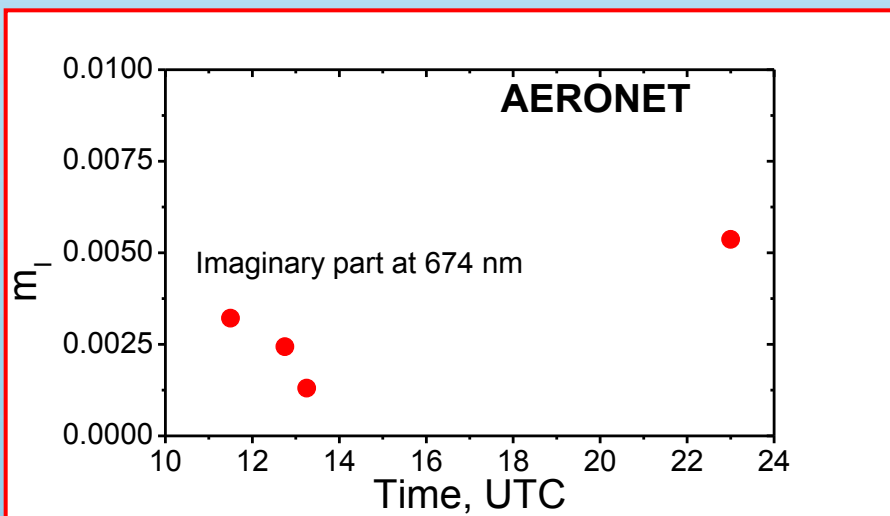
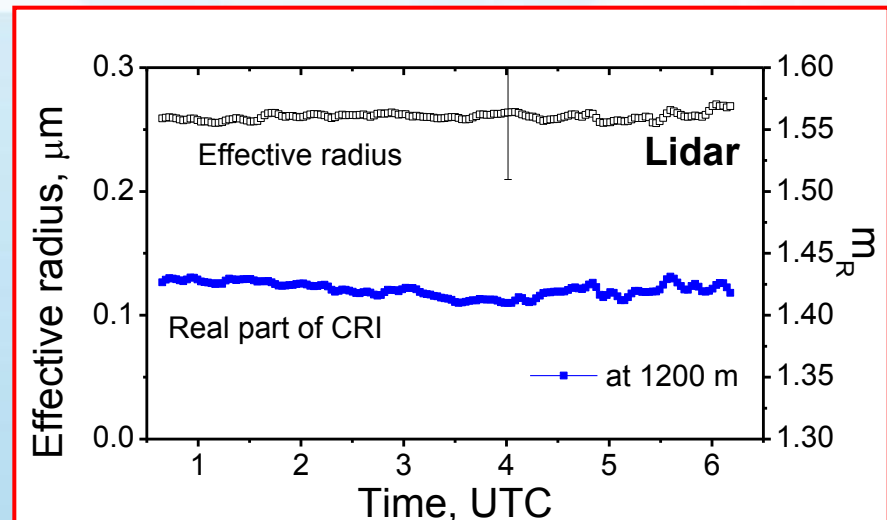
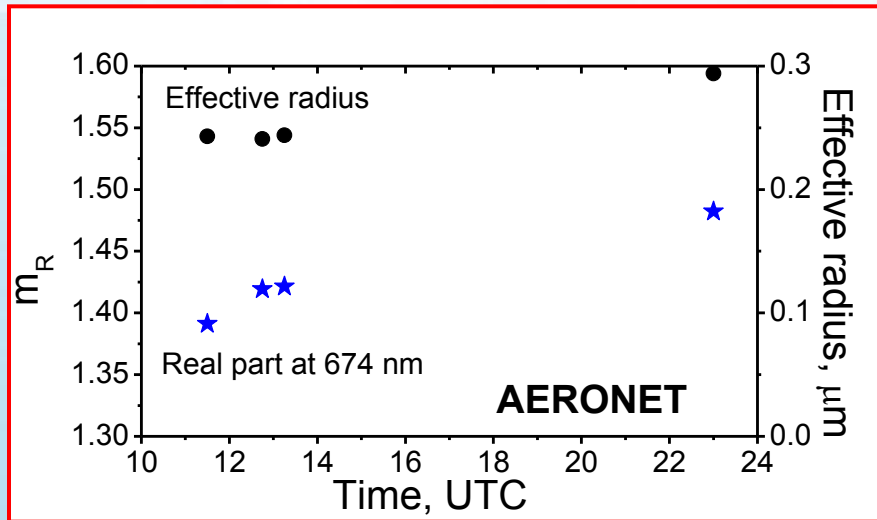
### Water vapor mixing ratio



### Imaginary part of CRI

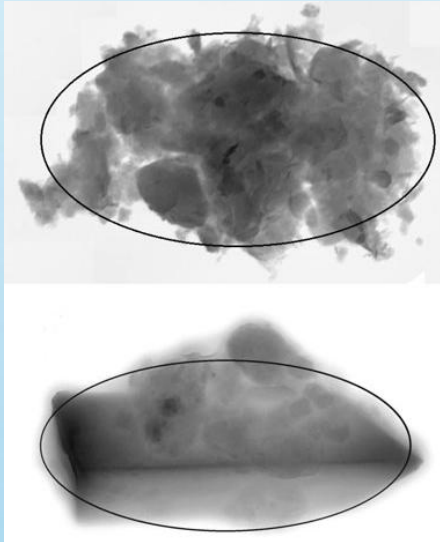


# Comparison with AERONET



# Treatment of Dust Particles

from M. Wiegner et al.



**Main Idea:** generalizing aerosol modeling by using randomly oriented spheroids instead of spheres (Mishchenko et al. 1997)

Parameters:  $dV(r)/d\ln r$ , +  $dn(\epsilon)/d\ln \epsilon$

$r$  - radius of volume-equivalent sphere

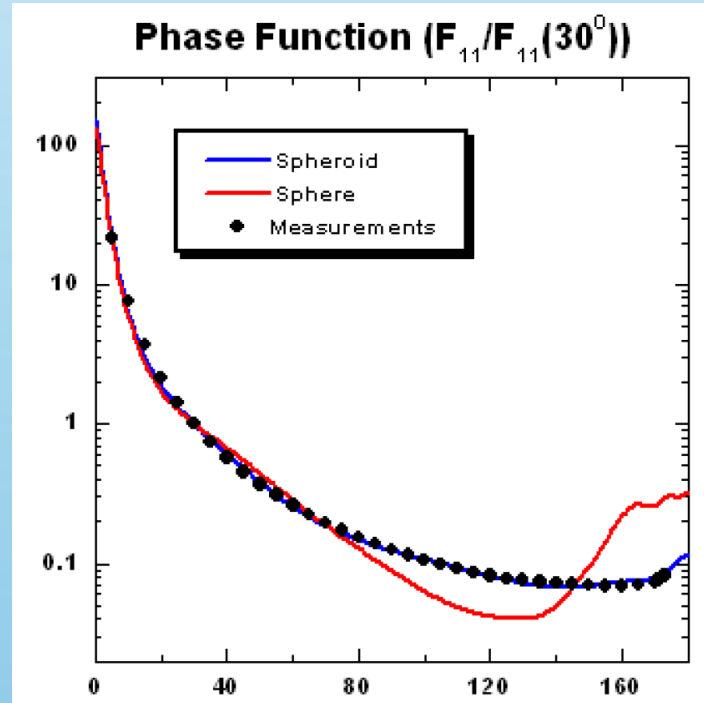
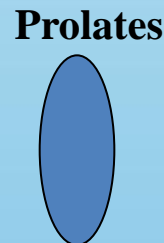
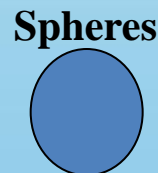
$\epsilon$  - aspect ratio

from O. Dubovik

The positive experience of AERONET is used:

- Aerosol is mixture of spheres and spheroids

$$\frac{\partial V(r)}{\partial \ln r} = \frac{\partial V^s(r)}{\partial \ln r} + \frac{\partial V^{un}(r)}{\partial \ln r}$$



# Spheroidal model is simplified

- Aspect ratio distribution of spheroids is size independent;
- Aspect ratio distribution of spheroids is fixed (to match laboratory measured phase function);
- Prolates or oblates contribute equally;

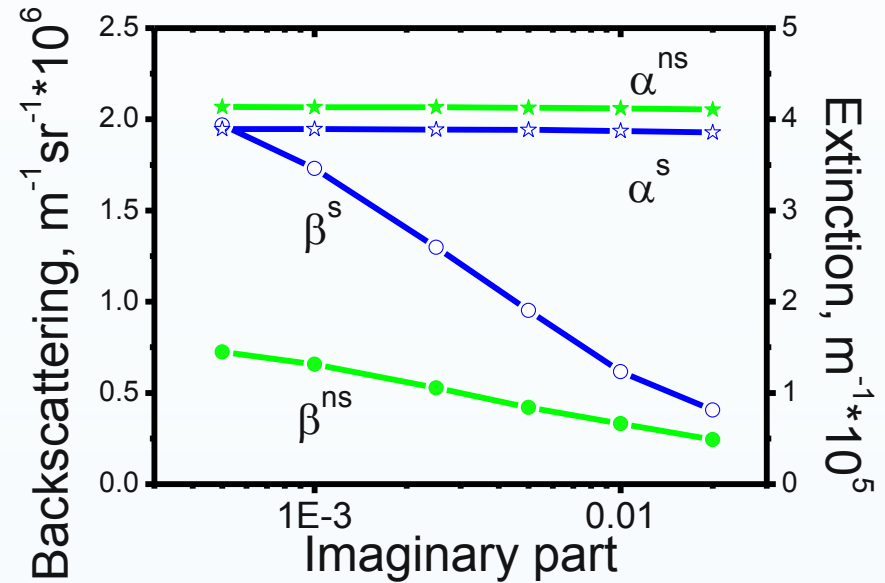
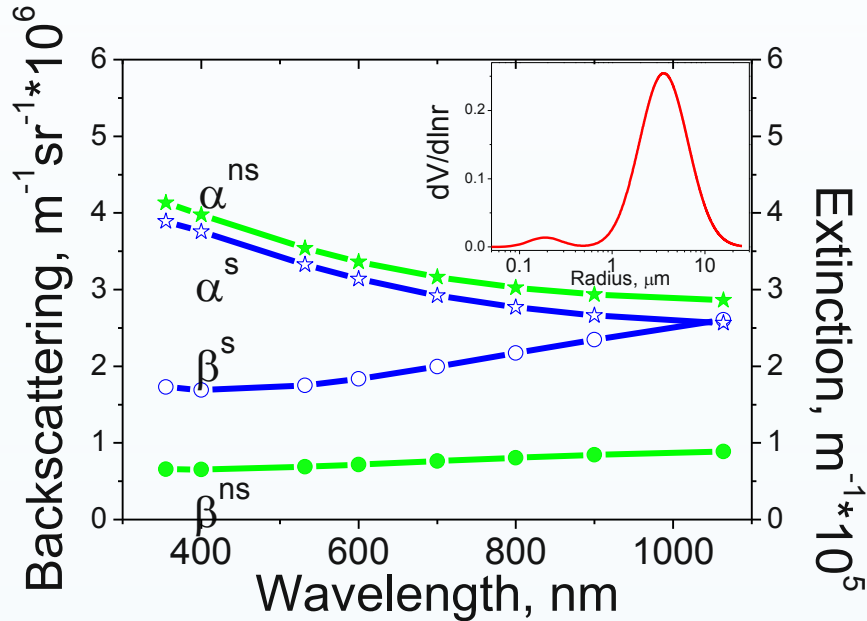
Only one additional parameter appears comparing with spherical particles: spheroids volume fraction  $\eta$

$$\mathbf{g} = \mathbf{A}(\eta, m) \mathbf{C}$$

$$A_{pj}(\eta, m) = \int_{r_{\min}}^{r_{\max}} [(1 - \eta)K_p^s(m, r) + \eta K_p^{un}(m, r)] B_j(r) dr$$

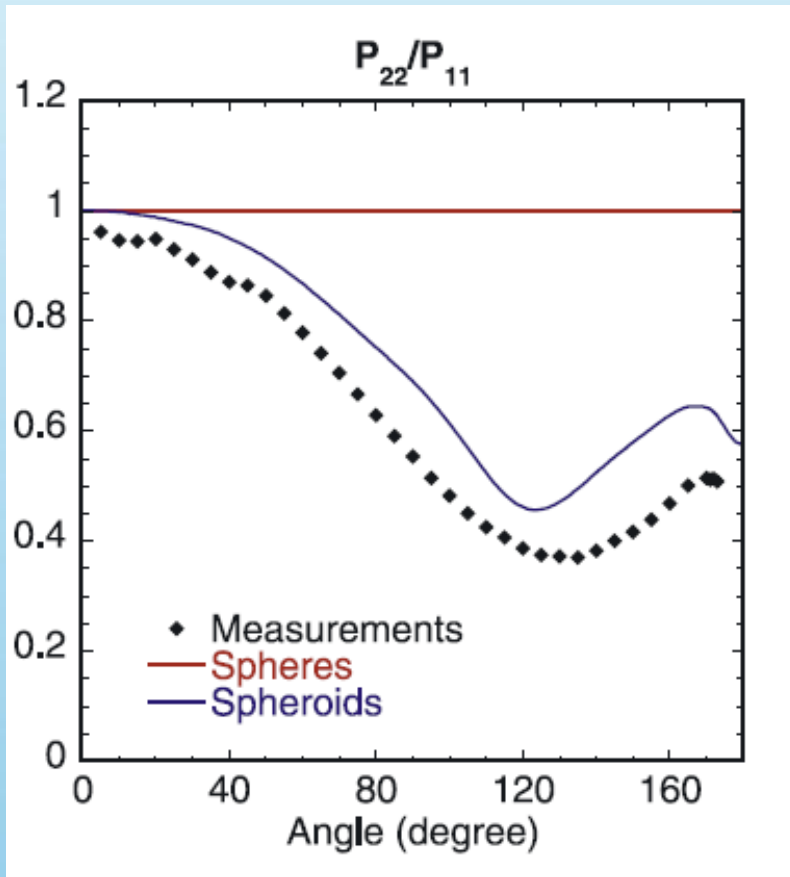
# Difference between spheres and spheroids

## Scattering for spheres (s) and spheroids (ns)

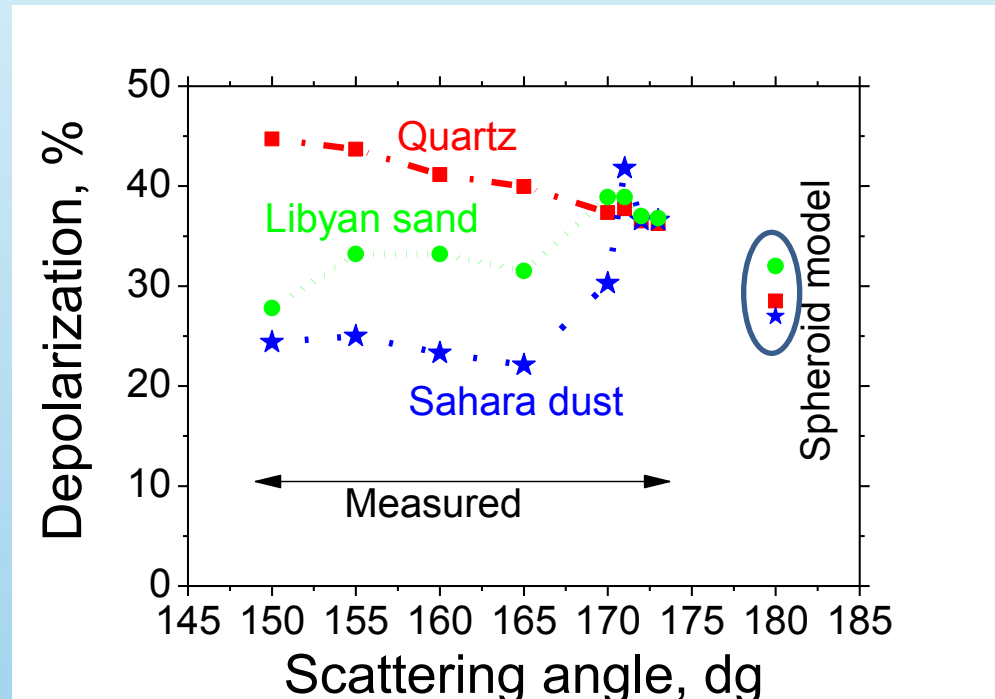


# Can we use depolarization in retrieval?

*From Dubovik et al*



Experimental data of Volten

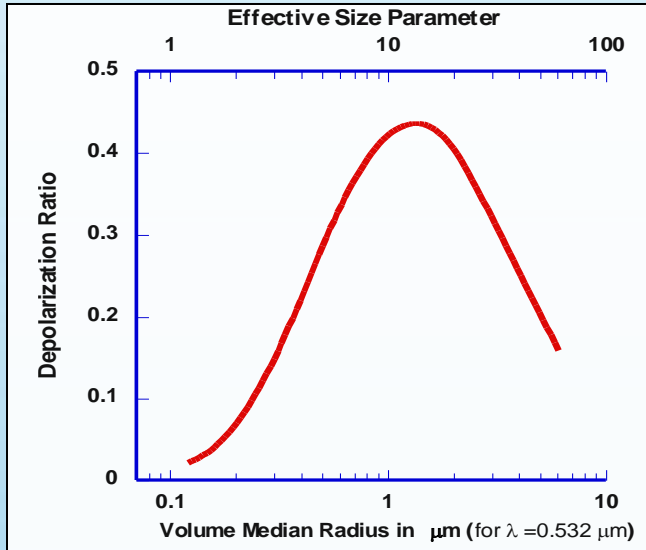


How many depolarizations do we need?  
One...

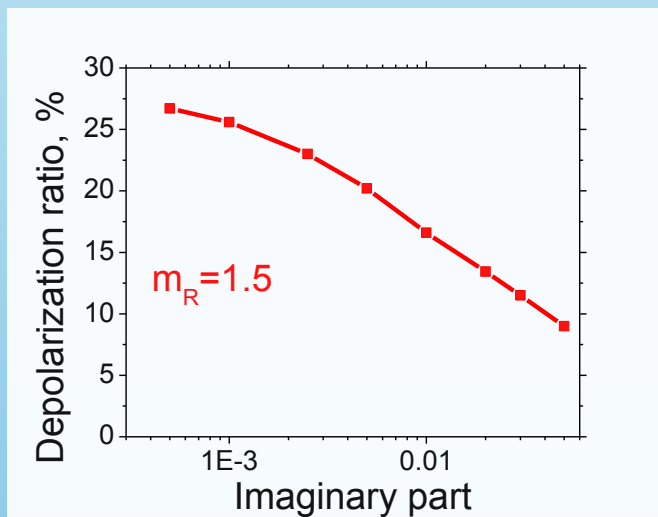
# Predictions of spheroid model for depolarization

Depolarization vs  
particle radius

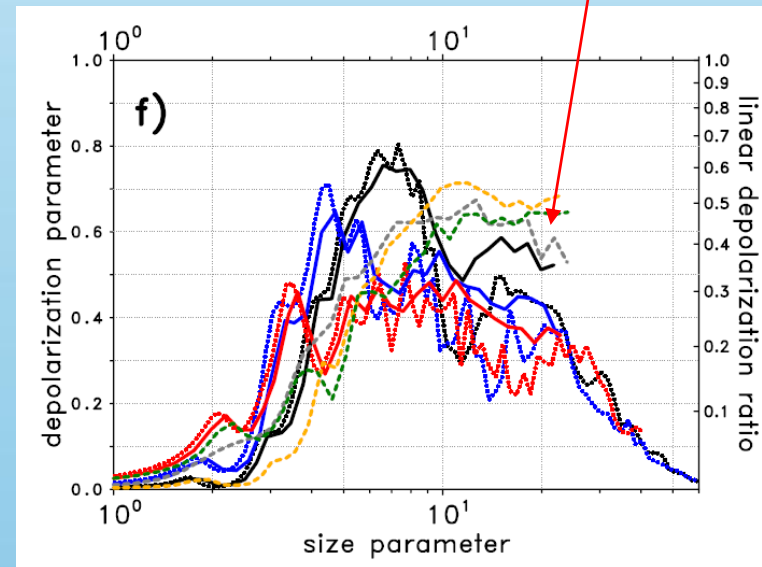
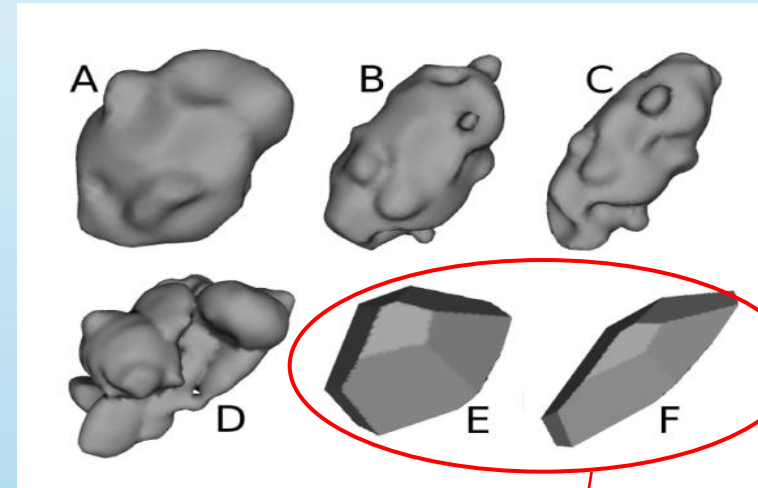
From O. Dubovik et al.



Depolarization vs  
imaginary part



From Gasteiger et al, Tellus 2011

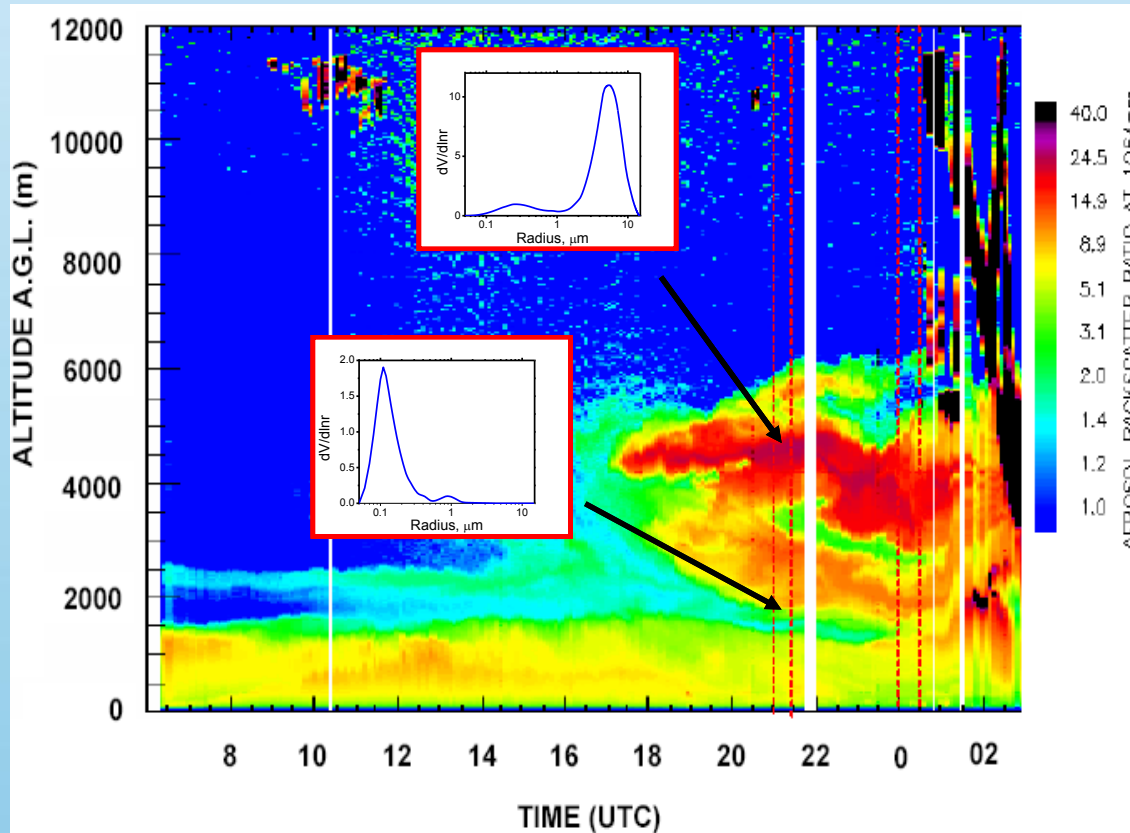




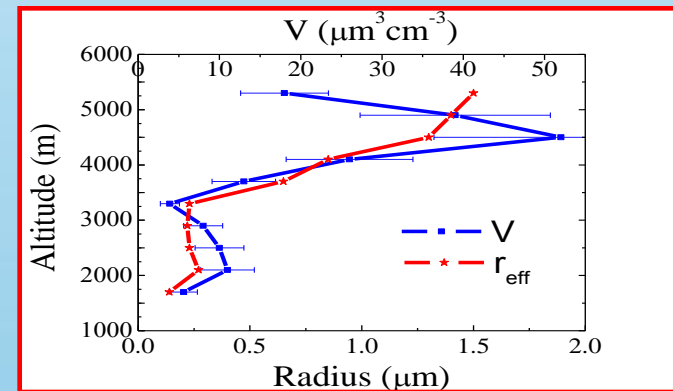
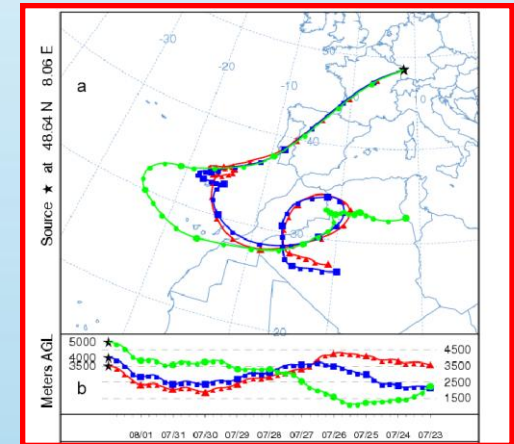
# Saharan dust outbreak, Achern 2007

*Data of Paolo Di Girolamo*

Time evolution of the particle backscatter ratio at 1064 nm. Dust outbreak occurs on 1 August 2007 around 18:00. In the centre of plume the coarse mode dominates PSD.

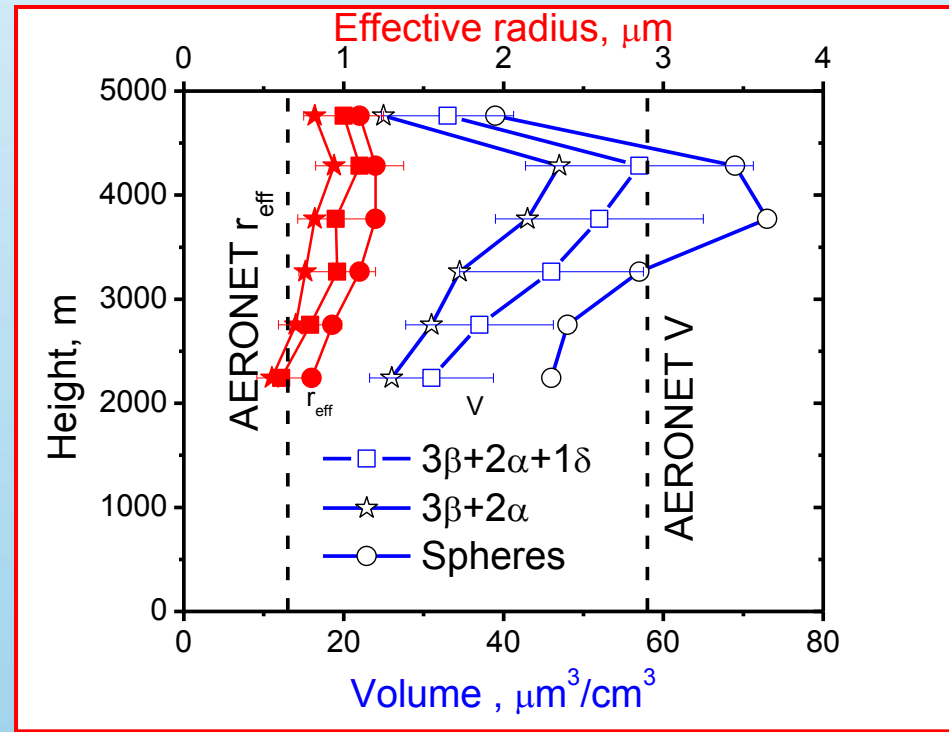
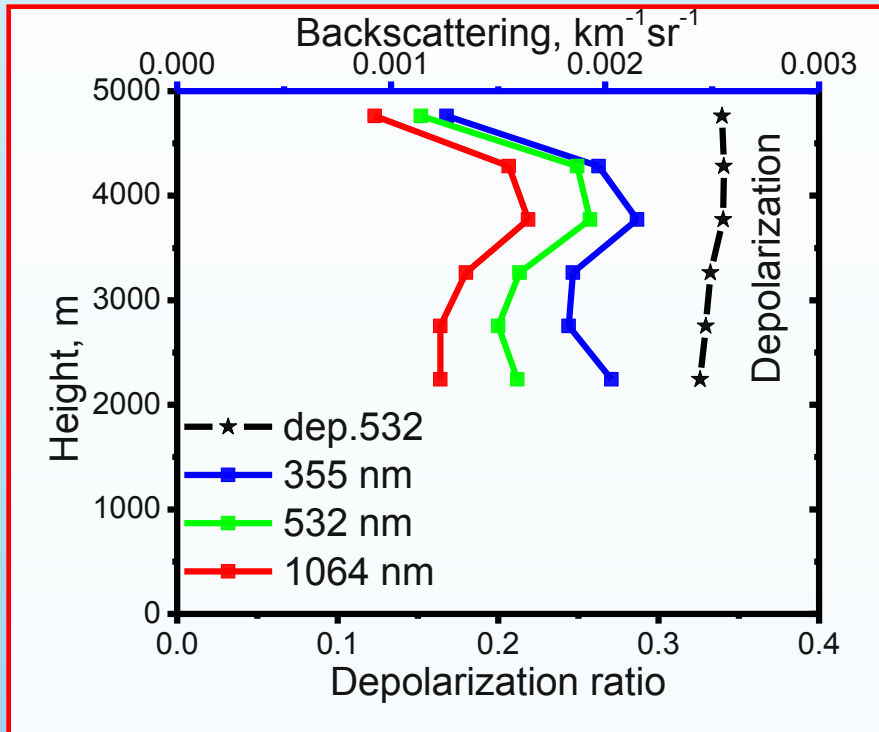


## Back trajectories



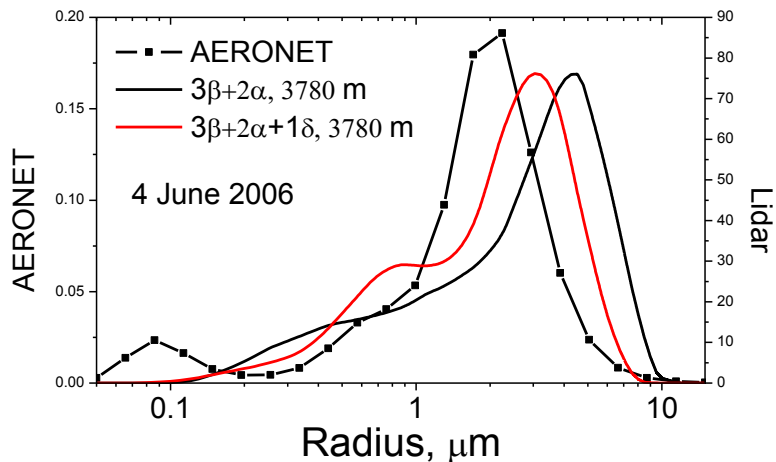
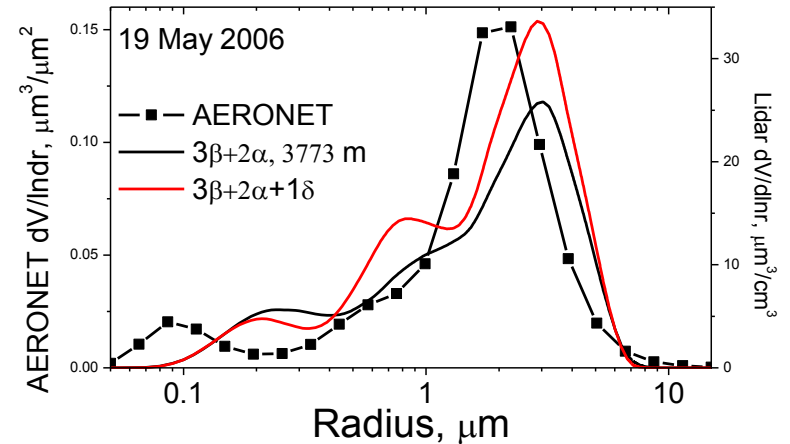
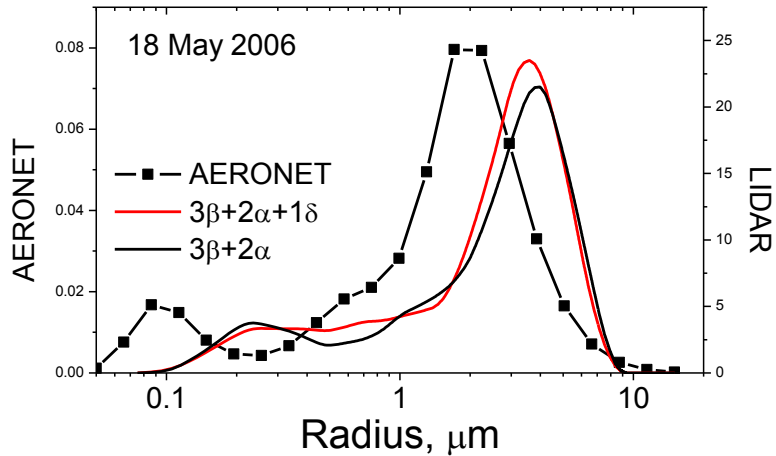
Profile of volume density and effective radius

# Application of algorithm to experimental data of M.Tesche et al. from SAMUM-1 (May 19, 2006)



# PSDs obtained from SAMUM-1 data

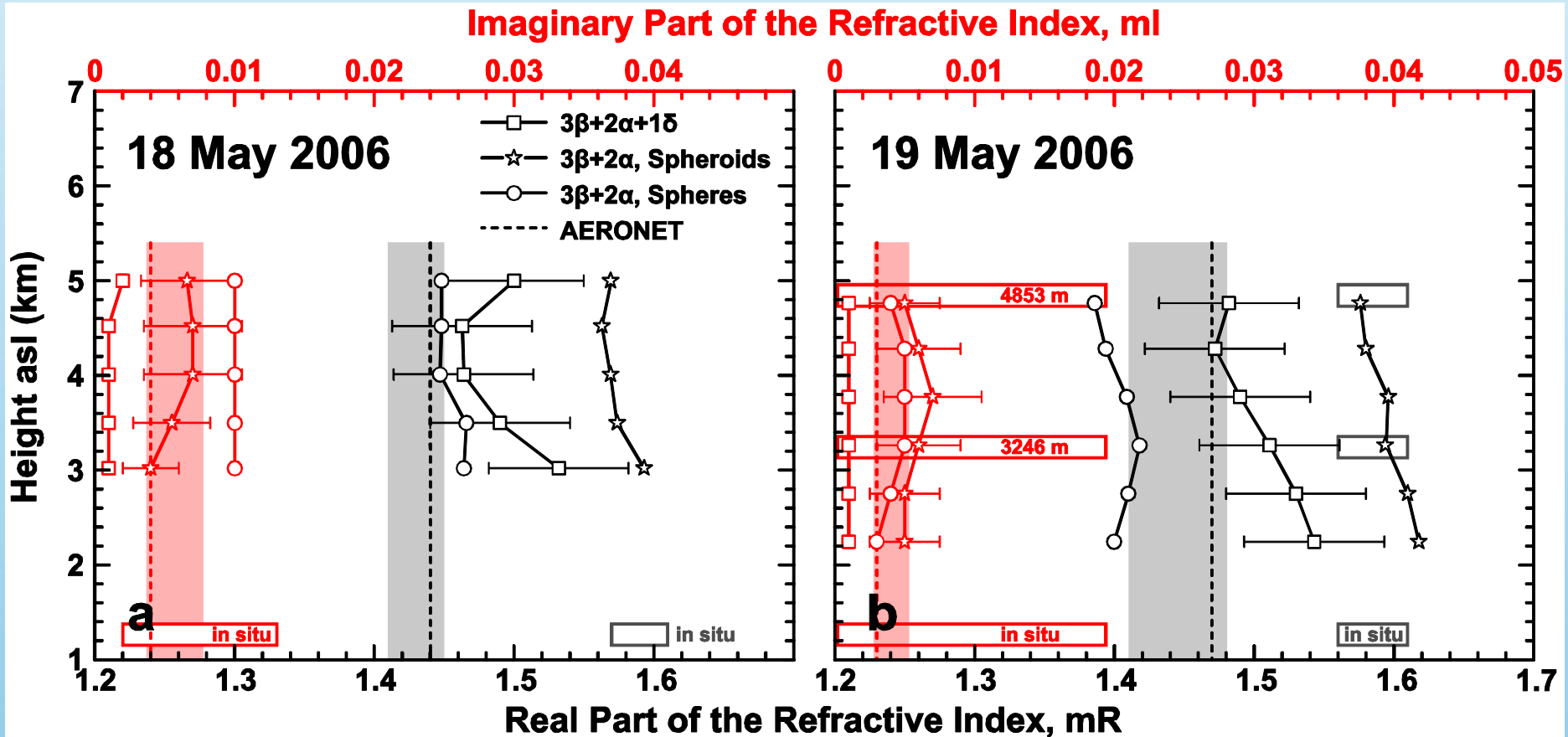
Optical data are provided by M. Tesche et al.



1. Results obtained with and without depolarization are consistent.
2. AERONET provides lower values of effective radius.
3. Adding depolarization shifts PSD toward small radii
4. Lidar retrievals don't reveal the fine mode
5. AERONET provides lower values of the real part of refractive index.

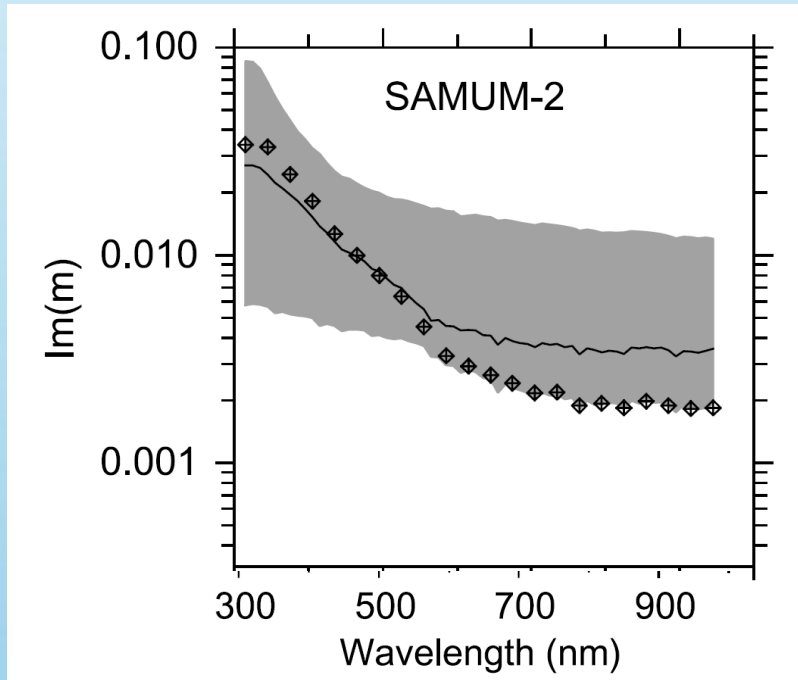
# Retrieval of refractive index (May 19, 2006)

Optical data are provided by M. Tesche et al.



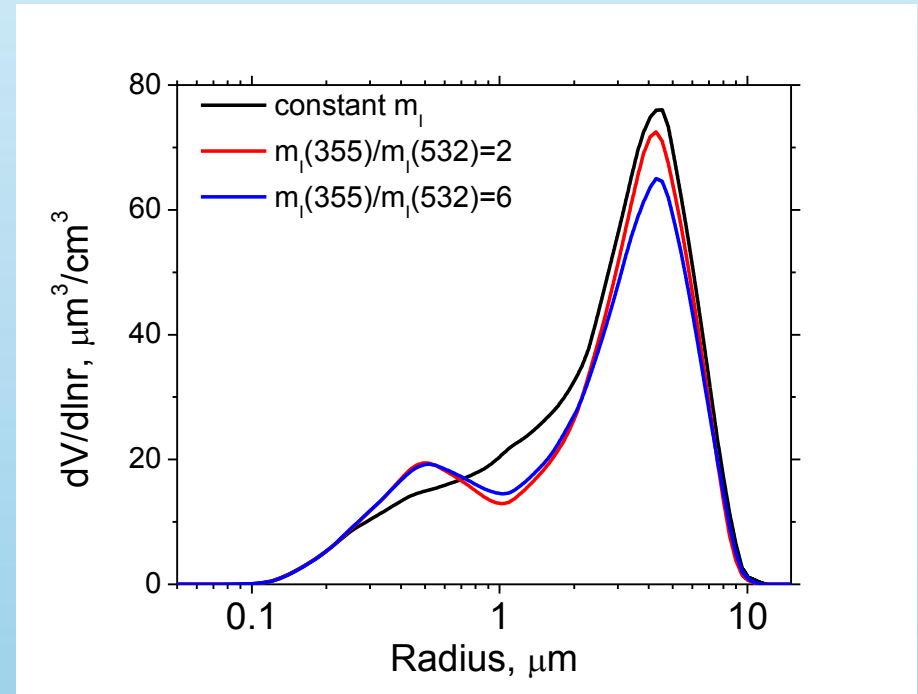
# One of the issues is spectral dependence of particle refractive index

Spectral dependence of imaginary part of dust during SAMUM



From Ansmann et al. 2011

Correction of  $\text{Im}$  spectral dependence in retrieval

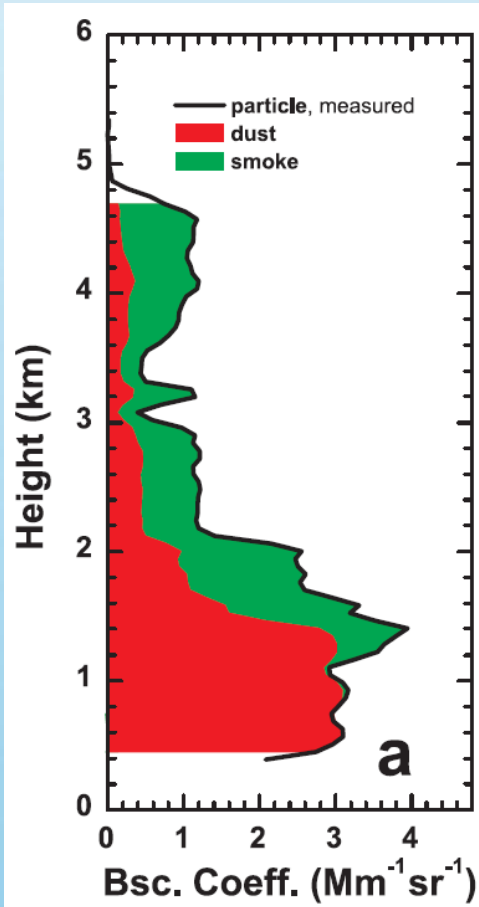


Optical data are provided by M. Tesche et al. Details are given Veselovskii et al. JGR, 2010

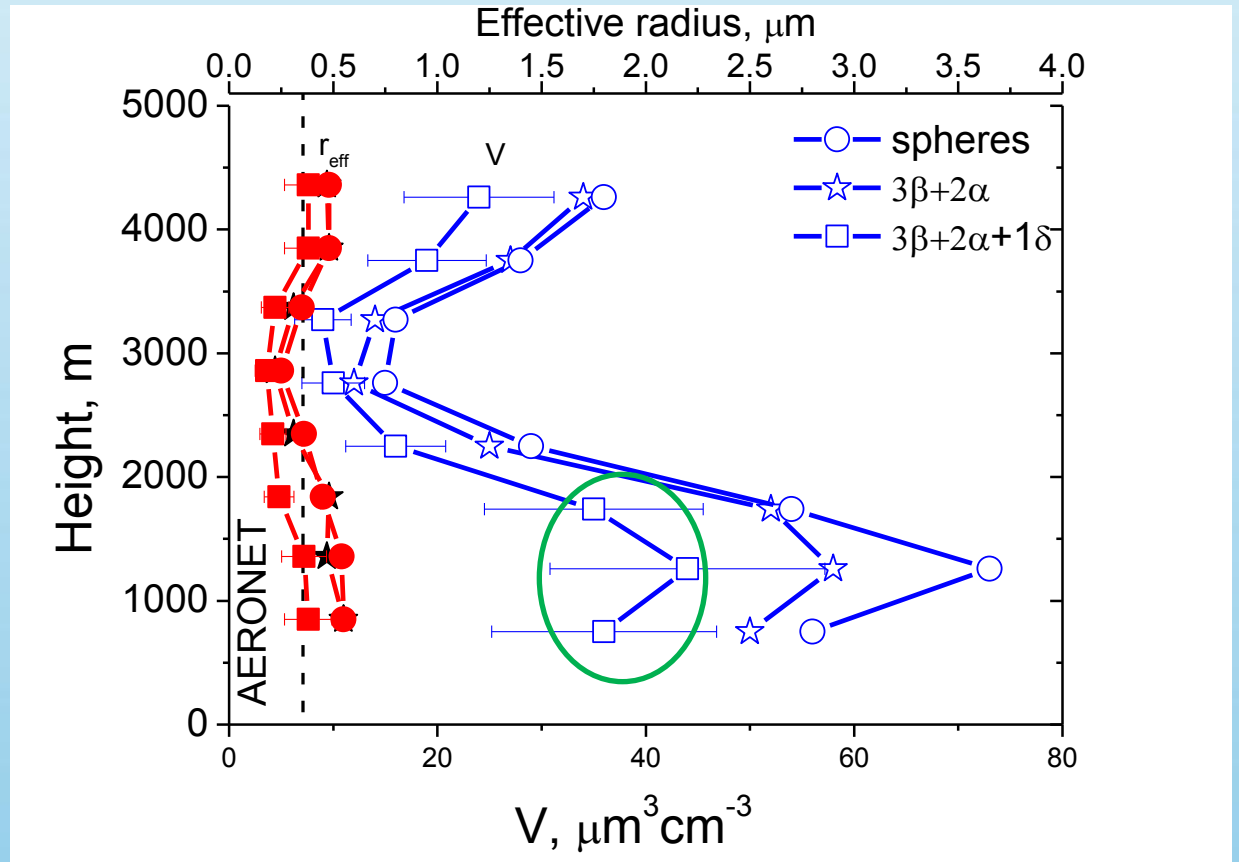
# Mixture of dust and smoke

SAMUM 2 (31 Jan 2008)

Tesche et al. JGR 2009

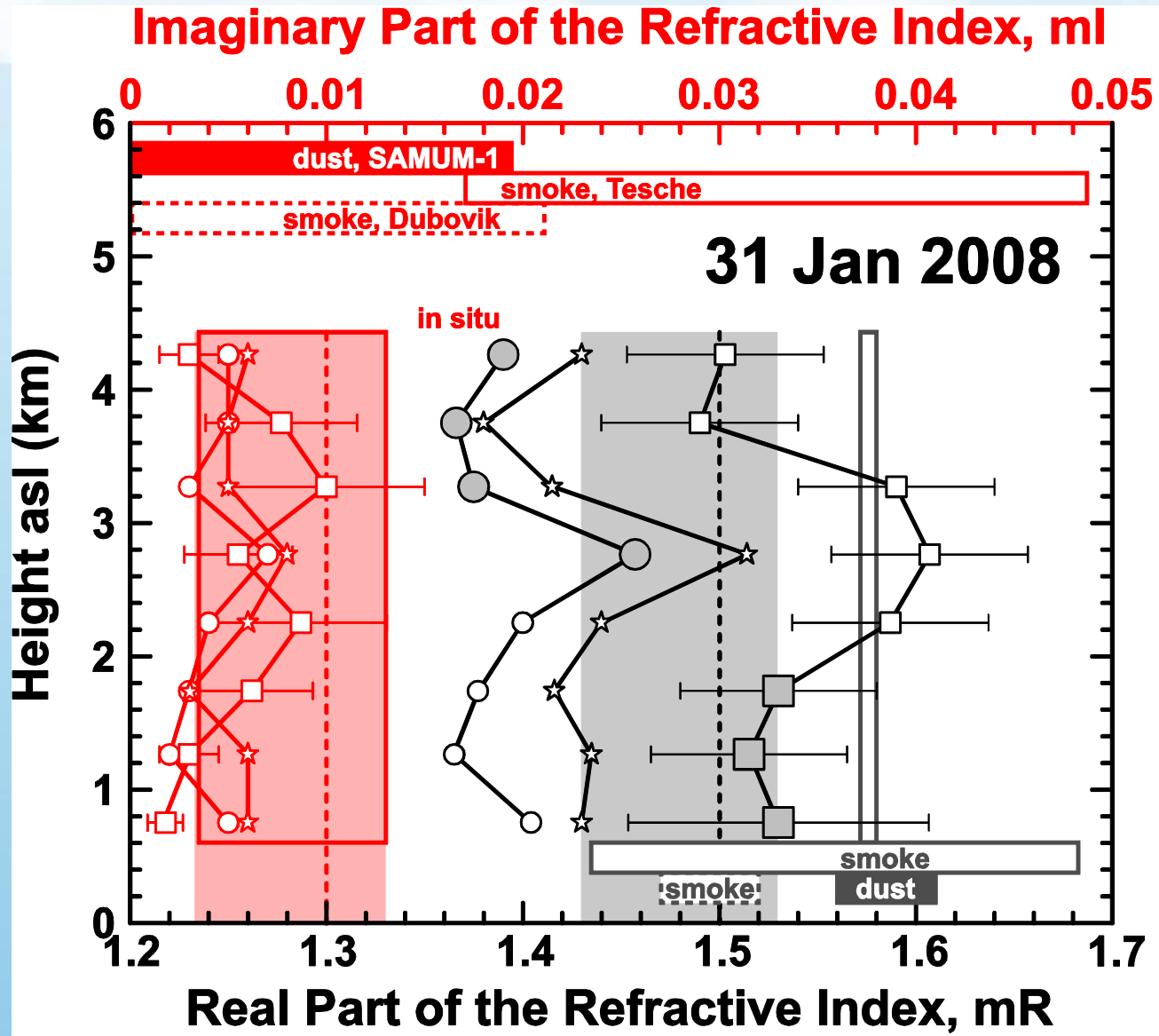


Optical data of Tesche et al. are used



Optical data of Tesche et al. are used

# Refractive index retrieval



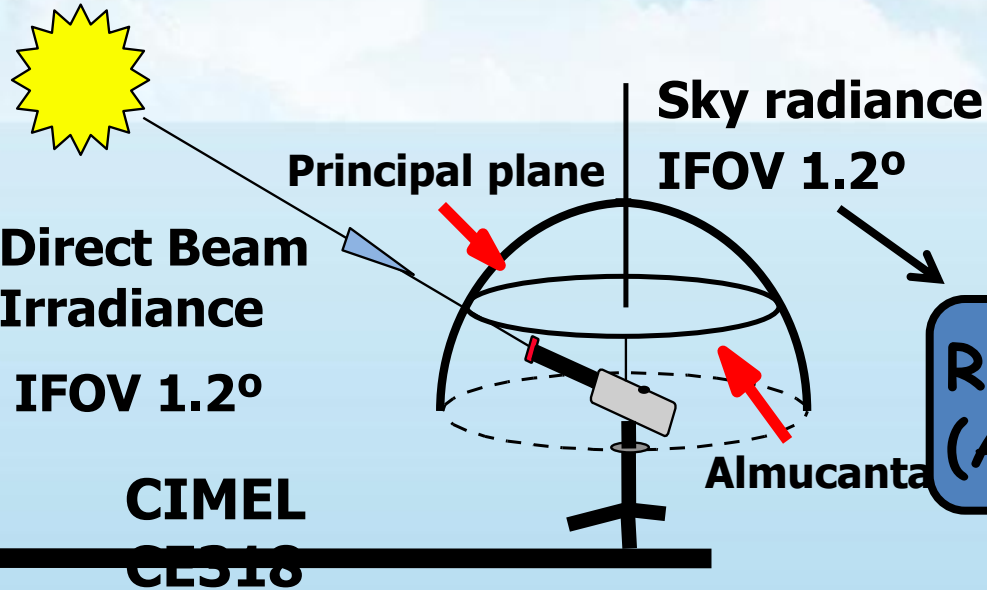
# Conclusion

## How many wavelengths do we need?

<b><math>1\lambda</math> + AERONET</b>	<b>Particle concentration</b>
<b><math>2\lambda</math> + AERONET</b>	<b>Profiles of effective radius and concentration (LIRIC)</b>
<b><math>3\lambda</math></b>	<b>For known refractive index – particle radii and concentration</b>
<b><math>3+1</math></b>	<b>For many cases – radii, concentration, RI</b>
<b><math>3+2</math></b>	<b>Particle size distribution, RI</b>
<b><math>3+2+1\delta</math></b>	<b>Treatment of dust mixtures</b>
<b><math>3+2+3\delta</math></b>	<b>Aerosol classification</b>



# AERONET CIMEL SUN-PHOTOMETER



Retrieves aerosol optical depth (AOD) and sky radiances

Require symmetry and no clouds in the sky

Limited to large scattering angles (morning and afternoon)

Large amounts of measurements with other instruments that acquire only spectral AOD

## Inversion scheme retrieves:

Size distribution ( $v(r)$ ), Effective radius ( $r_{\text{eff}}$ ) and  $V, S, N$

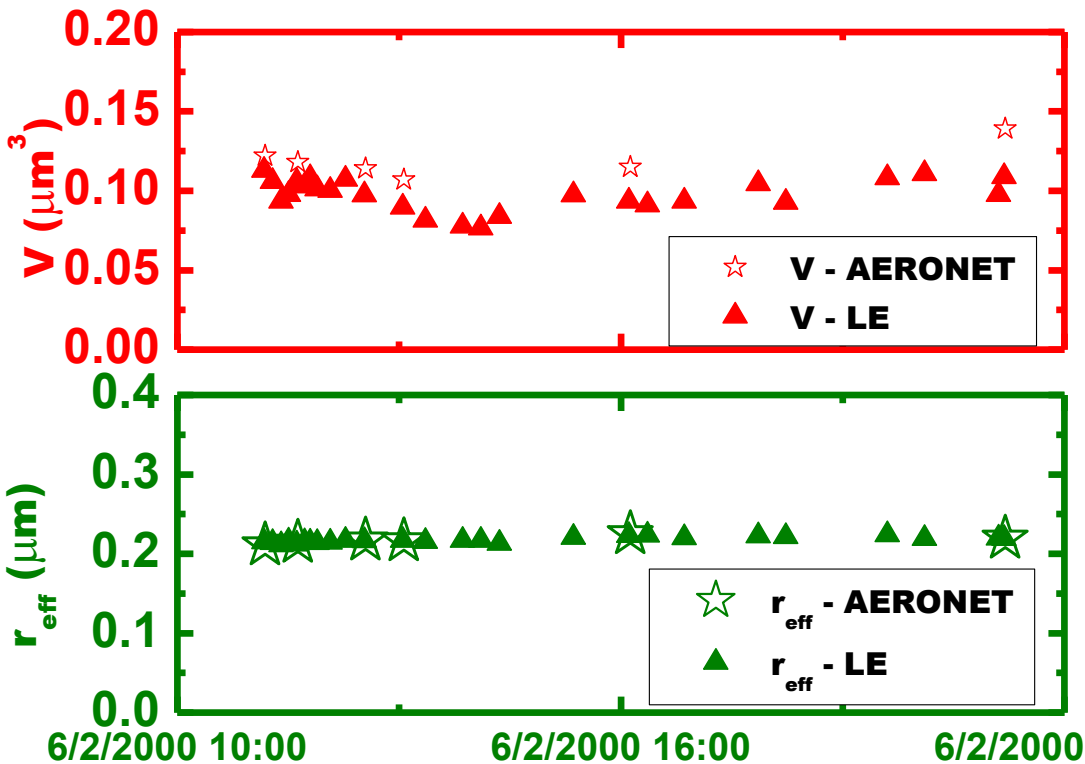
Is able to separate absorption from scattering:

Aerosol refractive index ( $m = m_r + im_i$ ) phase function  $P(\Theta)$ , asymmetry factor ( $g$ ) and albedo ( $\omega_0$ )

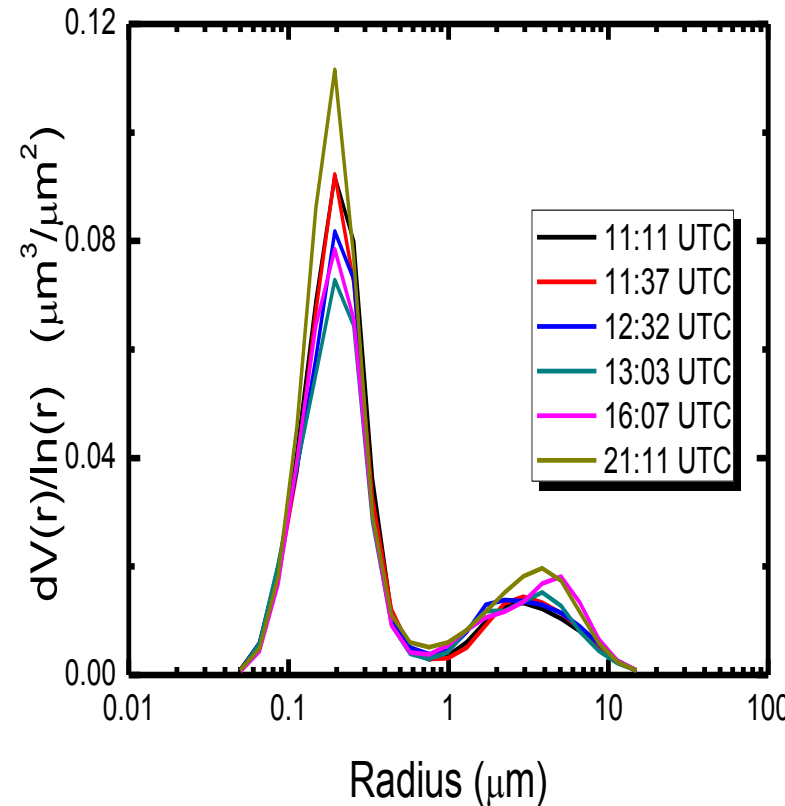
# LINEAR ESTIMATION (LE)

Application to AERONET AOD( $\lambda$ ) measurements: Example

Good agreement between both methodologies for fine mode predominance



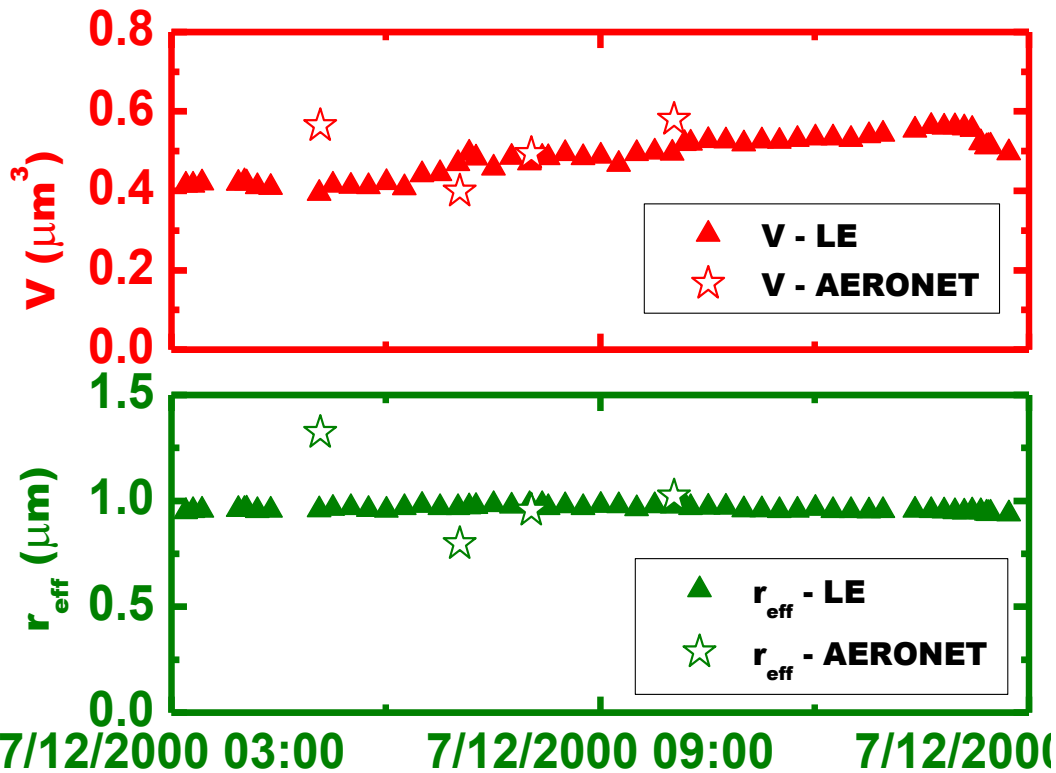
## AERONET size distributions



# LINEAR ESTIMATION (LE)

Application to AERONET AOD( $\lambda$ ) measurements: Example

**Relatively good agreement: Better temporal resolution using LE**



## AERONET size distributions

