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Course on "Inverse Methods in Atmospheric Science"
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"Remote Sounding of the Atmosphere by the Occultation Radiometer
ORA: Inverse Methods and Results"

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Please note: These are preliminary notes intended for internal distribution only.



*Remote sounding of the atmosphere by the
Occultation Radiometer ORA:
inverse methods and results*

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WANT MORE
INFORMATION ?
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Presentation

The ORA experiment:

EURECA, the occultation technique,
experimental description, the mission

Interaction light - atmosphere

The Sun, extinction = absorption + scattering, refraction

Data processing:

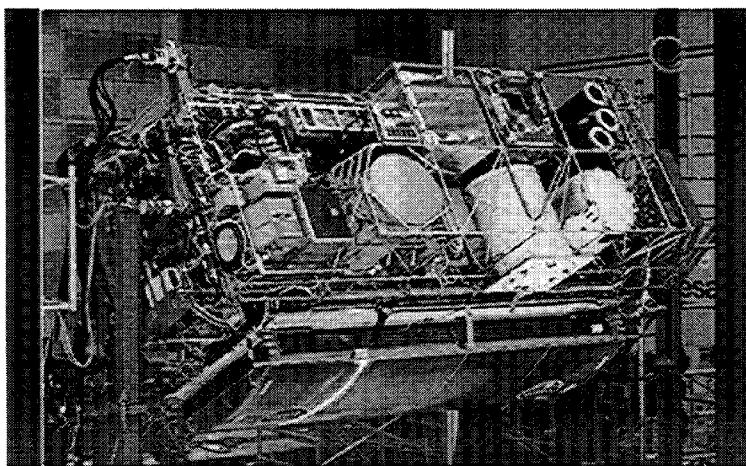
spatial, spectral and radial inversion

ORA: the goal

The ***Occultation Radiometer*** (ORA)
measures from an orbit around Earth:

O₃, NO₂, H₂O: concentration profiles (stratosphere)
Aerosols: particle size distribution parameters (stratosphere)
O₃ concentration profiles (mesosphere)

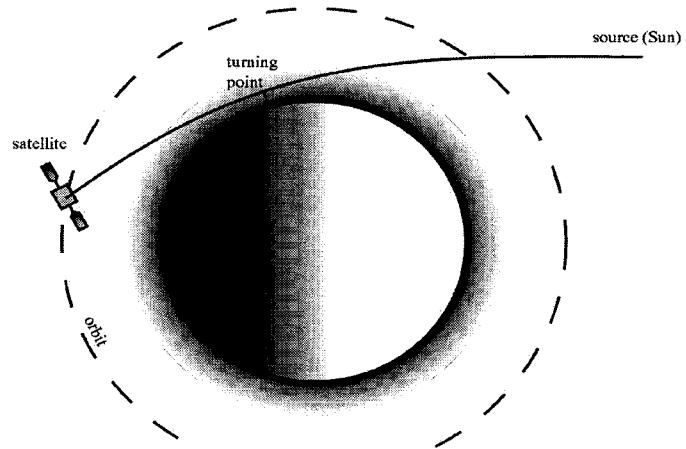
The satellite: EURECA (European Retrievable Carrier)



- ESA - platform
- Re-launchable
- Priority: μ -gravity

ORA

The occultation technique

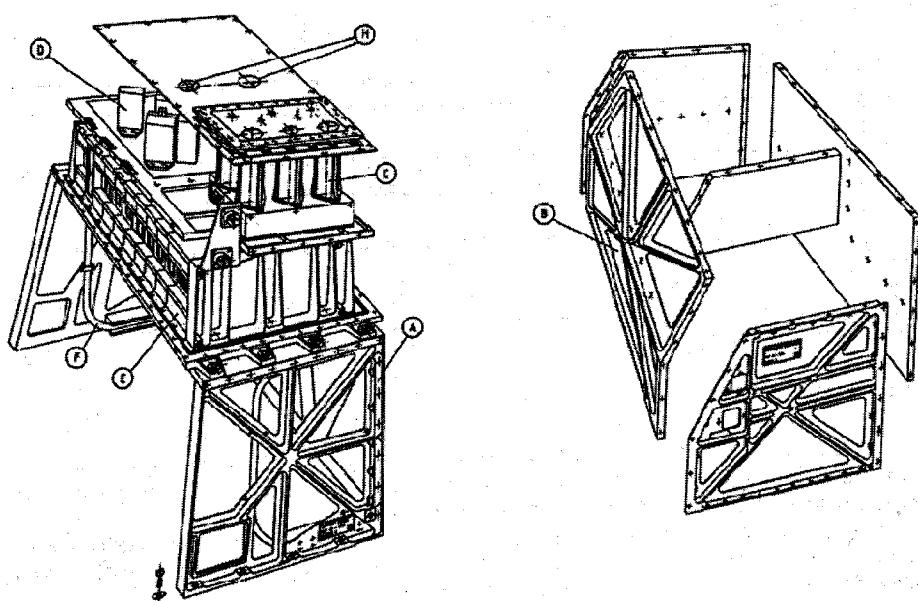


Advantages:

- Long optical trajectories
- Large S/N (views Sun)
- Self-calibrating!
- Good altitude resolution

ORA

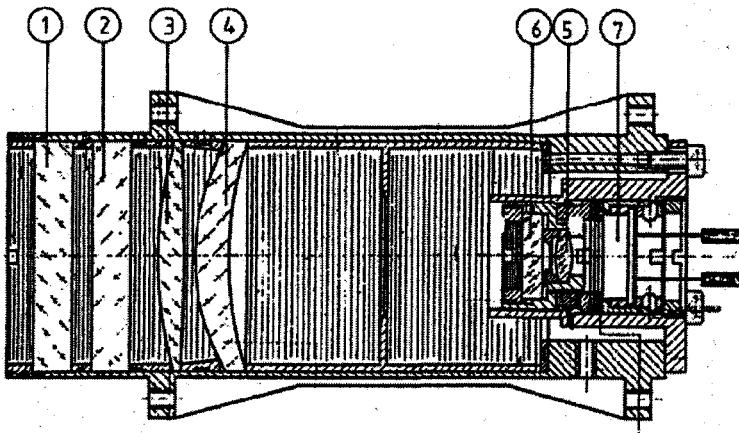
mechanical structure



ORA

8 detection channels

Spectral range: UV, visible, near infrared
259, 340, 385, 435, 442, 600, 943, 1013 nm

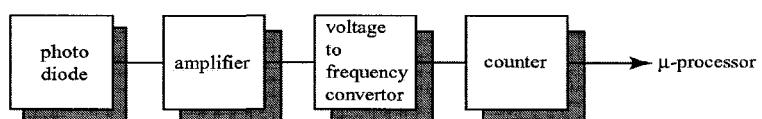


1. Window
2. Filter
- 3,4,5. Lenses
6. Filter
7. Photo diode

FOV: $\pm 2^\circ$

full solar disk at once!

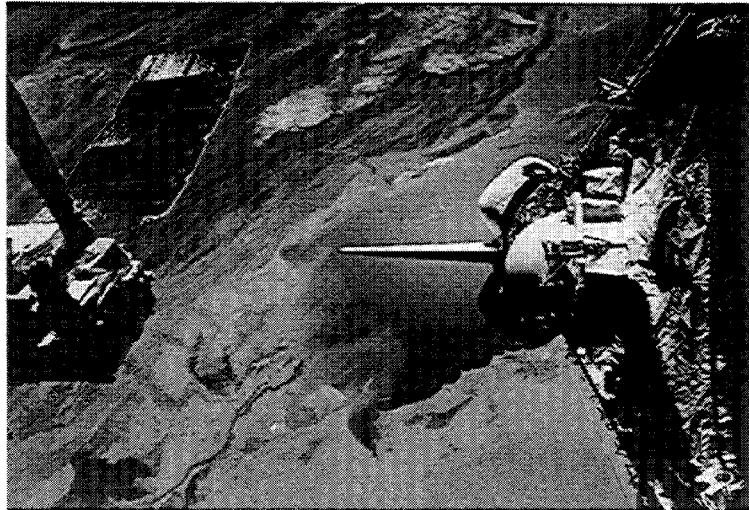
ORA electronics



Dynamic range: 16 bit = 65536 counts

The mission

August 1992 - May 1993



Launch: 31 juli 1992, Kennedy
Space Center,
Space Shuttle Atlantis

During mission: ~ 7000
occultations (sunset and
sunrise)

End of mission: July 1, 1993

The mission

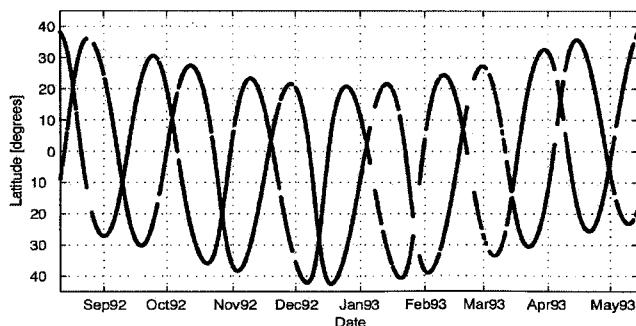
some specifications

Orbit:

- circular
- altitude: 508 km
- inclination: 28°

Satellite:

- velocity: 7.6 km/s
- orbital period: 95 minuten
- 30 occultations per day



Occultation-latitudes:
40°S - 40°N

Interaction light - atmosphere

Light source: the Sun

Extinction = absorption + scattering

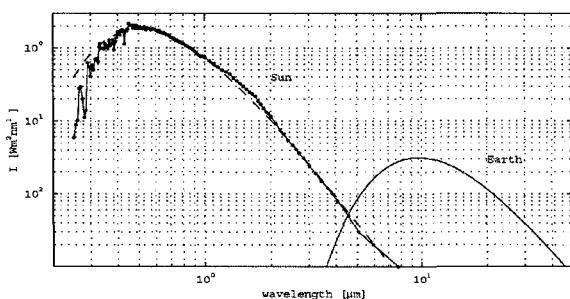
Refraction

Why?

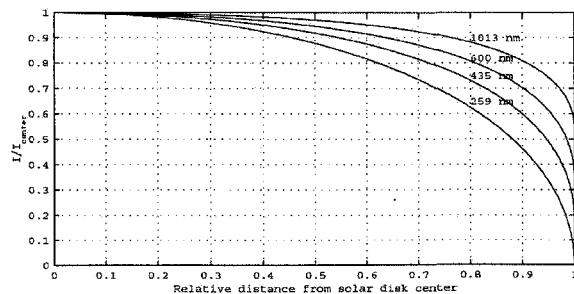
Measurement = f (unknowns)

What happens in f ?

Light source: the Sun

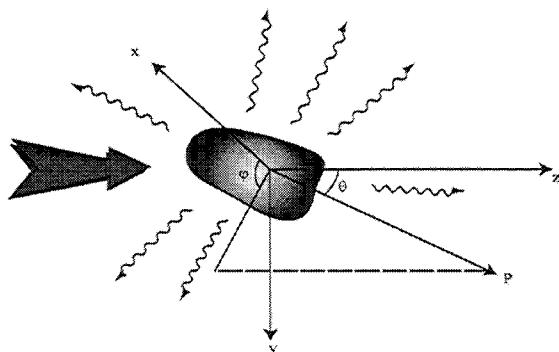


Maximum of the
solar spectrum:
the visible domain



Solar limb darkening:
darkening towards the
edge of the Sun

Extinction



Molecules:

- C_{abs} : from laboratory measurements
- C_{sca} : Rayleigh law ($\sim \lambda^{-4}$)

Aerosols (spherical):

- C_{ext} : Mie theory

Cross section

$$C_{\text{ext}} = C_{\text{abs}} + C_{\text{sca}}$$

Extinction

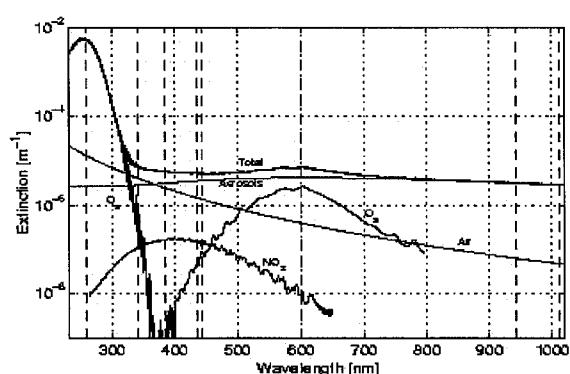
$$\beta_{\text{ext}} = NC_{\text{ext}}$$

Transmittance of light:

$$\tau = \exp\left(-\int_{x_1}^{x_2} \beta_{\text{ext}}(x) dx\right)$$

Extinction

The choice of channels



259 nm: mesospheric O₃

340, 385 nm: neutral density

435,442 nm: NO₂

600 nm: O₃

943 nm: H₂O

1013 nm: aerosols

Refraction

Effects:

- bending of light rays
- Flattening of the solar disk
- Refractive dilution

Refractive index is determined by P and T of the air

Data processing:
Inversion

Inversion:

3 partial problems

Spatial Inversion

$$\begin{array}{lcl} \tau_{340}(t) & > & \beta_{340}(z) \\ \tau_{385}(t) & > & \beta_{385}(z) \\ \tau_{435}(t) & > & \beta_{435}(z) \\ \tau_{442}(t) & > & \beta_{442}(z) \\ \tau_{600}(t) & > & \beta_{600}(z) \\ \tau_{1013}(t) & > & \beta_{1013}(z) \end{array}$$

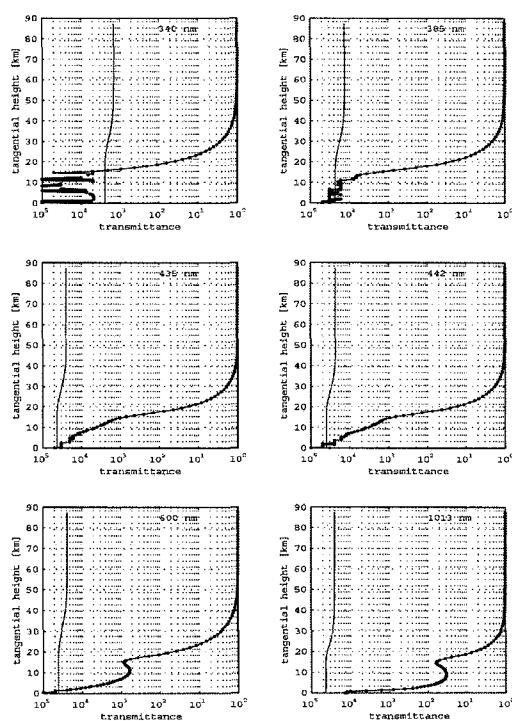
Spectral Inversion

$$\begin{array}{lcc} \beta_{340}(z) & & N_{O_3}(z) \\ \beta_{385}(z) & & N_{NO_2}(z) \\ \beta_{435}(z) & > & N_{air}(z) \\ \beta_{442}(z) & & \\ \beta_{600}(z) & & \\ \beta_{1013}(z) & & \end{array}$$

Radial Inversion

$$\beta_{340, \text{aero}}(z) > dN(r)/dr(z)$$

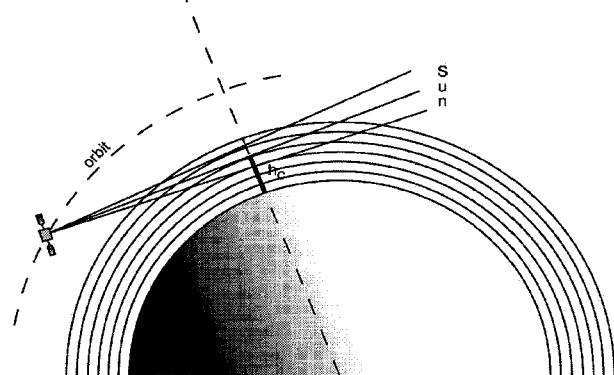
$$\begin{array}{l} \beta_{385, \text{aero}}(z) \\ \beta_{435, \text{aero}}(z) \\ \beta_{442, \text{aero}}(z) \\ \beta_{600, \text{aero}}(z) \\ \beta_{1013, \text{aero}}(z) \end{array}$$



Measurements: transmittance

Mount Pinatubo
volcanic aerosols
clearly cause a
visual effect

Spatial inversion: exact formulation of transmittance



$$\tau = \frac{\iint_{\Omega} I_0(\lambda, \Omega) F_N(\lambda) \exp\left(-\int_{s_{\lambda\Omega}} \beta_{\text{ext}}^{\text{tot}}(\lambda, s_{\lambda\Omega}) ds_{\lambda\Omega}\right) d\lambda d\Omega}{\tilde{I}_{\text{disk}} \int_{\Omega} d\Omega}$$

Spatial inversion: approximations

- Refraction is independent of wavelength
- Solar limb darkening is independent of wavelength
- Discretization of solar disk in 20 discrete layers
- Expression of relation with respect to λ_c

$$\tau = \sum_{i=0}^{19} r_i g_i \exp\left(-\int_{s_i} \beta_{\text{ext}}^{\text{tot}}(\lambda_c, s_i) ds_i\right)$$

Spatial inversion: limited information content

Reason: wide overlap of subsequent measurements
during an occultation

Consequence: solution is very unstable!

Two fundamental remedies:

- Reduction of number of unknown parameters
- Introduction of a priori (external) information

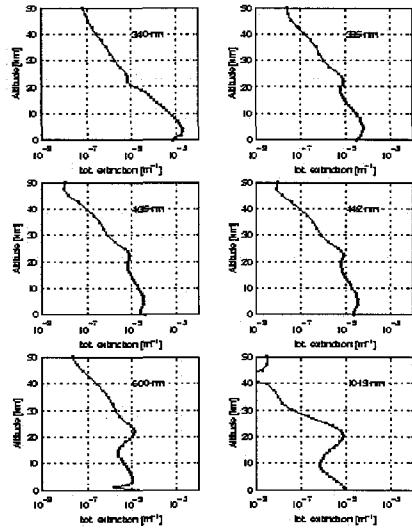
Spatial inversion: NOPE (Natural Orthogonal Polynomial Expansion)

$$\beta_{\text{ext}}^{\text{tot}}(z) = \tilde{\beta}_{\text{ext}}^{\text{tot}}(z) \sum_{i=0}^n \alpha_i P_i(z)$$

Then: nonlinear least-squares procedure
(minimization of the *Merit function*)

$$M = \langle \tau - \tau_{\text{Model}} | S_t^{-1} | \tau - \tau_{\text{Model}} \rangle$$

Spatial inversion: results



Altitude profiles
for total extinction
at 6 wavelengths

The Direct Method (DM)

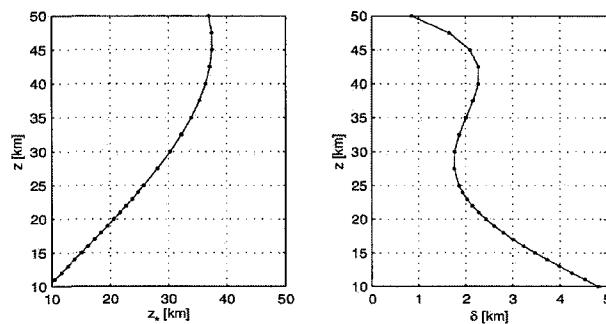
Why?

DM gives extra correction at altitudes where the measured signal contains only a small amount of information ($\tau \sim 0$ or 1)

Method: statistical connection

$$\beta_{\text{ext}}^{\text{tot}}(z) = G_{z,h}(\tau_{\text{NOPE}}(h))$$

Interesting extra result: spatial resolution of ORA ~ 2 km!



Spectral inversion

separation of the different constituents

$$\begin{bmatrix} C_{340}^{\text{air}} & C_{340}^{O_3} & C_{340}^{\text{NO}_2} & 1 & 0 & 0 & 0 & 0 & 0 \\ C_{385}^{\text{air}} & C_{385}^{O_3} & C_{385}^{\text{NO}_2} & 0 & 1 & 0 & 0 & 0 & 0 \\ C_{435}^{\text{air}} & C_{435}^{O_3} & C_{435}^{\text{NO}_2} & 0 & 0 & 1 & 0 & 0 & 0 \\ C_{442}^{\text{air}} & C_{442}^{O_3} & C_{442}^{\text{NO}_2} & 0 & 0 & 0 & 1 & 0 & 0 \\ C_{600}^{\text{air}} & C_{600}^{O_3} & C_{600}^{\text{NO}_2} & 0 & 0 & 0 & 0 & 1 & 0 \\ C_{1013}^{\text{air}} & C_{1013}^{O_3} & C_{1013}^{\text{NO}_2} & 0 & 0 & 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} N^{\text{air}} \\ N^{O_3} \\ N^{\text{NO}_2} \\ \beta_{340}^{\text{aero}} \\ \beta_{385}^{\text{aero}} \\ \beta_{435}^{\text{aero}} \\ \beta_{442}^{\text{aero}} \\ \beta_{600}^{\text{aero}} \\ \beta_{1013}^{\text{aero}} \end{bmatrix} = \begin{bmatrix} \beta_{340}^{\text{tot}} \\ \beta_{385}^{\text{tot}} \\ \beta_{435}^{\text{tot}} \\ \beta_{442}^{\text{tot}} \\ \beta_{600}^{\text{tot}} \\ \beta_{1013}^{\text{tot}} \end{bmatrix}$$

Pre-assumption: aerosol spectrum = polynomial of 2nd degree

$$\beta_j^{\text{aero}} = c_0 + c_1(\lambda_j - \lambda_{1013}) + c_2(\lambda_j - \lambda_{1013})^2$$

Spectral inversion:

A global approach: altitude smoothing

- At each altitude z_i : $\mathbf{A}_i \mathbf{x}_i = \mathbf{y}_i$

- Stack all matrices in one big matrix

$$\begin{pmatrix} \mathbf{A}_1 & 0 & \cdots & 0 \\ 0 & \mathbf{A}_2 & 0 & 0 \\ \vdots & 0 & \ddots & \vdots \\ 0 & 0 & \cdots & \mathbf{A}_n \end{pmatrix} \begin{pmatrix} \mathbf{x}_1 \\ \mathbf{x}_2 \\ \vdots \\ \mathbf{x}_n \end{pmatrix} = \begin{pmatrix} \mathbf{y}_1 \\ \mathbf{y}_2 \\ \vdots \\ \mathbf{y}_n \end{pmatrix}$$

- Construct ‘a priori’ covariance matrix with off-diagonal elements

$$\sigma^2(z_1, z_2) = \sigma(z_1)\sigma(z_2) \exp\left\{-\left(\frac{z_1 - z_2}{L}\right)^2\right\}$$

Spectral inversion:

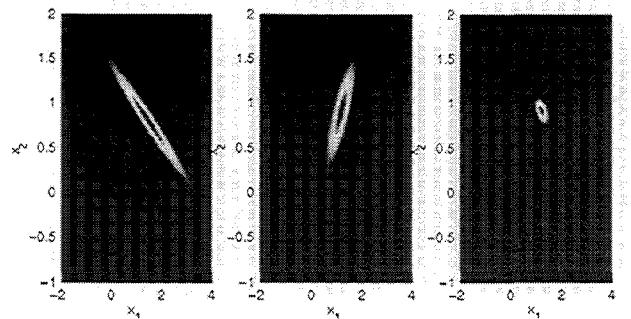
a Bayesian method (1)

- Measurement y and unknown x are characterized by normal distributions
- Inverse problem: $y=Kx$ (linear)
- Using Bayes theorem: the solution x is the one for which:

$$\langle y - Kx | S_y^{-1} | y - Kx \rangle + \langle x - x_a | S_a^{-1} | x - x_a \rangle = \text{minimum}$$

$$\tilde{x} = x_a + (K^T S_y^{-1} K + S_a^{-1})^{-1} K^T S_y^{-1} (y - Kx_a)$$

$$S_x^{-1} = K^T S_y^{-1} K + S_a^{-1}$$



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0 10 20 30 40 50 60 70 80 90 100

0 10 20 30 40 50 60 70 80 90 100

0 10 20 30 40 50 60 70 80 90 100

Spectral inversion:

a Bayesian method (2)

True nature:

$$\begin{pmatrix} 3 \\ 4 \end{pmatrix} = \begin{pmatrix} 1 & 2 \\ 1 & 3 \end{pmatrix} \cdot \begin{pmatrix} x_1 \\ x_2 \end{pmatrix} \quad x = \begin{pmatrix} 1 \\ 1 \end{pmatrix}$$

Measurement:

$$y = \begin{pmatrix} 3.1 \\ 3.9 \end{pmatrix} \quad S_y = \begin{pmatrix} 0.04 & 0 \\ 0 & 0.09 \end{pmatrix} \quad x = \begin{pmatrix} 1.5 \\ 0.8 \end{pmatrix}$$

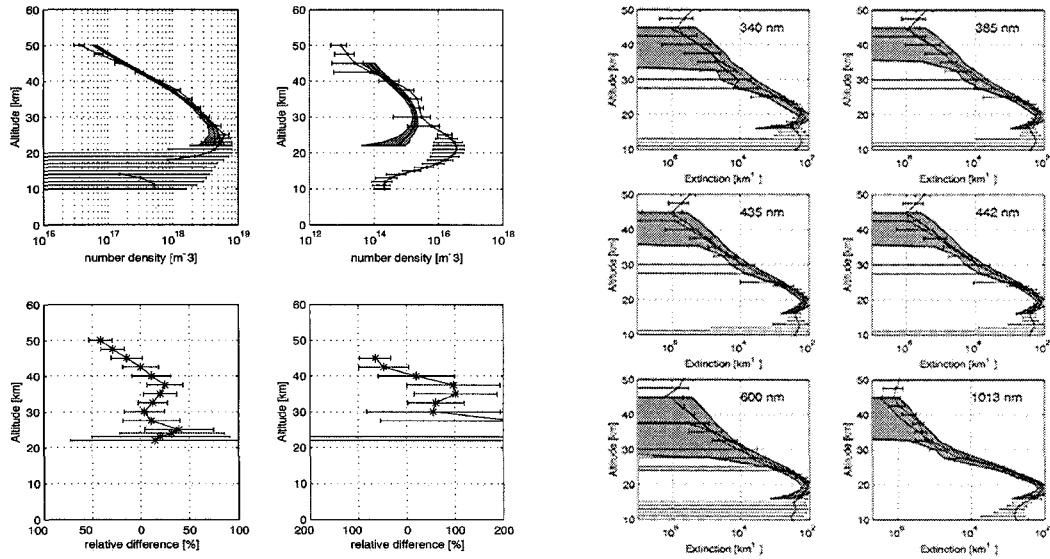
A priori:

$$x_a = \begin{pmatrix} 1.2 \\ 0.9 \end{pmatrix} \quad S_a = \begin{pmatrix} 0.09 & 0.072 \\ 0.072 & 0.09 \end{pmatrix}$$

Solution:

$$\tilde{x} = \begin{pmatrix} 1.22 \\ 0.92 \end{pmatrix} \quad \tilde{S}_x = \begin{pmatrix} 0.0192 & -0.0049 \\ -0.0049 & 0.0056 \end{pmatrix}$$

Spectral inversion: Results + comparison with SAGE II



Aerosols

Radial inversion + some results

Radial inversion: formalism + assumptions

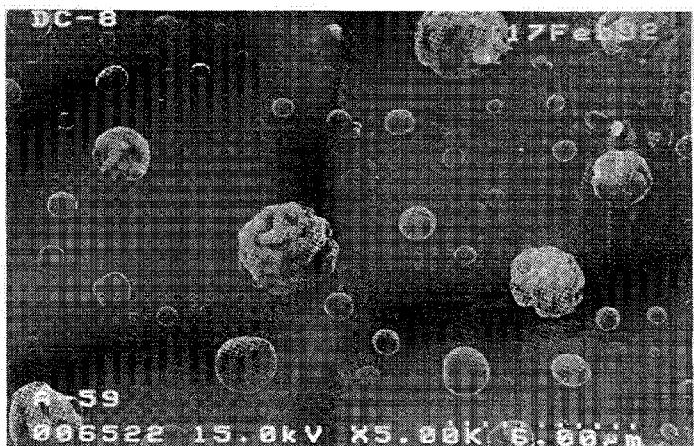


Figure 3. Plane view of stratospheric $\text{H}_2\text{SO}_4\text{-H}_2\text{O}$ droplets and sulfuric-acid-coated volcanic ash particles collected on February 17, 1992, near (33°N ; 67°W) at 10.7 km msl.

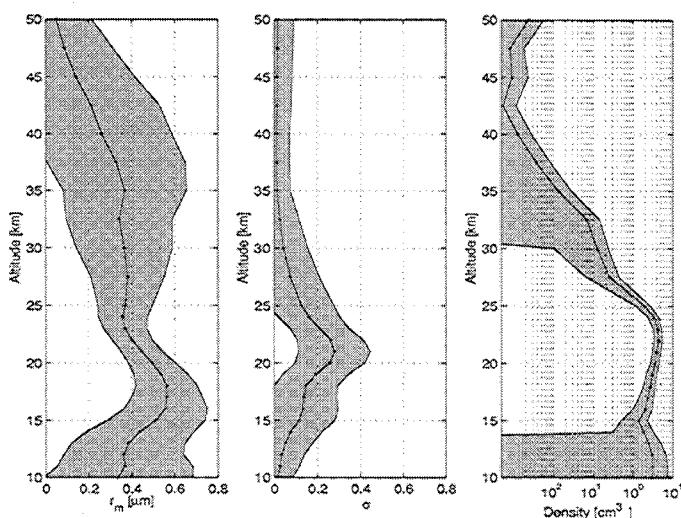
Inverse problem:

$$\beta_{\text{ext}}^{\text{aero}}(\lambda) = \int_0^{\infty} C_{\text{ext}}(\lambda, r) \frac{dN(r)}{dr} dr$$

Assumptions:

- $\text{H}_2\text{SO}_4\text{-H}_2\text{O}$ (65-80 %)
- $n = 1.43 + i 0.0$ (no absorption)
- $C_{\text{ext}}(\lambda, r)$: Mie theory
- Particle size distribution:
lognormal function
3 parameters: N , r_m en σ

Radial inversion: resulting profiles

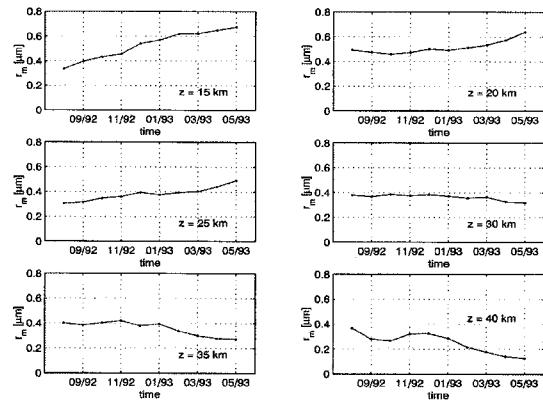
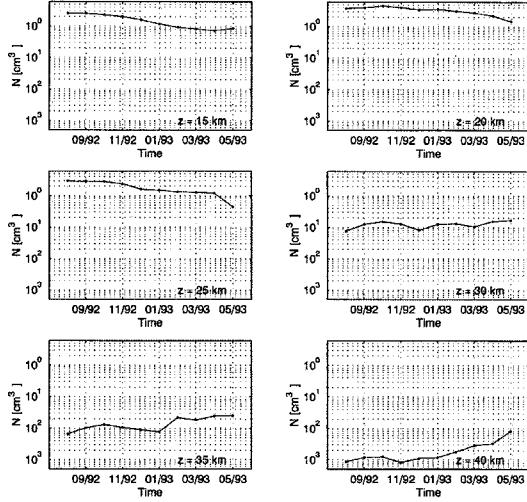


Typical values in the lower stratospheric layers (~23 km):

$$\begin{aligned} N &= 4 \text{ particles cm}^{-3} \\ r_m &= 0.5 \mu\text{m} \\ \sigma &= 0.2 \end{aligned}$$

Aerosols

Evolution in time (1)



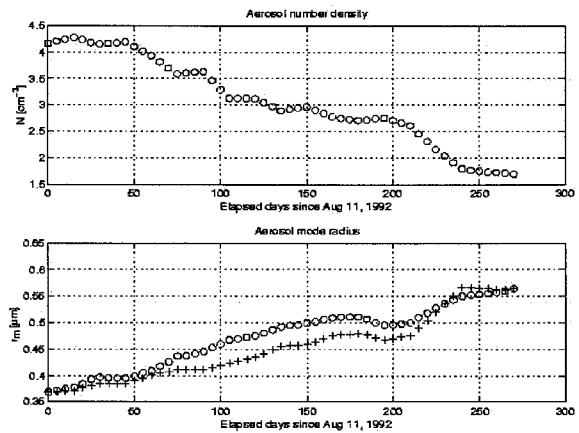
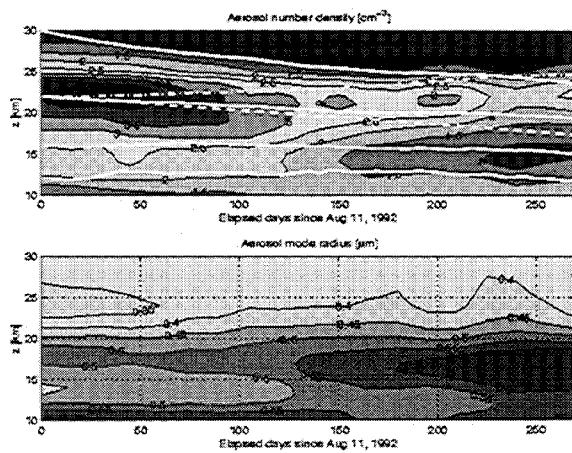
$z < 30 \text{ km}$: N decreases,
 r_m increases

$z > 30 \text{ km}$: N increases,
 r_m decreases

Aerosols:

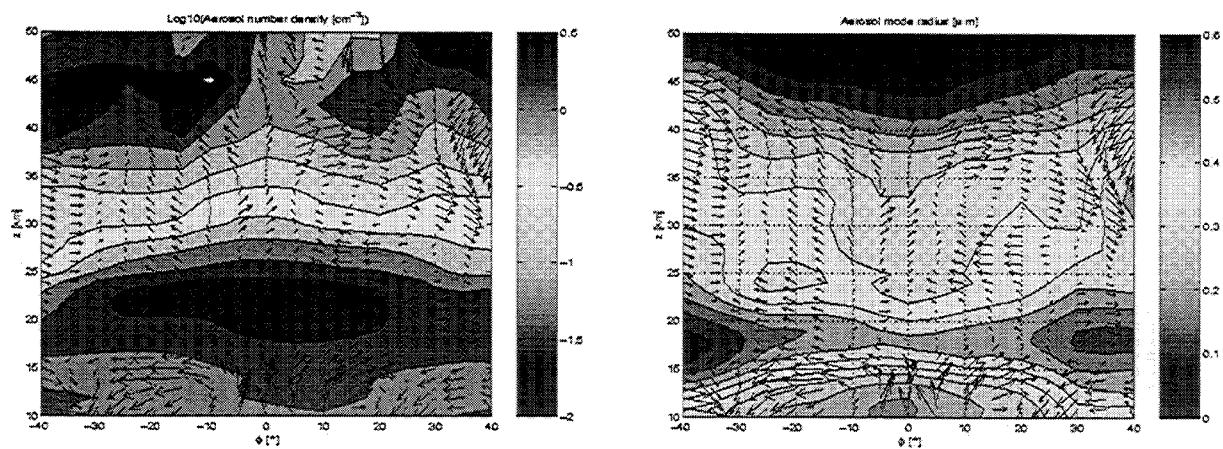
Evolution in time (2)

During coagulation, the total aerosol volume has to be constant



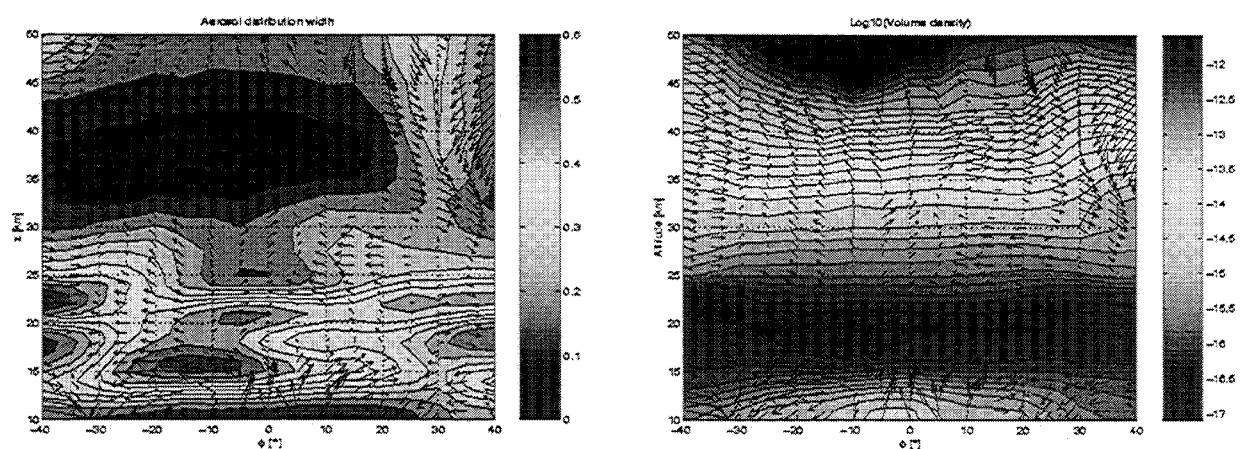
Aerosols:

Variation in latitude (1)



Aerosols

Variation in latitude (2)



Conclusion

- Although a low-cost instrument with a wide FOV implies complex inverse methods, satisfactory results can be obtained.
- The used inverse methods (NOPE, Bayesian method) have been proven to be effective