



## Ozone data assimilation and forecasts

Application of the sub-optimal Kalman filter to ozone assimilation

*Henk Eskes,  
Royal Netherlands Meteorological Institute,  
De Bilt, the Netherlands*



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## Ozone assimilation in numerical weather prediction

### Benefits for atmospheric chemistry science community:

- Multi-year data base of 4D ozone fields,
- consistent with the available (satellite) observations,
  - consistent with the dynamical state of the atmosphere

### Science questions:

- Recovery ozone layer
- Chemistry - climate interaction

### ECMWF ERA-40:

satellite observations 1978-present, TOMS, SBUV



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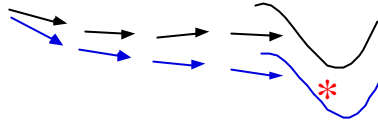
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### Impact of ozone on NWP

Benefits of accurate ozone observations to numerical weather prediction

- Radiation: ozone has strong influence on temperature (and wind)
- Satellite retrieval: TOVS
- Assimilated ozone observations lead to wind increments
- UV forecast



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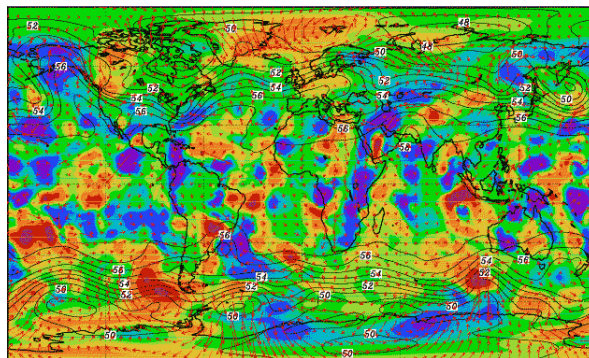
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### Impact of ozone on NWP

Wind increments due to TOVS ozone observations

ECMWF model  
(SODA project)



Wind increments ~ 0.5 m/s

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### Assimilation of ozone at NWP centres

The major weather centres have programmes on ozone data assimilation (extension of the models into the stratosphere/mesosphere)

- ECMWF
  - ERA-40 (TOMS, SBUV)
  - Operational (GOME, SBUV)
- NOAA/NCEP (SBUV)
- DAO (TOMS, SBUV)
- Meteo France (TOVS)
- UKMO, Univ.Reading (GOME, MLS)

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### GOME ozone assimilation: motivation

- Extend the use of GOME data (level-4 products)
  - 4D ozone data base
  - global synoptic maps every 6 hours
- Feedback on error statistics
  - Quality of observations
  - Quality of model
- Participation in satellite validation
- Ozone forecasts
- Case studies, e.g. mini-holes, 2002 ozone hole break-up

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### GOME ozone assimilation

Chemistry-transport assimilation model TM3DAM:

- GOME data: KNMI NRT ozone columns
- 2.5 degree resolution, 44 layers
- ECMWF meteo (60 layer)
- Prather second moment advection
- Parameterised stratospheric chemistry
  - Gas-phase
  - Heterogeneous
- Detailed forecast error modelling

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### Stratospheric chemistry parametrization

#### Gas-phase chemistry

Cariolle, Déqué, JGR 91, 10825, 1986

$$\frac{d\chi}{dt} = \langle S \rangle + \left\langle \frac{\partial S}{\partial \chi} \right\rangle (\chi - \langle \chi \rangle) + \left\langle \frac{\partial S}{\partial T} \right\rangle (T - \langle T \rangle) + \left\langle \frac{\partial S}{\partial \Phi} \right\rangle (\Phi - \langle \Phi \rangle)$$

- $\chi$  ozone concentration  
 $S$  sources - sinks  
 $\Phi$  ozone column above point

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### Stratospheric chemistry parametrization

#### Heterogeneous chemistry

(Peter Braesicke, CAS, Cambridge Univ.)

$$\frac{d\chi}{dt} = -\frac{1}{\tau}A\chi$$

$$\frac{dA}{dt} = \frac{1}{\tau_p}(1-A) - \frac{1}{\tau_l}A$$

- $\chi$  ozone concentration  
 $A$  activation tracer field (cold tracer)  
 $\tau$  ozone depletion time scale  
 $\tau_p$  activation time scale  
 $\tau_l$  cold tracer life time

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### Forecast error modelling

Sub-optimal Kalman filter approach:

Forecast covariance = time-dependent variance \* fixed correlations

#### Correlation matrix:


- function of the distance only
- functional form determined from OmF statistics

#### Variance:

- Model error, growth of the forecast variance with time
- Advection of the forecast variance
- Analysis equation for forecast variance

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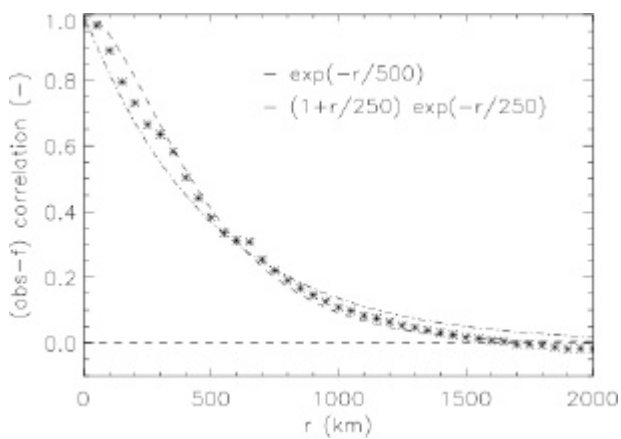
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**Correlations**

Distance dependence described by 2nd order autoregressive function



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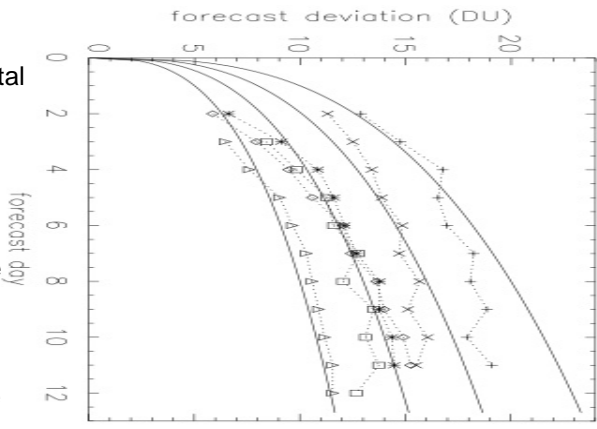
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**Model error**

One-coefficient fit function to the observed ozone total column OmF as a function of the forecast period

Coefficient: Function of latitude and month

Model error: Derivative of curve



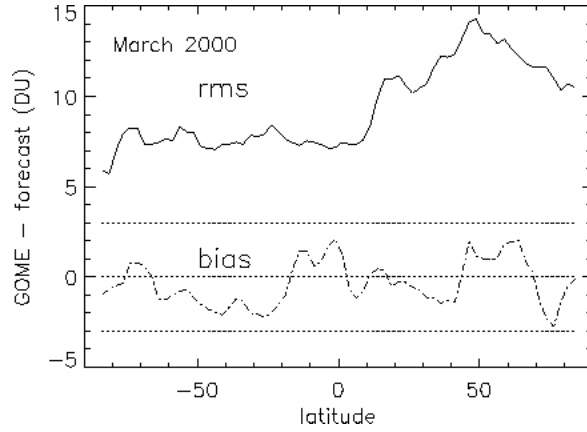
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Observation minus forecast statistics



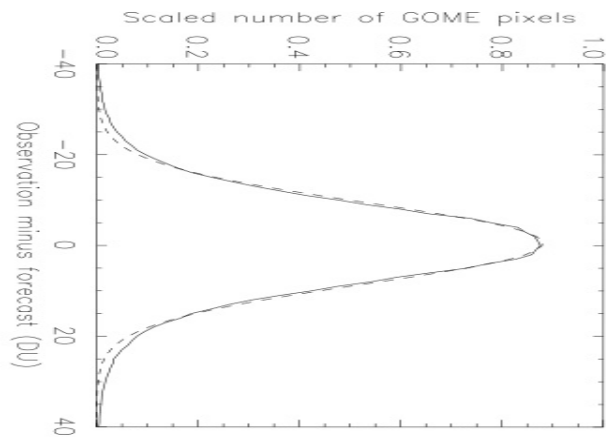
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Gaussian statistics



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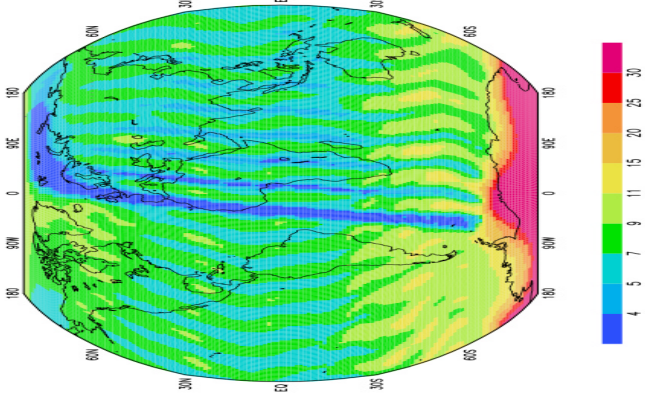
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Forecast error


- Analysis
- Advection
- Model error



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Forecast error verification

$\chi^2$  test (E.g. Menard, 2000)

$$\left\langle (\mathbf{y}_i^o - H_i[\mathbf{x}^f(t_i)])^T [\mathbf{H}_i \mathbf{P}^f(t_i) \mathbf{H}_i^T + \mathbf{R}_i]^{-1} (\mathbf{y}_i^o - H_i[\mathbf{x}^f(t_i)]) \right\rangle \approx 1$$

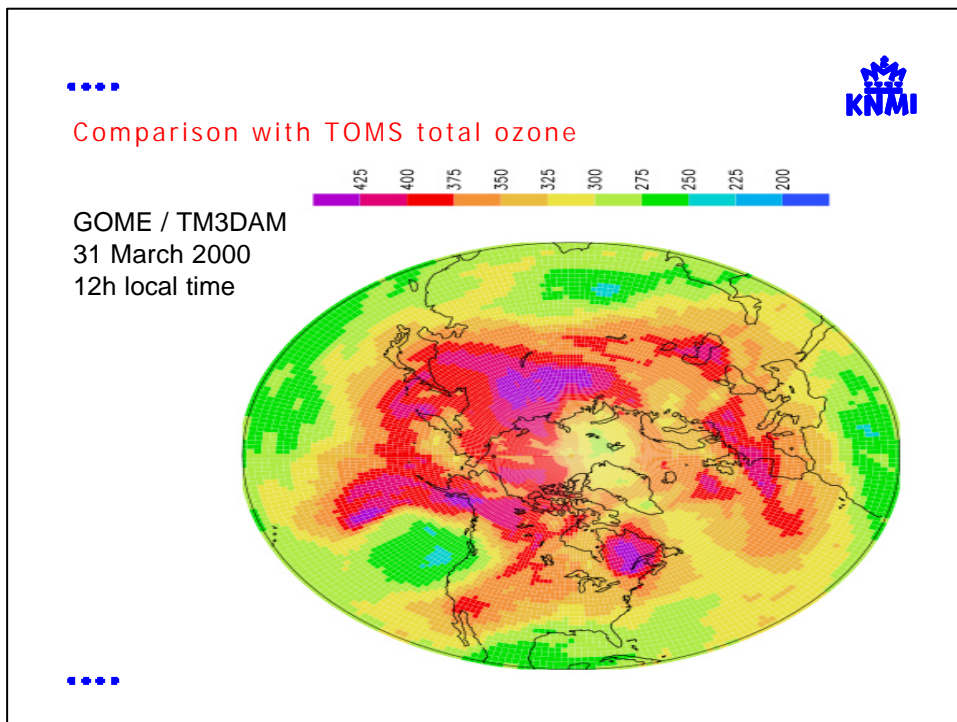
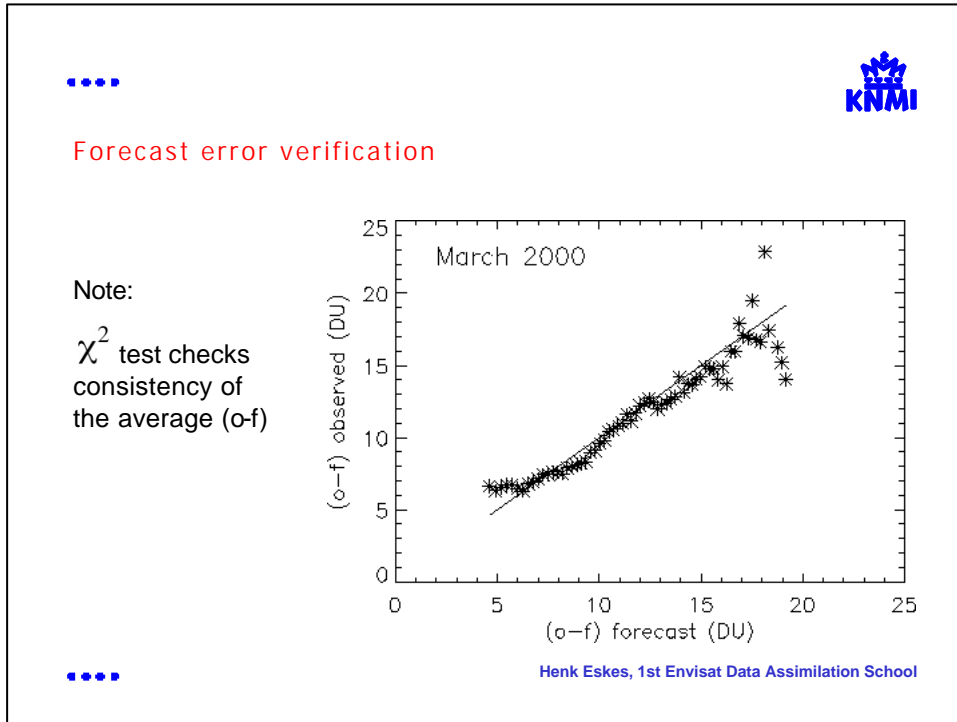
or

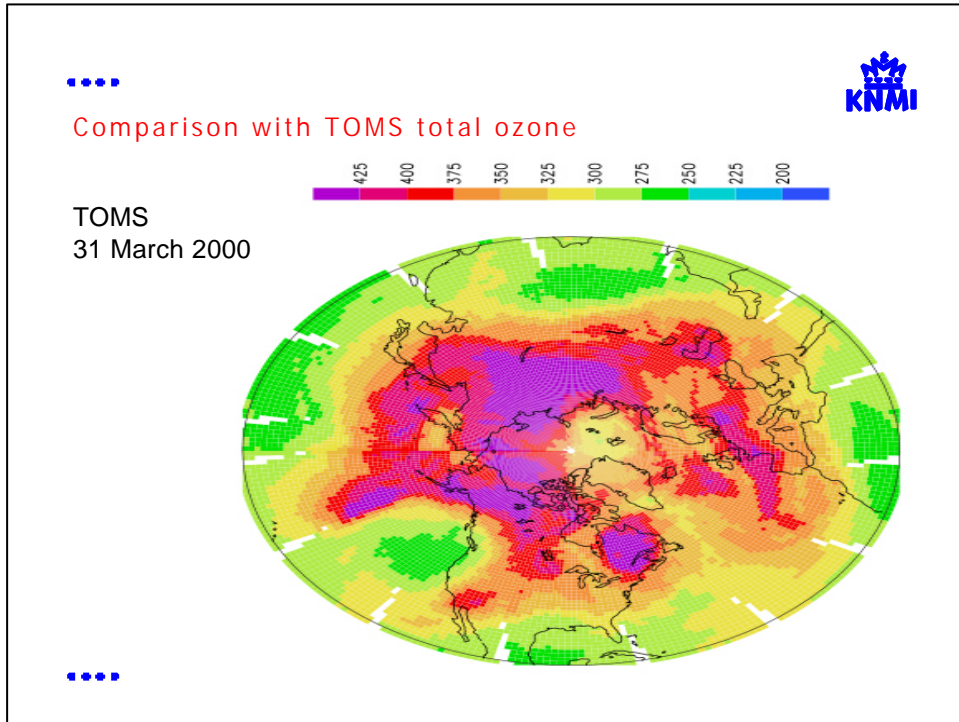
$$\text{cov}(\mathbf{y} - H[\mathbf{x}]) \approx \mathbf{H} \mathbf{P} \mathbf{H}^T + \mathbf{R}$$

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Dependence on GOME retrieval

- Version 3 GDP ozone columns
- KNMI fast delivery, v3

Validation results:

- J.C. Lambert: <http://www.oma.be/GOME>
- D. Balis: GOA first annual report

Validation studies focus on bias  
(rms much more difficult to estimate with ground-based observations)

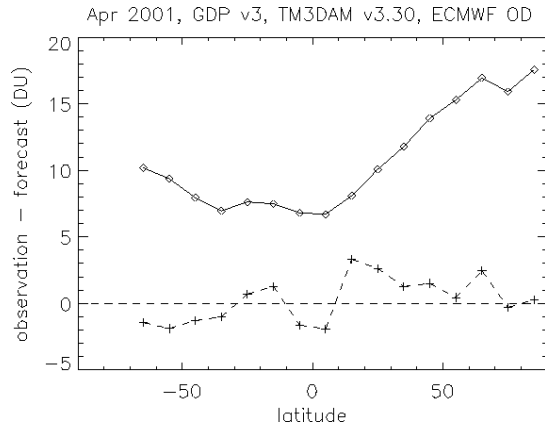
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Observation minus forecast statistics: ECMWF OD



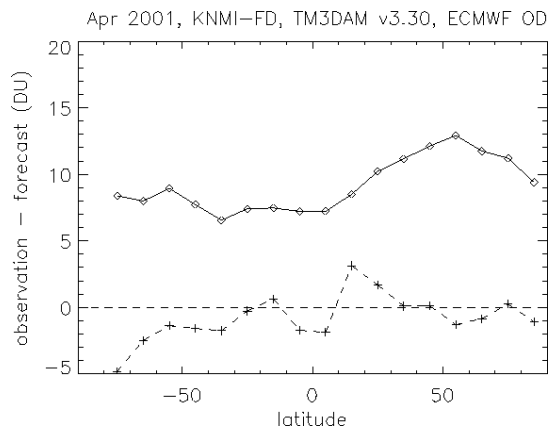
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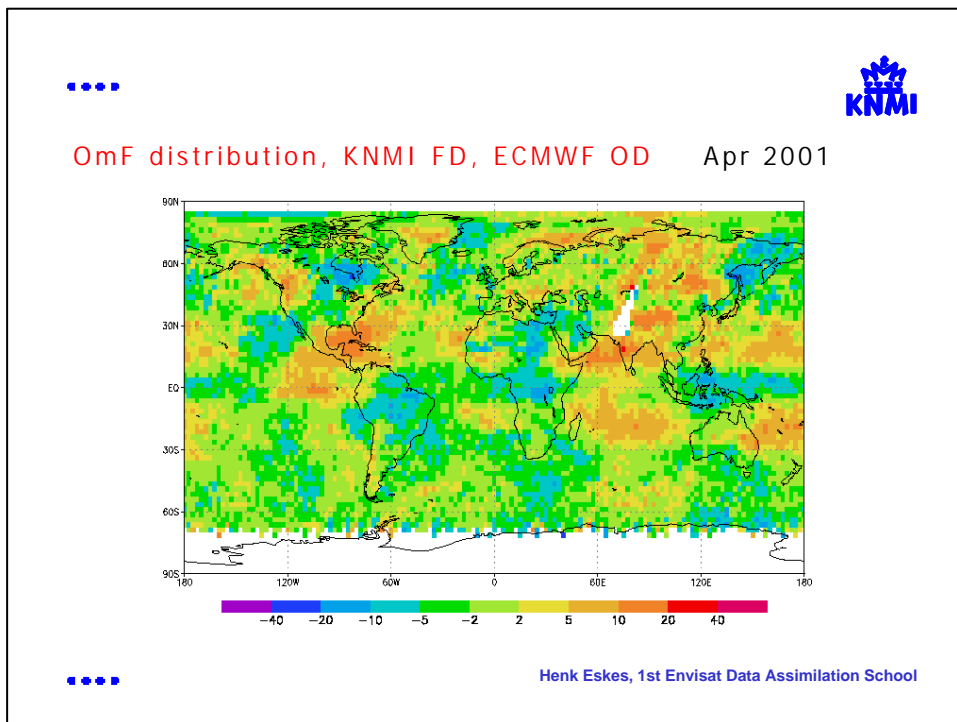
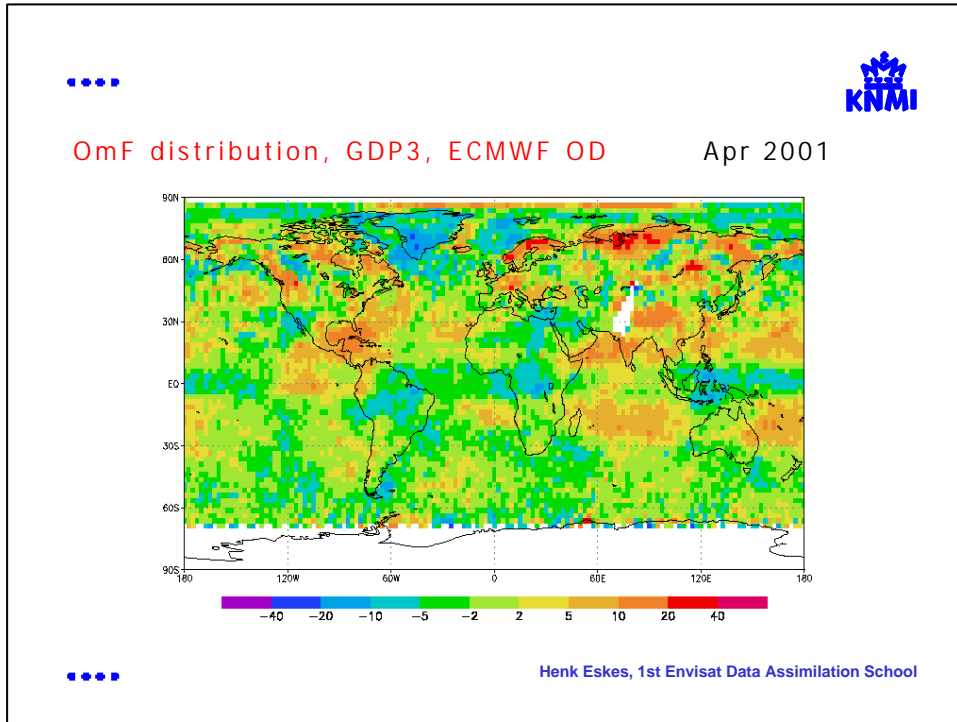
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OmF vs latitude, KNMI FD, ECMWF OD




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# Break

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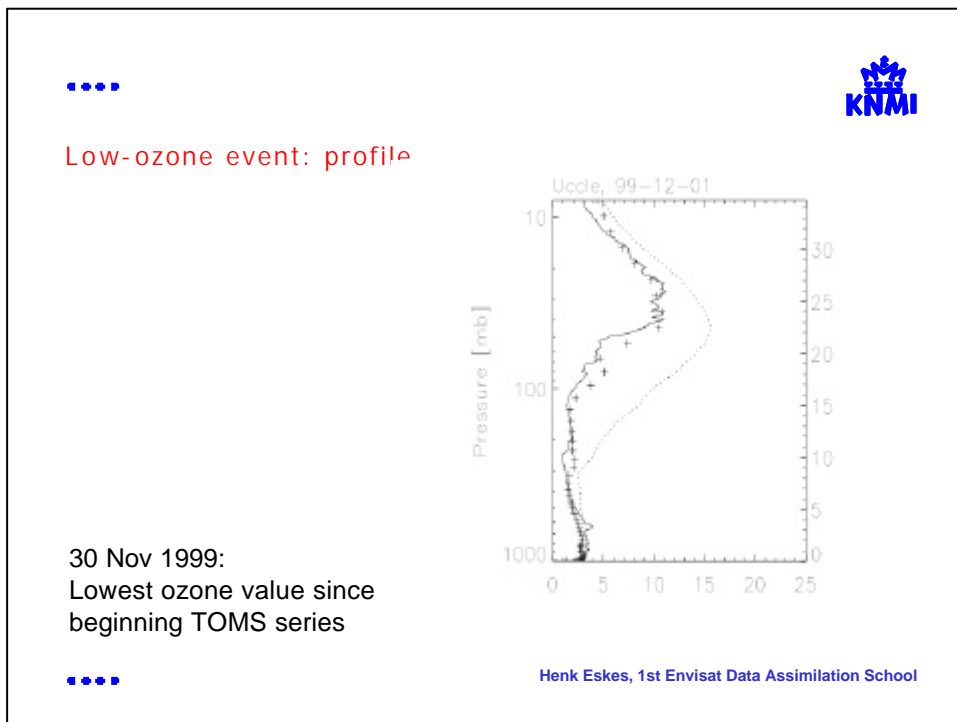
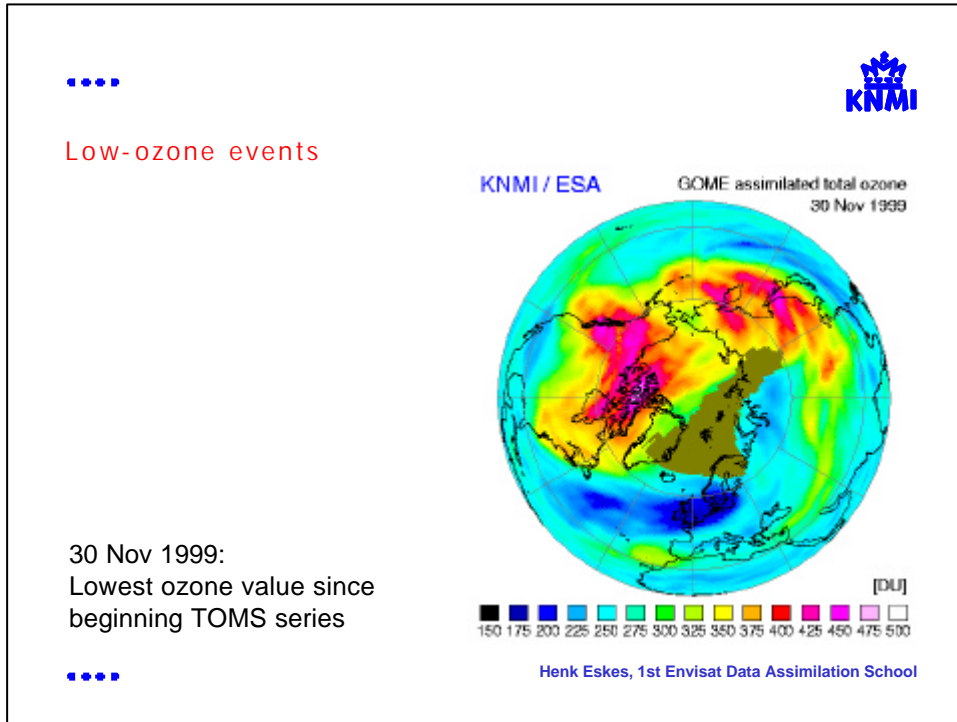


## Seven year GOME ozone data set: examples

<http://www.knmi.nl/goa>

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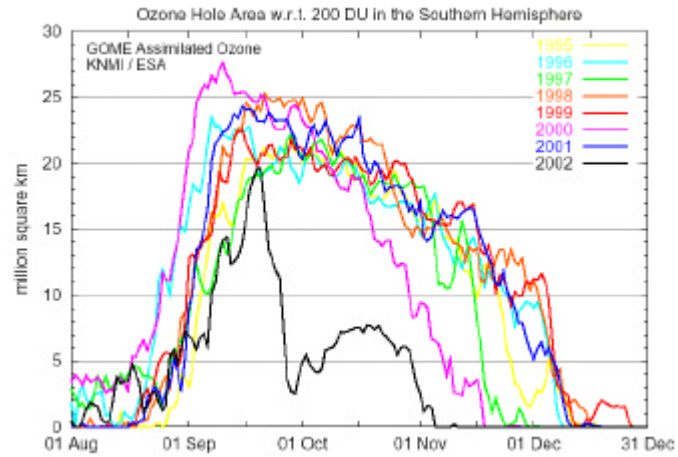
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GOME: Ozone hole 1995-2002



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New observations: ENVISAT

Atmospheric chemistry instruments

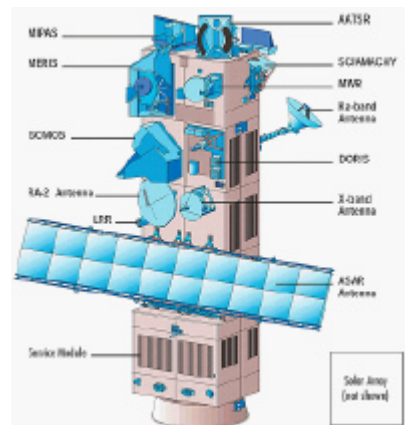
- MIPAS
- GOMOS
- SCIAMACHY

Stratosphere

- O<sub>3</sub>, Cl, Br, N, H

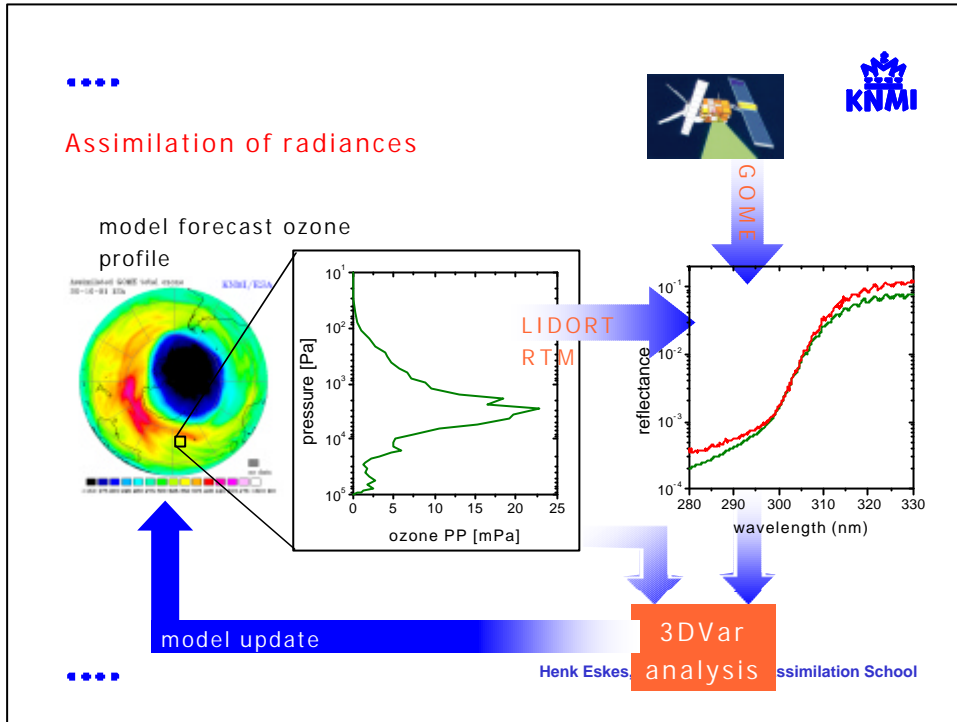
Troposphere (Sciamachy)

- O<sub>3</sub>, NO<sub>2</sub>, H<sub>2</sub>CO, SO<sub>2</sub>
- CH<sub>4</sub>, CO, CO<sub>2</sub>



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Ozone forecasts, based on GOME observations

*Henk Eskes, Peter van Velthoven,  
Pieter Valks, Mark Allaart, Ronald van der A,  
Hennie Kelder*

[http://www.knmi.nl/gome\\_fd](http://www.knmi.nl/gome_fd)

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What determines quality of  
(chemical) weather forecasts ?

Ingredients

- Accurate analysis of the present state of the atmosphere  
based on available observations  
and short-range model forecast  
combined with data assimilation
- Model of the evolution of dynamics and chemistry in the atmosphere

Observations

- Meteorology:  
temperature, pressure, wind, moisture
- Chemical concentrations  
Ozone, NO<sub>x</sub>, CO ...

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KNMI Ozone analyses and forecasts

- Transport-chemistry model for ozone  
driven by ECMWF meteorological analyses and forecasts
- GOME ozone data  
near-real time
- Data assimilation scheme  
parametrized Kalman filter

--> Daily ozone analyses and 5-day forecasts

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Anomaly correlation, RMS error

Anomaly correlation

$$C = \frac{\langle (f-c)(a-c) \rangle}{\sqrt{\langle (f-c)^2 \rangle \langle (a-c)^2 \rangle}}$$

Root mean square error

$$E = \sqrt{\langle (f-a)^2 \rangle}$$

( f = forecast, a = analysis, c = climatology )

- Anomaly defined w.r.t. climatology "c" :  
Not useful for ozone - artificially high scores
- Alternative: "c" = running monthly mean

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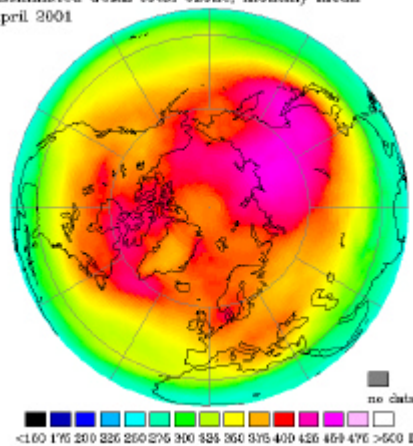
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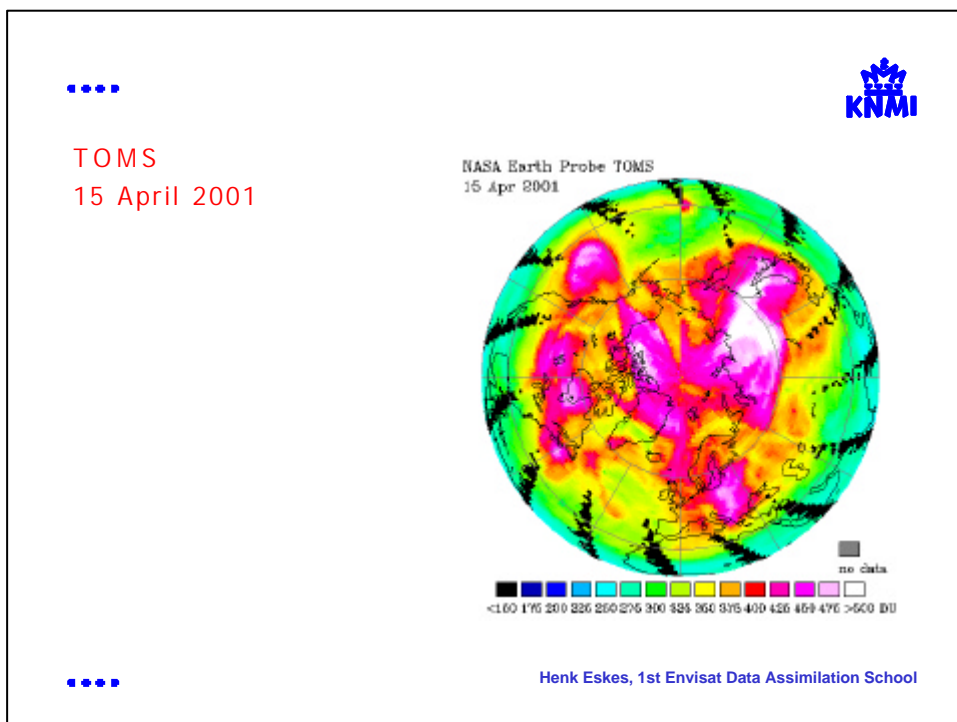
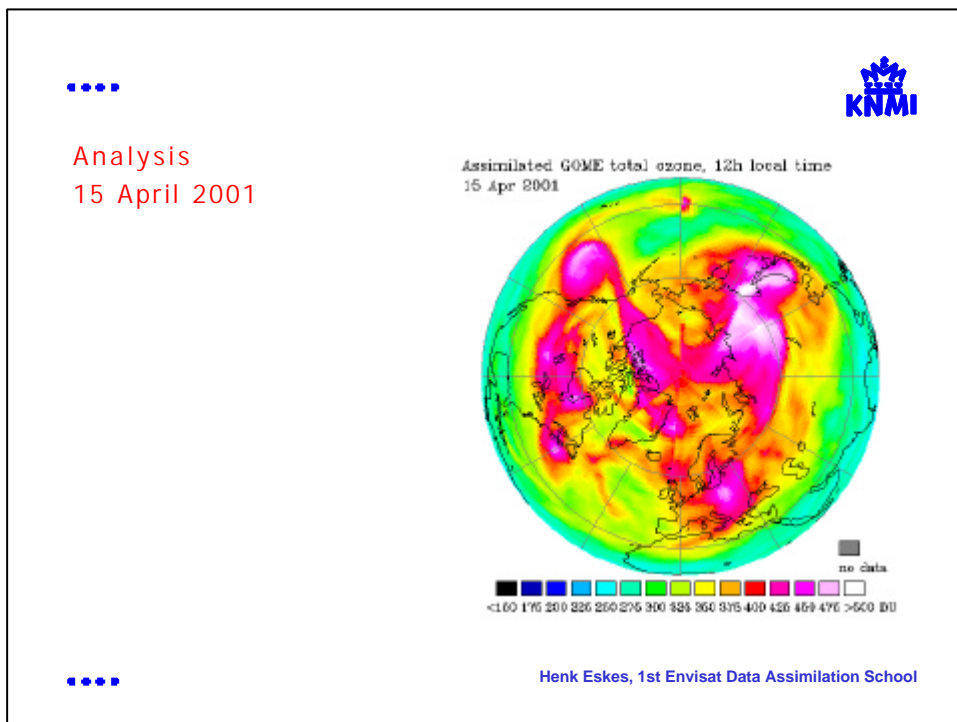
April 2001  
Monthly mean

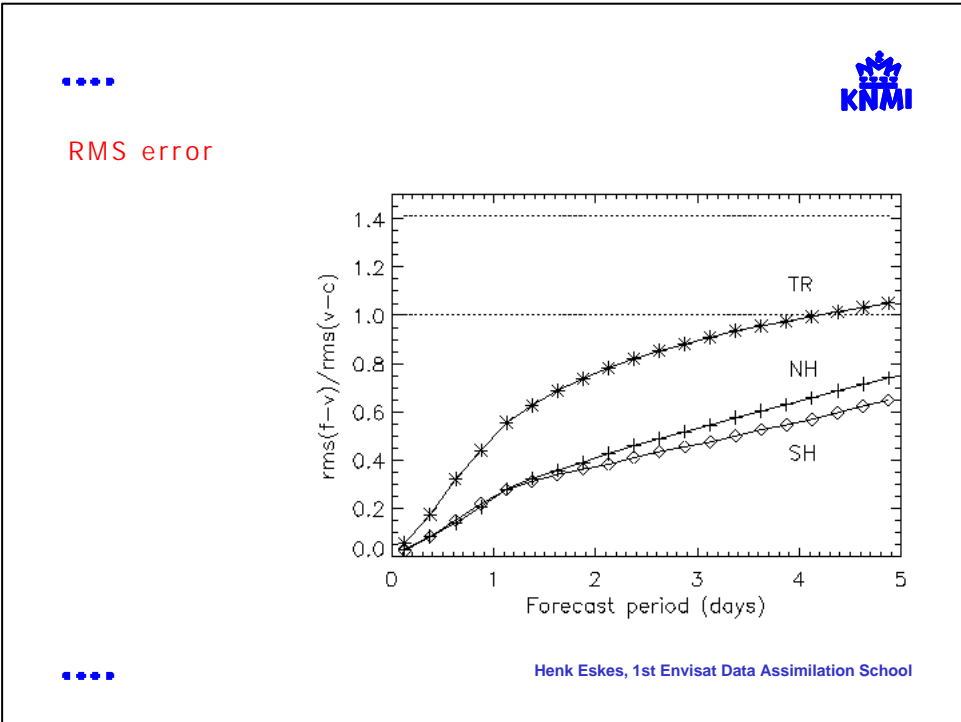
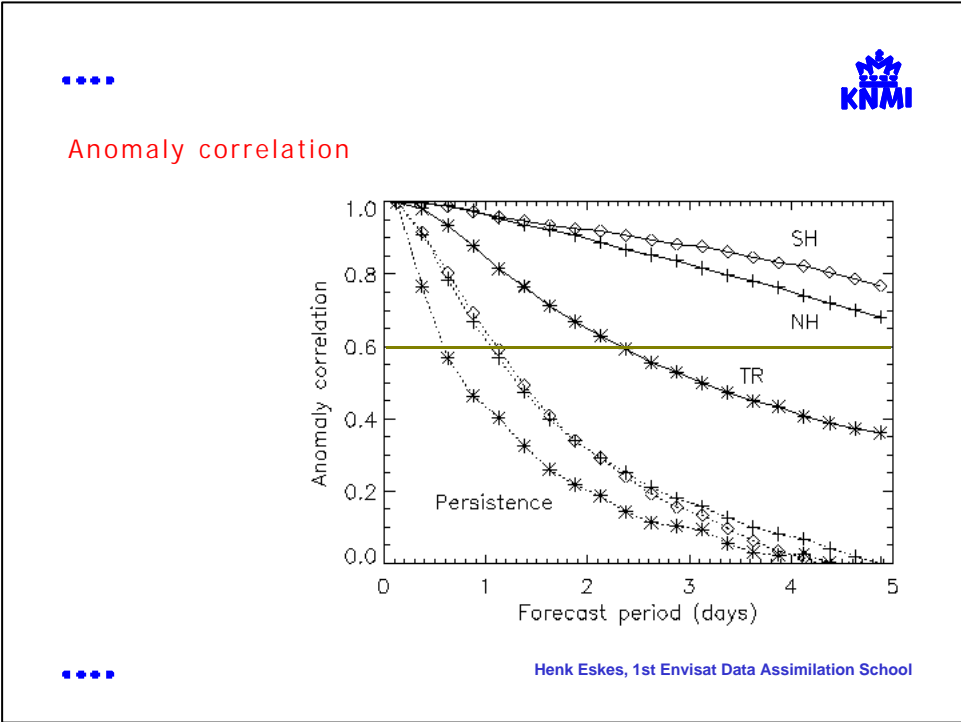
Assimilated GOME total ozone, monthly mean  
April 2001



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### Tropics

In tropics anomaly forecast score lower than in extratropics

- > Anomaly small (2-3% compared to 5-10%)
- > More sensitive to observation noise, retrieval errors
- > Anomaly mainly tropospheric
- No tropospheric ozone chemistry in model

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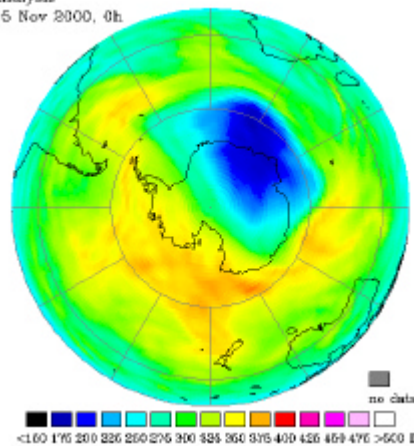
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### Breakup 2000 ozone hole

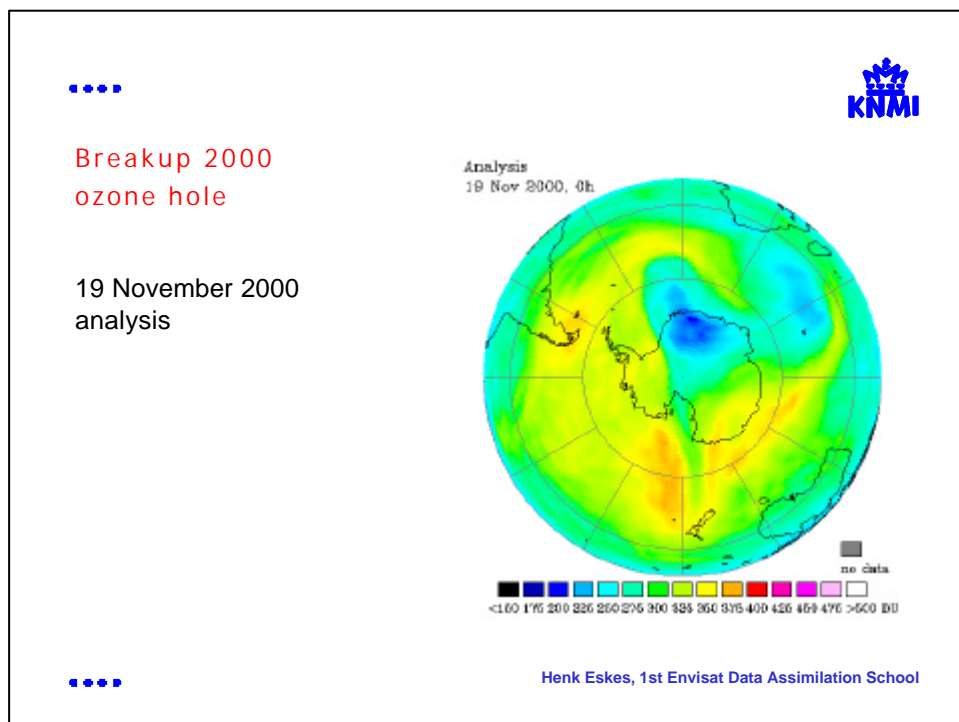
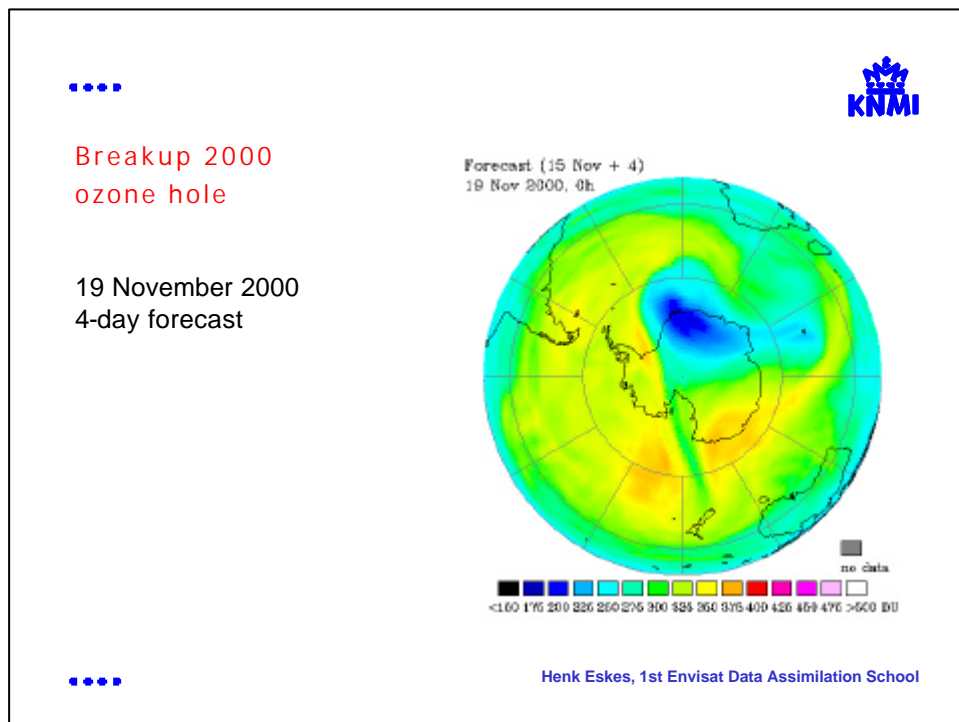
15 November 2000  
analysis  
based on GOME  
ozone observations

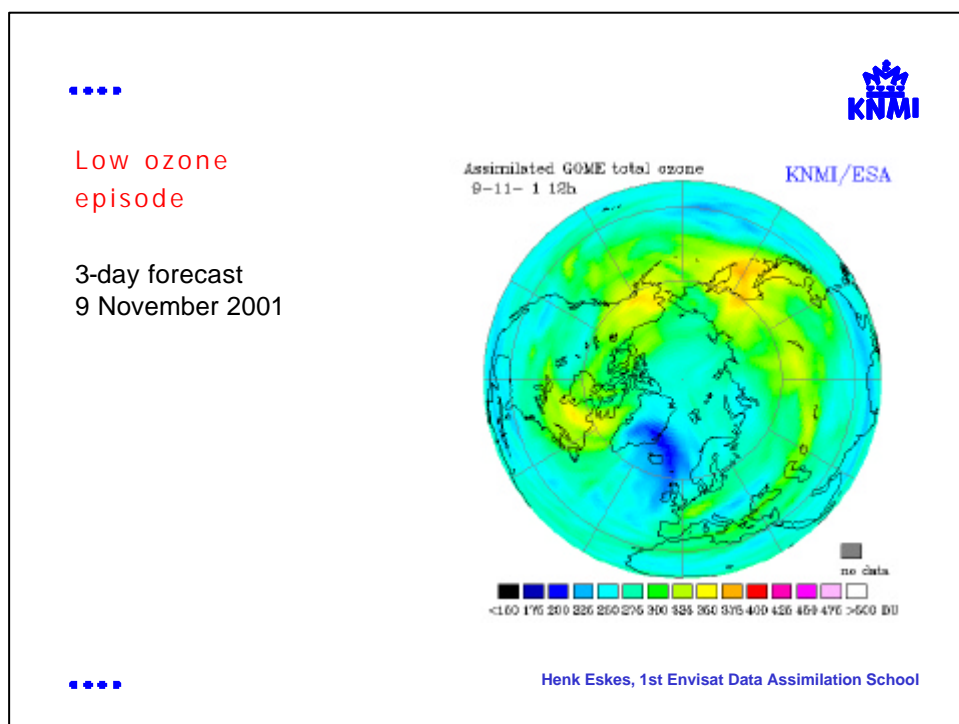
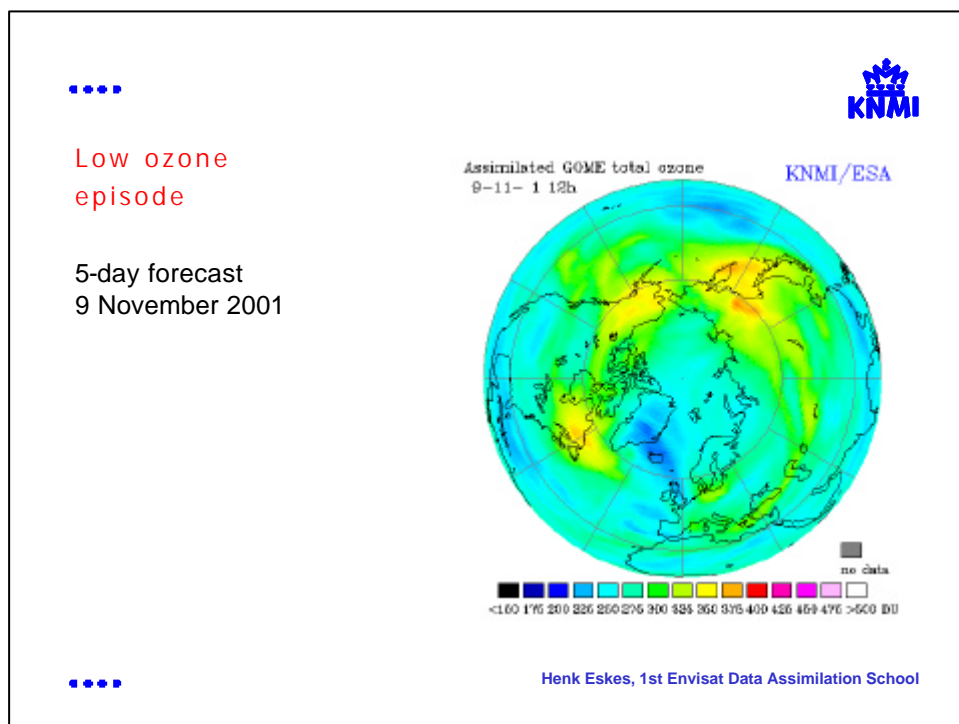
Analysis  
15 Nov 2000, 0h

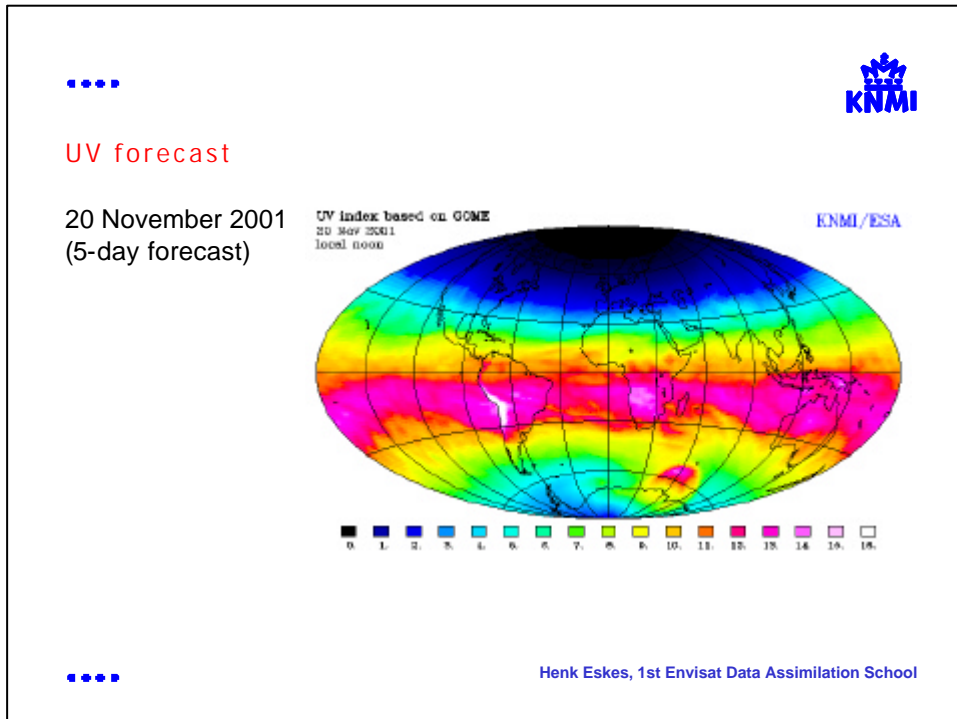
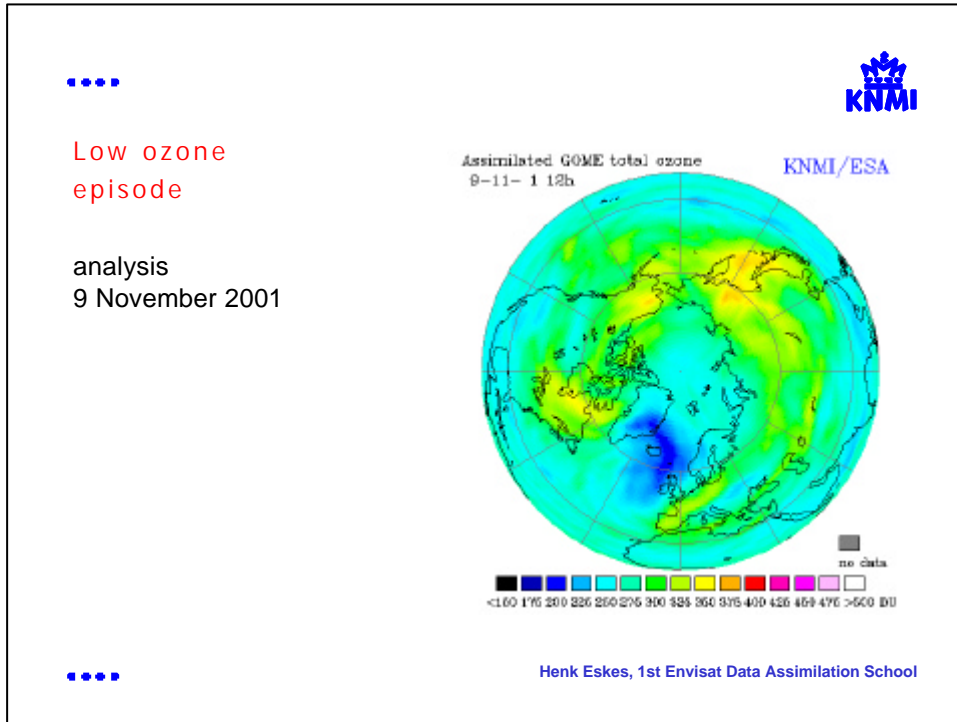


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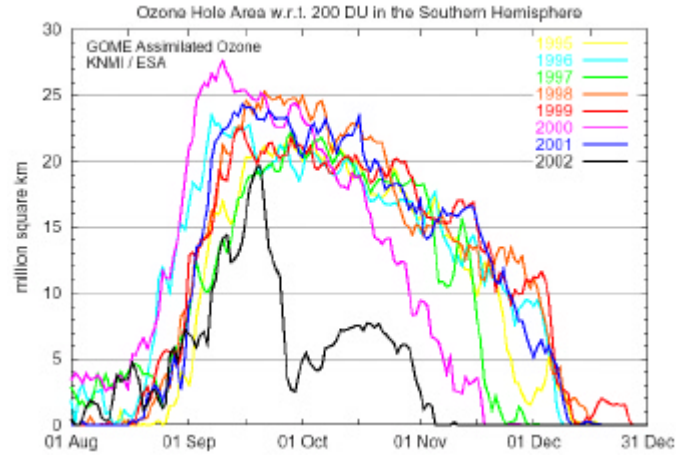




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GOME: Ozone hole 1995-2002



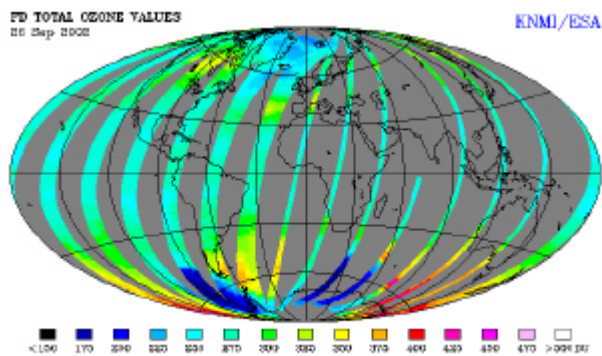
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GOME measurements at 25 September 2002



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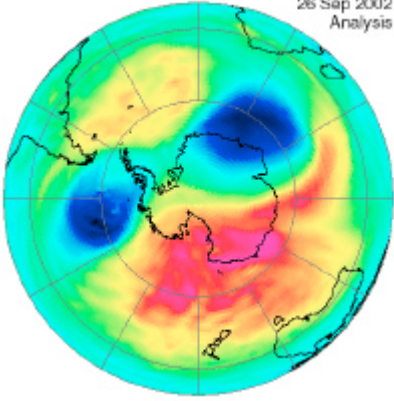
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**KNMI**

Ozone hole breakup, 2002

26 September 2002  
Analysis based on GOME



26 Sep 2002  
Analysis

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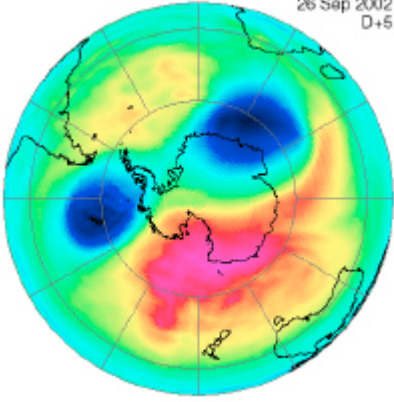
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**KNMI**

Ozone hole breakup, 2002

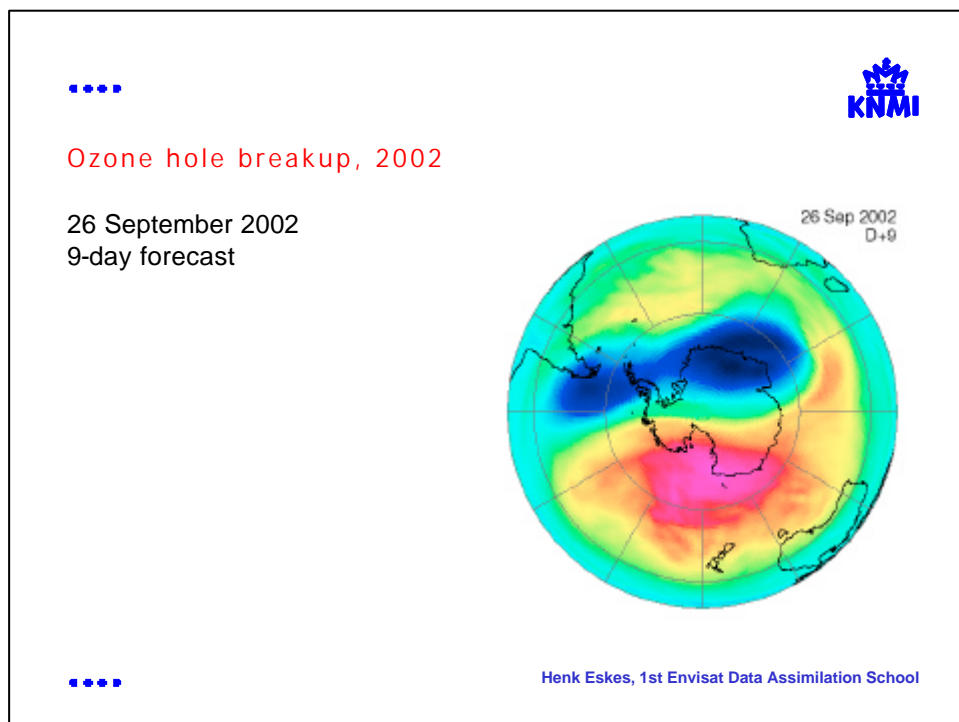
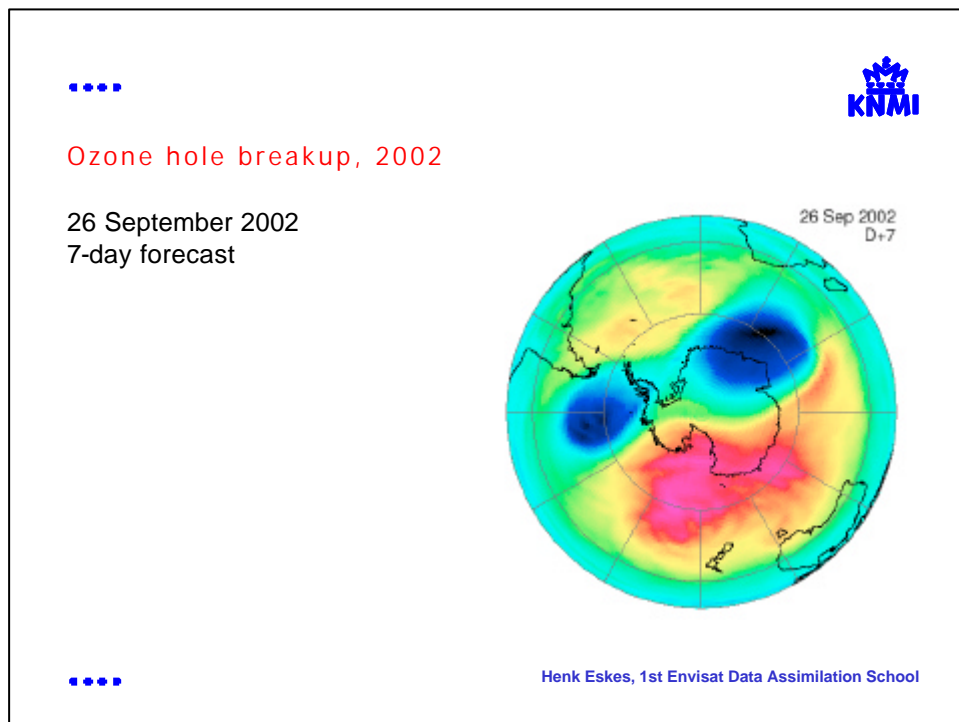
26 September 2002  
5-day forecast



26 Sep 2002  
D+5

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## Summary

### Ozone forecasting

Meaningful forecast up to one week in extratropics

Tropics: forecast up to 2 days

(small anomaly, measurement noise,  
no tropospheric chemistry)

### Examples

Breakup 2000/2002 ozone hole

Ozone "mini-holes" over Europe

UV: excursion ozone hole

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## Further reading

### KNMI ozone assimilation

Eskes et al, QJRMS 129, 1663, 2003: GOME ozone assimilation

Eskes et al, ACP 2, 271, 2002: Ozone forecasts

### GOME and ozone assimilation

Burrows et al, JAS 56, 151, 1999: GOME overview

Stajner et al, QJRMS 127, 1069, 2001: GEOS O3 data assimilation

Dethof, tech.memo.377, ECMWF, 2002: Ozone in ERA40

Struthers, JGR 107, doi:10.1029/2001JD000957: O3 assim with UKMO

Riishojgaard, QJRMS 122, 1545, 1996: impact O3 assimilation on winds

Khattatov et al, JGR 105, 29135, 2000: assimilation of long-lived tracers

Menard, MWR 128, 2654, 2000: tracer assimilation with Kalman filter

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