



**Algorithm Document**  
**Tropospheric NO<sub>2</sub>**

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**Algorithm Document**  
**Tropospheric NO<sub>2</sub>**

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## 1. INTRODUCTION

Nitrogen oxides play a central role in tropospheric chemistry, and there are several reasons why an improved knowledge of the global tropospheric distribution of NO<sub>x</sub> (NO+NO<sub>2</sub>) is important:

- NO<sub>x</sub> and volatile organic compounds are emitted in large quantities due to human activities such as traffic and industry. In the summer months this mixture produces photochemical smog.
- The chemical budget of ozone in the troposphere is largely determined by the concentration of NO<sub>x</sub>. The knowledge of the ozone distribution and its budgets is strongly limited by a severe lack of observations of NO and NO<sub>2</sub> in the troposphere.
- The variability of NO<sub>x</sub> concentrations in the lower troposphere in industrialised areas and near biomass burning sites is very large. The few available point observations of NO<sub>x</sub>, on the ground or from aircraft measurements, are therefore difficult to translate to regional scale concentrations. The residence time of NO<sub>x</sub> in the lower troposphere is short. Therefore observations of boundary layer NO<sub>x</sub> contain important information on the emissions of nitric oxide, and the trends in these emissions.
- The free troposphere is also of great importance for the ozone budget, and for CH<sub>4</sub> and CO oxidation processes. Again these budgets are uncertain due to a limited knowledge of NO<sub>x</sub>. The degree of NO<sub>x</sub> transfer from the boundary layer is difficult to model, and NO<sub>x</sub> emissions from lightning are very uncertain.

Formaldehyde (CH<sub>2</sub>O) is a major intermediate gas in the oxidation of methane and many other hydrocarbons. The lifetime of formaldehyde is short, and the photolysis reactions and reaction with OH form a major source of CO. Because of the short lifetime of several hours, the presence of formaldehyde signals hydrocarbon emission areas. Formaldehyde is important, since it is a measure of the total amount of oxidised hydrocarbons, and together with NO<sub>x</sub> quantifies the chemical ozone production. The presence of elevated levels of CH<sub>2</sub>O is related to the release of hydrocarbons (ethene, isoprene, and methane) by forests, biomass burning, traffic and industrial emissions.

An important step in filling the gap in our knowledge of tropospheric NO<sub>x</sub> and CH<sub>2</sub>O has been made by the GOME instrument on ERS-2. The prime advantage of satellites is their capability of providing a full global mapping of the atmospheric composition. After cloud filtering, GOME provides global coverage tropospheric NO<sub>2</sub> and CH<sub>2</sub>O maps roughly every week. SCIAMACHY provides less coverage, but detects more detailed information due to its better spatial resolution than GOME. SCIAMACHY observations of tropospheric pollution are envisaged to contribute to model predictions of the chemical state of the atmosphere (chemical weather forecasting).

Column amounts of NO<sub>2</sub> can be derived from the detailed spectral information provided by GOME and SCIAMACHY in the wavelength range 420-450 nm. Good signal-to-noise ratios (of about 20) are obtained for GOME NO<sub>2</sub> with the Differential Optical Absorption Spectroscopy (DOAS) retrieval technique. This is related to the absence of strong other absorbers (e.g. ozone) in this spectral interval. GOME has also, demonstrated the ability to observe boundary layer NO<sub>2</sub> [i.e. *Leue et al.*, 2001]: on top of a stratospheric background enhanced column NO<sub>2</sub> amounts are observed that correlate well with known

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industrialised areas. GOME has also detected NO<sub>2</sub> plumes originating from biomass burning events and enhanced CH<sub>2</sub>O concentrations over forests [Palmer *et al.*, 2001]. Furthermore, there are signatures of lightning-produced NO<sub>2</sub> in the GOME data set [Beirle *et al.*, 2004].

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## 2. FORWARD MODEL AND INVERSION PROCEDURE

There is a suit of papers describing retrieval techniques for total and tropospheric column NO<sub>2</sub> [Velders *et al.*, 2001, Martin *et al.*, 2002, Lauer *et al.*, 2002 and Richter and Burrows, 2002] and CH<sub>2</sub>O [Chance *et al.*, 2000]. The method described here differs from most papers in the sense that a data-assimilation technique is used to estimate the stratospheric part of the NO<sub>2</sub> column, which is an essential step in determining quantitatively accurate tropospheric and total NO<sub>2</sub> columns. The reader is referred to Eskes *et al.* [2003] and Boersma *et al.* [2004] for more detailed information on this retrieval aspect. The technique used to determine CH<sub>2</sub>O will be quite similar as described in Palmer *et al.* [2001] and will not be discussed in more detail here. Below, an overview of the NO<sub>2</sub> retrieval technique is given together with improvements over previous retrievals.

The first step in retrieving tropospheric NO<sub>2</sub> is performed by BIRA-IASB and covers the spectral fitting of SCIAMACHY L<sub>v</sub>1 data to generate so-called slant column densities (scd's) of NO<sub>2</sub>. These scd's will then be matched to KNMI FRESCO cloud parameters to obtain a pre-processed input dataset for the complete retrieval scheme.

### 2.1 Retrieval method slant columns

The technique used to retrieve total slant columns of atmospheric trace species from Satellite (GOME, SCIAMACHY) measurements is the Differential Optical Absorption Spectroscopy (DOAS). Differential Optical Absorption Spectroscopy is a widely used method to determine concentrations of atmospheric species [Platt, 1994]. The DOAS analyse of broadband spectra in the UV and visible region (200-800 nm) allows the determination of concentrations of atmospheric species, which leave their absorption fingerprints in the spectra.

The DOAS technique is based on a straightforward implementation of the Beer-Lambert's law, which describes the extinction of the solar radiation in an absorbing atmosphere:

$$I(\lambda) = I_0(\lambda) \cdot \exp\left(-\sum_i \sigma_i c_i\right) \quad [4.1]$$

where :  $I(\lambda)$  is the solar spectrum after absorption (earthshine radiance);

$I_0(\lambda)$  is the extraterrestrial solar spectrum (solar irradiance);

$\sigma_i$  are the relevant cross sections of the absorbing species, with wavelength and temperature dependent structures;

$c_i$  are the unknown species column densities.

The logarithm of the ratio of the irradiance spectrum ( $I_0(\lambda)$ ) and the earthshine spectrum ( $I(\lambda)$ ) is denoted optical density (or optical thickness):

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$$\log(I_0(\lambda) - I(\lambda)) = \sum_i \sigma_i c_i \quad [4.2]$$

The DOAS approach is a direct application of equation 4.2. High frequency spectral structures characteristics of the various absorbing species are used to resolve the corresponding contributions to the total optical density. This is obtained using a least-square procedure where the slant column densities (SCD) of the various species are the fitted parameters. Large band contributions to the atmospheric attenuation (Rayleigh and Mie scattering) are accounted for by a low order polynomial function. Simply stated, the DOAS technique is a linear problem. This linearity is however broken down by the need to account for additional effects, namely:

- small wavelength shifts between  $I$  and  $I_0$  spectra must be corrected using appropriate shift and stretch parameters,
- possible instrumental and/or atmospheric straylight or residual dark current signal require the introduction of an offset parameter.

In addition to shift and offset, Ring and undersampling effects have to be treated. The so-called Ring effect arises in the atmosphere due to inelastic scattering processes (mainly Rotational Raman Scattering (RRS) by molecular  $O_2$  and  $N_2$ ). Roughly speaking, it manifests itself by a broadening of the solar and atmospheric spectral features present in the satellite earthshine backscattered spectra. This broadening typically reduces the depth of thin solar and atmospheric absorption features by several percents. Hence, it has a strong impact on spectroscopic measurements using the DOAS method and requires appropriate correction to be implemented in retrieval algorithms. In DOAS, the Ring effect is usually accounted for as an absorber. Ring cross sections can be obtained from different sources [Vountas, 1998], [Chance, 1997]. The undersampling problem arises from the poor sampling ratio of the instrument which results in a loss of spectral information when interpolating earthshine spectra during the DOAS fitting process. To some extent, the problem can be corrected by using an ad-hoc cross section obtained by simulating the effect based on a high-resolution solar reference.

Let us consider the modified equation:

$$\log(I(\lambda + \Delta\lambda) - offset(\lambda)) = \log(I_0(\lambda)) - \sum_i \sigma_i(\lambda) c_i - P - \sigma_{ring}(\lambda) c_{ring} - \sigma_u(\lambda) c_u \quad [4.3]$$

$P$  is the polynomial. Undersampling cross section and ring effect cross section are simply included as additional pseudo-absorbers.

The selection of the spectral analysis window determines which absorbers have to be included in the fitting procedure. Several cross sections of a same absorber can be fitted together (for example to account for a temperature dependency of the cross sections).

Residuals of equation 4.3 are minimised using a Marquardt-Levenberg non-linear least-squares (NLLS) algorithm. The method implements a gradient-expansion algorithm, which is based on the iterative combination of a steepest-descent method (suitable for approaching the minimum from far away) and a lineari-

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zation of the fitting function. Linear parameters are determined by a Singular Value Decomposition (SVD) method embedded in the NLLS algorithm.

### The DOAS Software

The DOAS of spectra is performed using **WinDOAS**, a multi-purpose DOAS analysis software developed over the nineties at BIRA-IASB. This software initially developed for ground-based applications has been thoroughly validated through participation at various intercomparison exercises [Hofmann, 1995], [Roscoe, 1999], [Aliwell, 2002]. For more information on the algorithm details, see the “WinDOAS 2.1 Software User Manual” [Fayt, Van Roozendael] (<http://uv-vis.aeronomie.be/software/WinDOAS/>).

### Overview SCIAMACHY NO<sub>2</sub> Slant Columns Retrieval

<b><u>Software:</u></b>	WINDOAS [Fayt, Van Roozendael, 2001]
<b><u>Analysis Method:</u></b>	Differential Optical Absorption Spectroscopy
<b><u>Fitting interval:</u></b>	426.3 - 451.3 nm (channel 3, cluster 15)
<b><u>Molecular absorption cross-sections:</u></b>	NO <sub>2</sub> at 243K [Bogumil et al., 1999] O <sub>3</sub> at 223K [Bogumil et al., 1999] O <sub>4</sub> [Greenblatt et al., 1990] H <sub>2</sub> O [Rothman, 1992]
<b><u>Additional terms/corrections:</u></b>	Calculated ring spectrum [Vountas, 1998] Polynomial (order 2) Offset (constant + slope)

A radiance reference spectrum over Indian Ocean is used, where the tropospheric NO<sub>2</sub> is supposed to be almost zero. A stratospheric correction is applied afterwards, taking into account the SZA of the reference spectrum and the stratospheric NO<sub>2</sub> VCD in this region ( $1.5 \times 10^{15}$ ) [Lambert, 2002].

## 2.2 Conversion of slant columns to total columns

The slant column ( $N_s$ ) calculated with the DOAS method can be converted to the vertical column ( $x$ ) by applying the air mass factor ( $M$ ):

$$x = \frac{N_s}{M(\mathbf{x}_a, \mathbf{b})} \quad [4.4],$$

The air mass factor is calculated with the DAK radiative transfer model [Stammes, 2000] and depends on the *a priori* profile shape ( $\mathbf{x}_a$ ) and the model parameters ( $\mathbf{b}$ ). See the discussion on the tropospheric air mass factor in the next section for a detailed description.

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## 2.3 Retrieval method tropospheric columns

The retrieval approach for tropospheric columnar NO<sub>2</sub> in TEMIS is the DOAS method. This method consists of two steps:

- (1) The retrieval of slant columns as described above in section 1.1.
- (2) The application of an air mass factor to convert the slant column into a vertical column. For practical applications of DOAS it is important that the trace gas under investigation has a small absorption optical thickness in the predefined spectral window. For example, NO<sub>2</sub> has a typical slant optical thickness of 0.005.

The method described above is principally used for total column retrievals. However, NO<sub>2</sub> permanently resides in the stratosphere, and shows significant amounts in the troposphere near source areas. Our retrieval method first separates the stratospheric and tropospheric part of the column, and subsequently a tropospheric air mass factor is applied to the tropospheric slant column:

$$x_{tr} = \frac{N_s - N_{s,st}}{M_{tr}(\mathbf{x}_a, \mathbf{b})} \quad [4.5],$$

where  $N_s$  denotes the slant column density as obtained from step 1 as described above,  $N_{s,st}$  is the stratospheric component of the slant column, and  $M_{tr}$  represents the tropospheric air mass factor. The tropospheric air mass factor depends on the a priori profile shape  $\mathbf{x}_a$  and the set of model parameters  $\mathbf{b}$ .

One of the innovations of the retrieval method applied in the TEMIS project is that the stratospheric part of the slant column is determined by data assimilation of observed slant columns in a chemistry-transport model proposed and described in *Eskes et al.*, [2003]. Shortly summarized, SCIAMACHY slant column observations are assimilated in TM4 as follows:

- A priori NO<sub>2</sub> profiles are convolved with the averaging kernel (obtained with the DAK radiative transfer model [*Stammes*, 2000]) to give the model predicted slant column densities ( $N_{s,m} = \mathbf{A} \cdot \mathbf{x}_a / M$ , with  $N_{s,m}$  the model predicted slant column, and  $\mathbf{A}$  the averaging kernel).
- The differences between the observed and modelled columns are used to force the modelled columns to generate an analysed state based on the model forecast and GOME observations. This forcing depends on weights (from observation representativeness and model errors) attributed to both modelled and observed columns. Observed columns are attributed a low weight if the model predicts large tropospheric columns. This reflects the uncertainty in the averaging kernel, and minimises the influence of slant columns contaminated by tropospheric signals. The forcing equation is solved with the statistical interpolation method, involving a covariance matrix operator that incorporates the assumed 3-D correlation of NO<sub>2</sub> differences. The most important characteristics of this forecast covariance matrix are; (1) the conservation of model profile shapes, i.e. differences between modelled and observed quantities are not vertically redistributed but rather scaled in the forcing equation, and (2) the horizontal correlation model function is assumed to follow a Gaussian shape with a 1/e correlation length of 600 km.
- The forecast field is subsequently replaced by the analysis. This cycle is repeated for all available orbits.

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The advantage of the approach is that slant column variations due to stratospheric dynamics are now accounted for. The aim is to decrease the accuracy threshold of tropospheric columns that can be retrieved. An additional advantage is that the assimilation scheme provides a statistical estimate of the uncertainty in the stratospheric slant column.

The tropospheric air mass factor  $M_{tr}$  is obtained by multiplying the elements of the troposphere-only a priori NO<sub>2</sub> profile  $\mathbf{x}_a$  derived from chemistry-transport model TM4 with the elements of the altitude dependent air mass factor  $m_l$  as follows:

$$M_{tr} = \frac{\sum_l m_l(\mathbf{b}) \cdot x_{a,l}}{\sum_l x_{a,l}} \quad [4.6],$$

and where the elements of the altitude dependent air mass factor depend on the set of model parameters  $\mathbf{b}$  including cloud fraction, cloud height and surface albedo.

The air mass factor can be written as [Boersma *et al.*, 2004]:

$$M_{tr} = M(\mathbf{x}_a, \mathbf{b}) = M(\mathbf{x}_a, f_{cl}, z_{cl}, a_{sf}, \boldsymbol{\tau}_{aer}) \quad [4.7],$$

where  $f_{cl}$  is the cloud fraction,  $z_{cl}$  is the cloud (top) height,  $a_{sf}$  is the surface albedo, and  $\boldsymbol{\tau}_{aer}$  is the aerosol optical thickness profile. The air mass factor depends on the solar zenith, viewing zenith and relative azimuth angle as well, but the measurement geometry is known with high accuracy and therefore does not contribute significantly to the error in the air mass factor. Each of the contributions of  $f_{cl}$ ,  $z_{cl}$ ,  $a_{sf}$  and  $\boldsymbol{\tau}_{aer}$  to the error in the air mass factor is extensively discussed by Boersma *et al.* [2004].

For the fit of slant column a fixed temperature of 243K has been used for the cross-section. However, the cross-sections are temperature dependent. To correct for this, an empirical correction factor has been used in the air mass factor calculation.

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### 3. AUXILIARY DATA

For the tropospheric NO<sub>2</sub> algorithm the following auxiliary data is needed: ECMWF meteorological fields, surface albedo climatology (Combined TOMS-GOME albedo climatology), topology database (GTOPO30), and emission databases (EDGAR etc). The data is specified below.

#### 3.1 Specification of the ECMWF operational analyses

Originating System:	ECMWF
Data Class	Model
Name of Data Source	OD (Operational ECMWF-IFS analyses)
Sensor Type/Name:	N/A
Sensor key technical parameters	
Spatial resolution / coverage: TL511	
Vertical resolution / coverage: 60 layer	
Temporal resolution / coverage: 3h/6h	
System operations availability	
Start date: January 2000	
End date: present	
Probability of availability	
100 %	
Product name and reference to product technical specification document:	
ECMWF-OD. Documentation at <a href="http://www.ecmwf.int">http://www.ecmwf.int</a>	
Data availability and coverage:	
Time-scale: 6 hours after acquisition	
Geographic: Global	
Quality and reliability:	
<b>Quality:</b> High	
<b>Reliability:</b> 100 %	
Further parameters and remarks:	
Wind, temperature, pressure.	
References:	
<ul style="list-style-type: none"> <li>Different aspects of the ECMWF IFS are discussed in technical memos and reports available from the ECMWF web site, <a href="http://www.ecmwf.int/">http://www.ecmwf.int/</a>.</li> </ul>	

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### 3.2 Specification of the GTOPO30 climatology

Originating System:	U.S. Geological Survey's EROS Data Center
Data Class	Climatology
Name of Data Source	GTOPO30
Sensor Type/Name:	N/A
Sensor key technical parameters	
Spatial resolution / coverage: 30-arc seconds	
Vertical resolution / coverage: N/A	
Temporal resolution / coverage: N/A	
System operations availability	
Start date: N/A	
End date: N/A	
Probability of availability	
100 %	
Product name and reference to product technical specification document:	
GTOPO30. Documentation at <a href="http://edcdaac.usgs.gov/gtopo30/README.asp">http://edcdaac.usgs.gov/gtopo30/README.asp</a>	
Data availability and coverage:	
Time-scale: N/A	
Geographic: Global	
Further parameters and remarks:	
-	
References: <a href="http://edcdaac.usgs.gov/gtopo30/gtopo30.asp">http://edcdaac.usgs.gov/gtopo30/gtopo30.asp</a>	

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### 3.3 Specification of combined GOME/TOMS albedo climatology

Originating System:	TOMS and GOME data
Data Class	climatology
Name of Data Source	Albedo climatology from TOMS and GOME observations
Sensor Type/Name:	TOMS and GOME
Sensor key technical parameters	
Spatial resolution / coverage: 1 x 1 degree / Global	
Vertical resolution / coverage: N/A	
Temporal resolution / coverage: N/A	
System operations availability	
Start date: N/A	
End date: N/A	
Probability of availability	
100 %	
Product name and reference to product technical specification document:	
TOMS albedo data set : see GSE-PRO-IN-EO-5 and <i>Herman, J. R. and E. A. Celarier, Earth surface reflectivity climatology at 340-380 nm from TOMS data, J. Geophys. Res., 102, 28,003-28,011, 1997.</i>	
GOME albedo data set : <i>Koelemeijer, R. B. A., P. Stammes, J. W. Hovenier, and J. F. de Haan, Global distributions of effective cloud fraction and cloud top pressure derived from oxygen A band spectra measured by the Global Ozone Monitoring Experiment: comparison to ISCCP data, J. Geophys. Res., 107(D12), 4151, doi: 10.1029/2001JD000840, 2002.</i>	
Data availability and coverage:	
Time-scale: N/A	
Geographic: Global	
Further parameters and remarks:	
-	
References:	

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### 3.4 Specification of emission databases EDGAR/GEIA

<b>Other Data Sources</b>	
Originating System:	EDGAR, GEIA
Data Class	Emission climatology
Name of Data Source	EDGAR and GEIA emission inventories
Sensor Type/Name:	-
Sensor key technical parameters	
Spatial resolution / coverage: 1 x 1 degree / Global	
Vertical resolution / coverage: N/A	
Temporal resolution / coverage: Annual totals	
System operations availability	
Start date: N/A	
End date: N/A	
Probability of availability	
100 %	
Product name and reference to product technical specification document:	
EDGAR v2 : see <i>Olivier et al, RIVM report 771060, Natl. Inst. Of Public Health and Environ., Bilthoven, Netherlands, 1996.</i>	
Benkovitz et al, <i>JGR 101, 29239, 1996.</i>	
Guenther et al, <i>JGR 100, 8873, 1995</i>	
Yienger and Levy, <i>JGR 100, 11447, 1995.</i>	
Data availability and coverage:	
Time-scale: N/A	
Geographic: Global	

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## 4. SENSITIVITY AND ERROR ANALYSIS

The previous section illustrated the most important dependencies of NO<sub>2</sub> retrieval. Accurate quantitative estimates are needed for instance for quantitative regional air pollution monitoring, pollution trend studies and budget calculations, and realistic quantitative estimates of the columns and their errors are essential and should be given for every individual retrieval. Furthermore, this type of retrieval method is relatively young, and usually not validated. One step in convincing users that tropospheric columns are quantitative and accurate, is to provide realistic uncertainty estimates along with the columns.

For a detailed discussion on the error analysis approach taken in the TEMIS project, the reader is referred to *Boersma et al.* [2004]. Below a short summary is given of the current knowledge of the most important error sources in the retrieval of tropospheric NO<sub>2</sub> columns:

- Errors in the slant column density (step 1). These are estimated from the uncertainty on the fit parameter for NO<sub>2</sub> in the SCIAMACHY DOAS retrieval. A systematic error in  $N_s$  is expected as a consequence of the use of an Earthshine spectrum instead of a Solar irradiance spectrum but in first order, this is corrected for.
- Errors in the stratospheric slant column density. These errors are estimated from the standard deviation of the differences between model forecast and observed stratospheric NO<sub>2</sub>. Note that if a systematic error is present in  $N_s$ , that this will also be present in  $N_{s,st}$ , and thus cancels in the determination of the tropospheric part of the slant column ( $N_s - N_{s,st}$ ).
- Errors in the tropospheric air-mass factor. In our method, there are four contributions to the overall uncertainty in the tropospheric air mass factor; cloud fraction, cloud height, surface albedo, and a priori profile shape. Cloud errors are very important since clouds shield near-surface NO<sub>2</sub> from the satellite's view. The tropospheric air mass factor is very sensitive to clouds and even small cloud fractions (up to 20%) have a major impact. The tropospheric air mass factor is also very sensitive to the surface albedo especially when little clouds are present. The last and least understood error source is the a priori profile shape (and representativeness errors). Given the lack of measured tropospheric NO<sub>2</sub> profile shapes, predictions by a CTM are currently the best option. CTM TM4 contains arguably realistic emission estimates as well as chemistry, and is equipped with vertical and horizontal transport derived from ECMWF meteorology. Nevertheless, there are some important uncertainties related to the predicted profile shapes, such as the undersampling of the model (2.5° x 2.5°, i.e. 250 x 200 km<sup>2</sup> at mid-latitudes) relative to the SCIAMACHY pixel size of (30 x 60 km<sup>2</sup>), leading to representativeness errors.

In summary, the TEMIS total and tropospheric NO<sub>2</sub> products will be provided with error estimates based on the error sources discussed above. Error estimates will be given on a quantitative and pixel-to-pixel basis. However, in order to fully understand the retrieved quantitative columns, we note here that a thorough validation effort is required. Repeatedly measured NO<sub>2</sub> profile shapes will be of great use in determining the impact of the a priori profile shape in the retrieval approach.

### 4.1 Averaging kernels

In *Boersma et al.* [2004], the importance of the a priori profile shape was extensively discussed. It was shown that the tropospheric air mass factor critically depended on the a priori profile shape and that the

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choice for a particular profile is an important source of error. Within the TEMIS project, averaging kernels are provided. Kernels describe how the retrieved vertical column is related to the a priori profile  $\mathbf{x}_a$ , i.e.

$$N_v = \mathbf{A} \cdot \mathbf{x}_a \quad [4.6],$$

or, written differently, how the measured slant column is related to the true profile  $\mathbf{x}_t$ :

$$N_s = m_l(\mathbf{b}) \cdot \mathbf{x}_t \quad [4.7].$$

Furthermore, the kernels are crucial for a detailed understanding of individual observations. The elements of the averaging kernel itself are written out as follows:

$$A_l = \frac{m_l(\mathbf{b})}{M(\mathbf{x}_a)} \quad [4.8],$$

or, in words, the elements of the averaging kernel vector are equal to the elements of the altitude dependent air mass factor divided by the total air mass factor. These averaging kernel elements are given in the TEMIS data product.

Applications of the averaging kernel include

- Validation: equation 4.7 allows a direct comparison of measured NO<sub>2</sub> profiles  $\mathbf{x}$  to satellite measured slant columns  $N_s$ .
- Data-assimilation: here too the averaging kernel has the function of observation operator to translate a model predicted NO<sub>2</sub> profile  $\mathbf{x}$  to an apparent 'modelled' observation  $N_s$ .

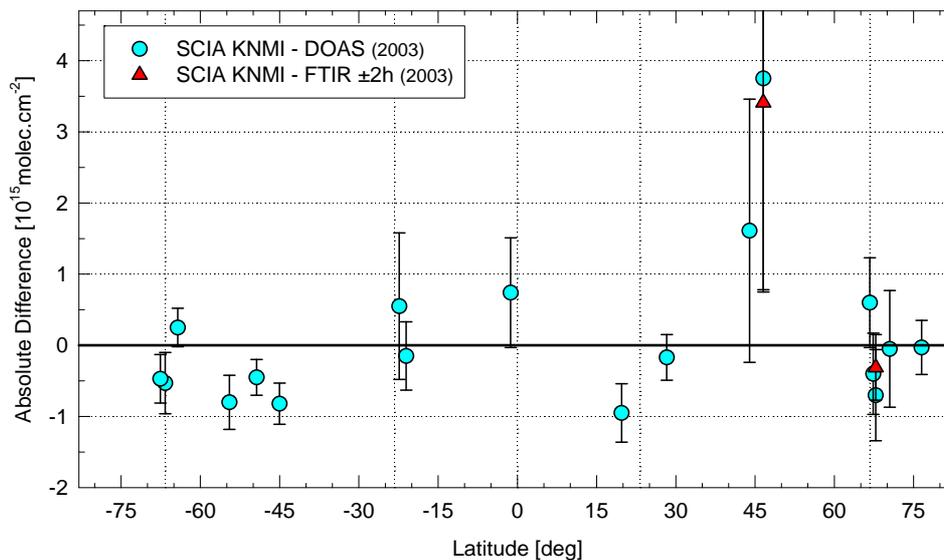
## 5. ALGORITHM VALIDATION

### 5.1 The DOAS Software

The software used for the DOAS of spectra (WinDOAS) was initially developed for ground-based applications has been thoroughly validated through participation at various intercomparison exercises [Hoffmann, 1995], [Roscoe, 1999], [Aliwell, 2002]. For more information on the algorithm details, see the “WinDOAS 2.1 Software User Manual” [Fayt, Van Roozendael] (<http://uv-vis.aeronomie.be/software/WinDOAS/>).

### 5.2 Preliminary results of geophysical validation

A few SCIAMACHY NO<sub>2</sub> products, where among the TEMIS NO<sub>2</sub> product, have been validated by Lambert *et al* [2004]. The preliminary results of this validation have been presented at the ACVE-2 meeting in 2004. A citation of Lambert’s results regarding the TEMIS NO<sub>2</sub> product follows.



**Figure 3.1** – Meridian variation of the mean absolute difference between near real time total nitrogen dioxide in July/November 2002 as reported by NDSC ground-based spectrometers and by the SCIAMACHY NO<sub>2</sub> slant columns retrieved from raw level-1 data by the research processor developed at BIRA-IASB, converted into vertical columns by KNMI. (source: Lambert *et al.*)

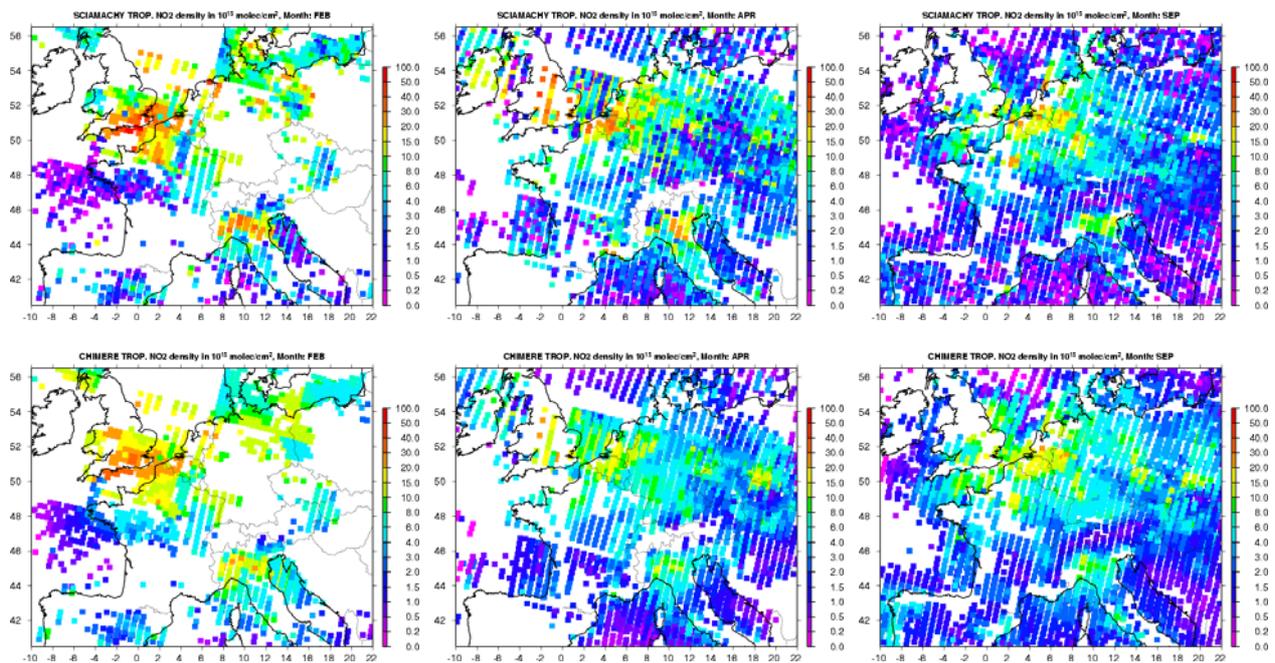
“The pole-to-pole comparison between NDSC NO<sub>2</sub> data and the SCIAMACHY data set generated at KNMI/BIRA is depicted in Figure 3.1. The main difference is observed at polluted sites of the Northern middle latitudes where the discrepancy between SCIAMACHY and NDSC data reaches values as high as  $3.5 \cdot 10^{15}$  molec.cm<sup>-2</sup>. According to modelling results and (unfortunately non correlated) airborne measurements, such high values would be better estimates of the tropospheric NO<sub>2</sub> column. Such a difference be-

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tween KNMI/BIRA retrievals and retrievals of other institutes is supposed to come mostly from the use of tropospheric AMF. GOME and SCIAMACHY total NO<sub>2</sub> retrievals using a pure stratospheric AMF are known to underestimate the vertical column in the presence of tropospheric NO<sub>2</sub>. Usually limited to 10% to 30%, this underestimation can reach a factor of two under extreme conditions. Another likely source of discrepancy, explaining the difference in behaviour at the stratospheric reference stations of the southern middle latitudes, comes from the use of a correction factor to account for the temperature dependence of the NO<sub>2</sub> absorption cross-sections. DAK RTM-computed AMFs approach geometrical AMF values in the clean Southern mid-latitude case. However, the total AMF used in the retrieval is the product of this quasi-geometrical AMF by the temperature correction based on ECMWF analyses. Studies indicate that stratospheric temperatures are typically about 15K lower than the temperature of the cross section used in the DOAS fit (243K, SCIA PFM). The typical NO<sub>2</sub> correction applied for such a temperature difference is about -5%, which corresponds to an increase in the reported AMF of 5%. Further quantitative interpretation of the results depicted in Figure 3.1 should take into account also how the temperature effect is taken into account in the retrieval of ground-based NDSC data.”

### 5.3 Model comparison

In this section, the comparison between SCIAMACHY NO<sub>2</sub> tropospheric columns and corresponding outputs of the regional chemical-transport model CHIMERE will be shown.



**Figure 3.2** Comparisons between daily NO<sub>2</sub> tropospheric columns retrieved from SCIAMACHY and that of issued from CHIMERE continental simulations. a)b)c) mean SCIAMACHY NO<sub>2</sub> tropospheric columns respectively for 24/01/2003, 14/02/2003, 25/09/2003. d)e)f) corresponding maps issued from CHIMERE. Unity in 10<sup>15</sup> molecules/cm<sup>3</sup>.

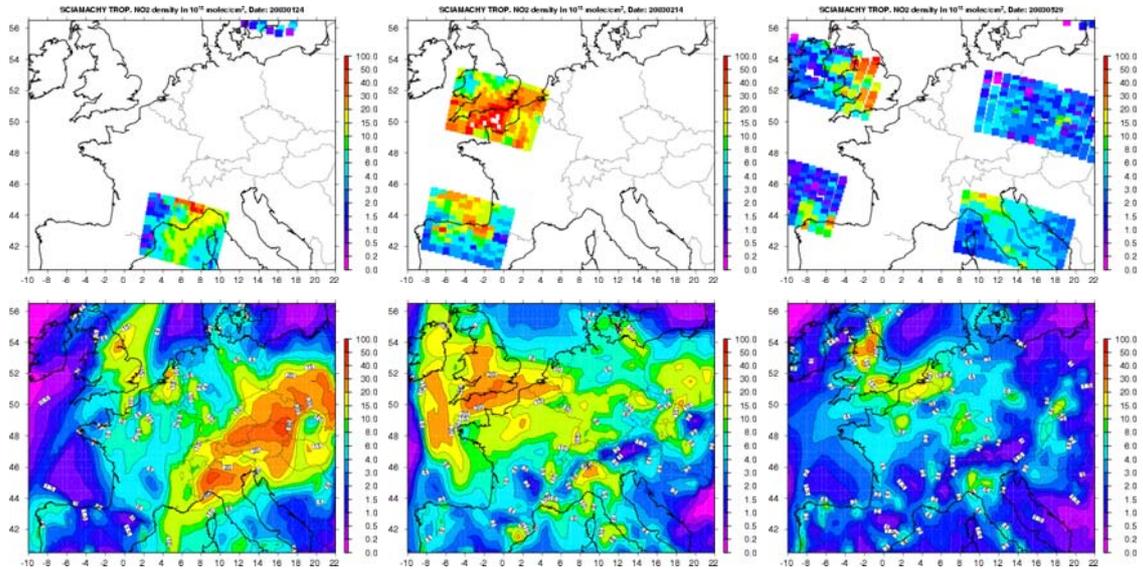
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Figure 3.2 shows that CHIMERE outputs and SCIAMACHY measurements are consistent in monthly averages. Only cloud free pixels are presented. The model is able to simulate the observed NO<sub>2</sub> patterns on the continent but also over the sea (Figures 3.2a and 3.2d). Observations over sea contain new information. In Figures 3.2a and Figure3.2d, two NO<sub>2</sub> plumes are visible: one between France and England that is mostly due to the pollution in the south-east of England and that of Benelux (this situation happens on 14/02/2003, Figures 3.3b and 3.3e.), the other one is located in the north-east of England, coming from The Netherlands.

Statistic values are calculated for a comparison between NO<sub>2</sub> tropospheric columns retrieved from SCIAMACHY and that from CHIMERE continental simulations. The table below details the statistic values of the comparison of daily averages for each month in 2003. The correlation coefficient shows the spatial consistency in the data. N(obs) corresponds to the number of observation data. There was no data in November. The unity is 10<sup>15</sup> molec./cm<sup>3</sup>

Date	Bias	RMS	Correlation	Mean_obs	Mean_model	N(obs)
January	2.4	4.0	0.75	5.4	7.8	709
February	0.5	5.1	0.80	8.1	8.6	1311
March	1.1	3.2	0.70	3.4	4.5	2347
April	-1.4	4.0	0.72	5.5	4.2	2635
May	-0.7	2.6	0.71	3.5	2.7	2797
June	-0.6	2.2	0.69	3.0	2.4	4519
July	0.1	2.1	0.71	2.8	2.8	3334
August	-0.2	1.7	0.72	2.8	2.6	2492
September	0.7	2.0	0.80	2.9	3.6	3513
October	1.8	3.0	0.74	3.0	4.9	2651
December	2.6	4.9	0.65	4.7	7.3	492
All data	0.2	2.9	0.73	3.6	3.8	26800

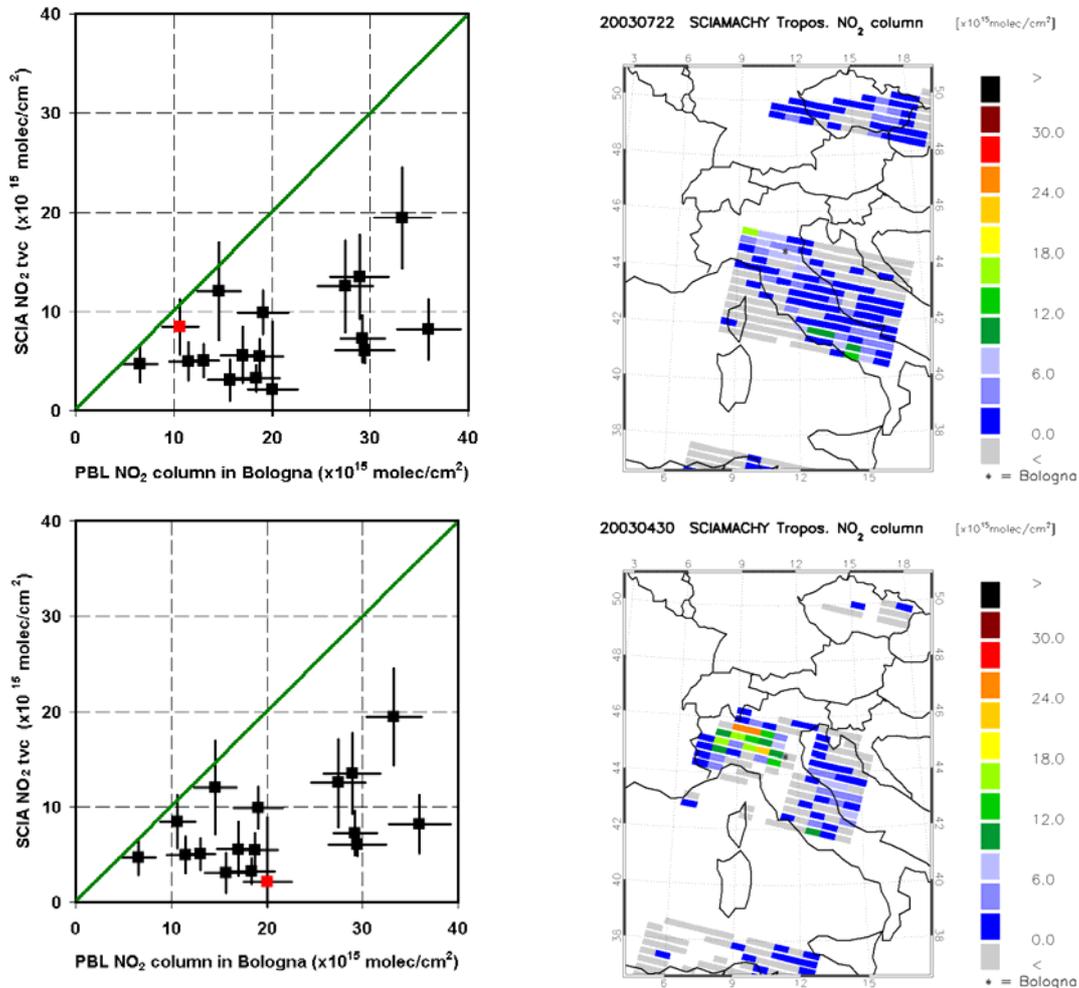
Figure 3.3 illustrates a comparison on daily basis, showing a very good agreement of the data. This last comparison demonstrates the ability of SCIAMACHY data to follow air pollution events and to point out problems in emission inventories. In this case, we didn't use a cloud mask (i.e. all of the pixels are presented). In this way, also plumes above the clouds can be seen, which is the case on 14 February 2003 over the Atlantic ocean (Figure 3.3b). This shows that by using a cloud mask, essential information may be lost.



**Figure 3.3** Comparisons between daily NO<sub>2</sub> tropospheric columns retrieved from SCIAMACHY and that of issued from CHIMERE continental simulations. a)b)c) mean SCIAMACHY NO<sub>2</sub> tropospheric columns respectively for 24/01/2003, 14/02/2003, 25/09/2003. d)e)f) corresponding maps issued from CHIMERE. Unity in 10<sup>15</sup> molecules/cm<sup>3</sup>.

## 5.4 Intercomparison with ground-based DOAS

Here we considered measurements performed from March to September 2003. The covered period involves large natural and human induced variation in tropospheric NO<sub>2</sub> and represents thus a good test for the intercomparison. In figure 4.1.2.2 a scattered plot of the selected simultaneous measurements between SCIAMACHY and GACOD spectrometers is shown on the left part.



**Figure 4.2.1:** Scatter plot of SCIAMACHY NO<sub>2</sub> tropospheric column versus the NO<sub>2</sub> PBL column retrieved in the Bologna area from March to September 2003 (left part). Red squares refer to the values observed on the July 22<sup>nd</sup> (upper plot) and April 30<sup>th</sup> for which the respective SCIAMACHY observations in the all Po valley area is reported on the right part of the plot.

All the data points lay in the part of NO<sub>2</sub>\_PBL > SCIA\_NO<sub>2</sub> except three days for which the NO<sub>2</sub> tropospheric column measurements are in agreements within the error bars. The main reason for this behaviour has been explained in Petritoli et al. [2004] that is the NO<sub>2</sub>\_PBL column is observed near the pollution sources and thus should represent a sort of the maximum concentration that can be present within the SCIAMACHY pixel at the overpass. When tropospheric NO<sub>2</sub> is well mixed in the area of the SCIAMACHY pixel (the case July 22<sup>nd</sup> for example in the upper part of figure 4.1.2.2) the agreement between the observations from the two instruments is good but if this is not the case (April 30<sup>th</sup> for example, in the lower part of figure 4.1.2.2) SCIAMACHY measures a sort of average of the NO<sub>2</sub> column distribution within its field of view. This causes the difference between the two observations.

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## 5.5 Recommendations for product validation

In order to make a proper comparison between ground-based measurements and satellite retrievals, knowledge on the actual tropospheric NO<sub>2</sub> profile and the horizontal distribution on ground pixel scale is needed. In addition, the assumptions used in the retrieval should be verified, with respect to clouds, aerosol, stratospheric NO<sub>2</sub> and albedo. Validation measurements therefore ideally should be done with several independent NO<sub>2</sub> measuring devices (in-situ vs remote, column vs profile) and with additional instrumentation to measure relevant atmospheric conditions. The use of high resolution models should complete our knowledge on stratospheric and tropospheric profiles, temporal variations due to transport and (photo)chemistry, and should aid with the conversion from point to pixel measurement.

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