Retrieval of MetOp-A/IASI CO profiles and validation with MOZAIC data

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Abstract

The IASI nadir looking thermal infrared sounder onboard MetOp-A enables the monitoring of atmospheric constituents on a global scale. This paper presents a quality assessment of IASI CO profiles retrieved by the two different retrieval algorithms SOFRID and FORLI, by an intercomparison with airborne in-situ CO profiles from the MOZAIC program for the 2008–2009 period. Lower (surface-480 hPa) and upper tropospheric partial column (480–225 hPa) comparisons as well as profile comparisons are made. The retrieval errors of the IASI products are less than 21% in the lower troposphere and less than 10% in the upper troposphere. A statistical analysis shows similar correlation coefficients for the two retrieval algorithms and smoothed MOZAIC of $r \sim 0.8$ and $r \sim 0.7$ in the lower and upper troposphere respectively. Comparison with smoothed MOZAIC data of the temporal variation of the CO profiles at the airports of Frankfurt and Windhoek demonstrates that the IASI products are able to capture the seasonal variability at these sites. At Frankfurt SOFRID (respectively (resp.) FORLI) is positively biased by 10.5% (resp. 13.0%) compared to smoothed MOZAIC in the upper (resp. lower) troposphere, and the limited sensitivity of the IASI instrument to the boundary layer when thermal contrast is low is identified. At Windhoek, the impact of the vegetation fires in Southern Africa from July to November is captured by both SOFRID and FORLI, with an overestimation of the CO background values (resp. fire maxima) by SOFRID (resp. FORLI) by 12.8% (resp. $\sim 10\%$). Profile comparisons at Frankfurt and Windhoek show that the largest discrepancies are found between the two IASI products and MOZAIC for the nighttime retrievals.

1 Introduction

Carbon monoxide (CO) is primarily produced at the surface by biomass burning and fossil fuel combustion. In the atmosphere, oxidation of methane (CH$_4$) and non-methane hydrocarbons (NMHC), like isoprene, account for nearly half of the global
CO production (Brenninkmeijer and Novelli, 2003). Sources of secondary importance include emission by vegetation and oceans. The removal of CO is largely (for as much as 90\%) determined by the reaction with the hydroxyl (OH) radical. The remaining 10\% is removed by soils (Brenninkmeijer and Novelli, 2003).

Although not considered a greenhouse gas, CO has a strong indirect effect on the radiation balance of the atmosphere. Through its reaction with OH, CO largely determines the oxidizing capacity of the atmosphere, thereby having a strong impact on the lifetimes of long-lived trace gases (Bergamaschi et al., 2000; Shindell et al., 2009). Furthermore, being involved in the production and destruction of ozone (O\textsubscript{3}), O\textsubscript{3}-CO correlation studies can provide important insight into the photochemical origin of air masses (Parrish et al., 1993; Chin et al., 1994; Voulgarakis et al., 2011). In addition, having a lifetime in the troposphere of 1–2 months, CO is an excellent tracer to study the long-range transport of pollution (Logan et al., 1981; Forster et al., 2001).

Thermal infrared (TIR) nadir sounders can provide information about the vertical distribution of tropospheric trace gases with a high spatial resolution. IASI, the Infrared Atmospheric Sounding Interferometer, onboard MetOp-A, is dedicated to long-term global scale monitoring of a series of key atmospheric species, with unprecedented spatial sampling and coverage (Clerbaux et al., 2009). Laboratoire d’Aérologie (LA) and LATMOS/Université Libre de Bruxelles (ULB) deliver profiles of atmospheric CO based on two different retrieval algorithms: the SOftware for a Fast Retrieval of IASI Data (SOFRID), and the Fast Optimal Retrievals on Layers for IASI (FORLI). This paper provides a comparison of the CO products obtained by the two algorithms with high precision airborne in-situ CO observations from the Measurements of OZone, water vapour, carbon monoxide and nitrogen oxides by Airbus In-service airCraft (MOZAIC) program (Marenco et al., 1998). As the FORLI CO products will be operationally distributed in 2013 through the EUMETCast system (under the O3MSAF umbrella) this paper is an important step to evaluate the quality of the CO profile data before widespread distribution.

The SOFRID algorithm was developed at LA for the fast retrieval of O\textsubscript{3} and CO pro-
files on a global scale from IASI spectra. Barret et al. (2011) showed that tropospheric SOFRID O₃ profiles can be retrieved with almost 2 independent pieces of information, the tropospheric ozone column (surface-225 hPa) and the upper tropospheric-lower stratospheric (UTLS) column (225–70 hPa), with errors smaller than 20%. Given the great value of coexistent observations of O₃ and CO on a global scale, SOFRID has been expanded to allow the retrieval of CO profiles. Our goal is to describe the SOFRID CO retrieval in detail and assess the quality of the retrieved profiles through a comparison with MOZAIC aircraft data.

The FORLI algorithm (Hurtmans et al., 2012) provides daily retrievals of CO, O₃ and HNO₃. The FORLI CO product comprises CO total columns, partial columns, profiles, quality flags and the corresponding averaging kernel vector or matrix. It has undergone a series of quality assessments. George et al. (2009) evaluated global distributions of FORLI CO total columns with the nadir-looking TIR instruments MOPITT, AIRS and TES. A qualitative analysis of the FORLI retrieved CO profiles was made by Turquety et al. (2009) by analysing the performance of the CO retrievals during extreme fire events. Pommier et al. (2010) compared total columns, 0–5 km partial columns and profiles with collocated aircraft observations in the Arctic during the spring and summer 2008 POLARCAT campaigns. This study complements the previous works by validation of FORLI CO profiles against the MOZAIC 2008–2009 dataset.

The paper is structured as follows: In Sect. 2 the two algorithms developed to retrieve CO profiles from IASI radiances are introduced. Section 3 presents the MOZAIC reference data set used in the validation study and in Sect. 4 the validation methodology and results are discussed. The conclusion is given in Sect. 5.
2 Retrieval from MetOp-A/IASI radiances

2.1 IASI

IASI is one of the 12 instruments onboard MetOp-A, the first of a series of successive polar-orbiting satellites. Launched in October 2006, IASI is a Fourier Transform Spectrometer (FTS), designed to measure the infrared (IR) spectrum emitted by the Earth and the atmosphere, from 645 to 2760 cm\(^{-1}\), with a spectral resolution of 0.5 cm\(^{-1}\) after apodisation. As compared to other TIR sounders in orbit, IASI offers a large and continuous spectral coverage of the IR region at a medium spectral resolution (Clerbaux et al., 2009). It provides global Earth coverage twice a day, with an overpass time at \(\sim 09:30\) and \(\sim 21:30\) LT (local time) and a nadir spatial resolution of 50 km x 50 km, composed of 2x2 circular pixels, each corresponding to a 12 km diameter footprint on the ground at nadir (Clerbaux et al. 2009).

IASI’s objectives are the delivery of highly accurate meteorological products to help improve operational weather predictions, as well as the monitoring of reactive gases on a global scale.

2.2 SOFRID

The SOFRID algorithm aims at a fast retrieval of global O\(_3\) and CO from MetOp/IASI radiances. It is based on the RTTOV fast radiative transfer model coupled to a 1D-Var retrieval scheme. The retrieval of SOFRID O\(_3\) profiles is described in detail in Barret et al. (2011) and a validation study with ozonesondes is given by Dufour et al. (2012). For this validation study SOFRID v2.0 was used.

The UKMO 1D-Var algorithm (Pavelin et al., 2008) is a retrieval code for nadir-viewing passive sounding satellites, developed at UK Met Office within the context of the EU-METSAT Satellite Application Facility for Numerical Weather Prediction (NWP SAF). It is based on the optimal estimation method (OEM) described by Rodgers (2000). In the OEM an optimal solution is found given the measurement, a simulation of the observed...
radiance, the a priori information and associated errors. Hence, an accurate radiative transfer model and a representative set of a priori assumptions and their uncertainties need to be provided.

The radiative transfer calculations are performed with the RTTOV-9.3 fast radiative transfer model developed for the meteorological community within the NWP-SAF. The RTTOV algorithm is described in detail in Saunders et al. (1999) and Matricardi et al. (2004). The overall accuracy of RTTOV has been addressed using IASI data in Matricardi (2009). The RTTOV software is available free of charge on request from NWP-SAF at http://research.metoffice.gov.uk/research/interproj/nwpsaf/rtm/rtm/rttov9.html. General documentation about RTTOV is provided at this website and detailed information about the IASI radiative transfer in RTTOV is provided in Technical Memoranda (cited in the above mentioned publications) at the ECMWF website (http://www.ecmwf.int/publications/library/do/references/list/14).

RTTOV is a regression model where optical depths are parameterised by a set of predefined profile dependent-predictors, which are functions of temperature, pressure, absorber amount and viewing angle (Matricardi et al., 2004). The RTTOV regression coefficients are derived from accurate line-by-line calculations performed with the line-by-line radiative transfer model (Clough et al., 2005) using molecular data from the HITRAN 2004 spectroscopic database (Rothman et al., 2005). The land emissivity is calculated with the RTTOV UWiremis IR land surface emissivity module (Borbas and Ruston, 2010). The surface pressure, temperature and humidity profiles are taken from the operational MetOp-A Level 2 (L2) IASI product (Schlüssel et al., 2005). Surface temperature, skin temperature and wind speed are provided by the European Centre for Medium-range Weather Forecasts (ECMWF).

SOFRID CO retrievals are calculated from radiances in the 2143–2181 cm\(^{-1}\) spectral window and are retrieved on 43 fixed pressure levels from the surface up to 0.1 hPa. The covariance of the measurement error is characterized by a 5-band matrix (i.e. a pentadiagonal matrix, which is representative for apodised observations) with a radiometric noise set to 1.41 \times 10^{-8} \text{W(cm}^2\text{srcm}^{-1})^{-1}. This value is almost a factor 10
higher than the estimated radiometric noise in this spectral region (Clerbaux et al., 2009), to roughly take uncertainties in fixed parameters (such as temperature profile, spectroscopic parameters and surface emissivity) into account.

The a priori information was build from a 2 yr dataset of MOZAIC aircraft CO profiles, complemented by Aura/MLS profiles at altitudes higher than the aircraft altitude. A fixed global a priori profile \( x_a \) is used for all the retrievals, shown in the top left panel of Fig. 1. Its variability is given in the top middle panel, calculated from the square root of the diagonal of the a priori covariance matrix, given in the upper right panel. We see the highest variability in the lowermost layers of the atmosphere, due to localised fossil fuel and biomass burning, with an a priori variability of \( \sim 70\% \) at the surface decreasing to 50% near 800 hPa (\( \sim 1.5 \) km) and to 20–30% for pressures lower than 600 hPa (\( \sim 4 \) km).

In this spectral range, H\(_2\)O is the main interfering gas, while N\(_2\)O contributes to the signal at higher wavenumbers. To account for their contributions, both profiles are retrieved simultaneously with CO, as well as surface temperature.

A cloud filtering is applied according to Clerbaux et al. (2009), based on the AVHRR-derived fractional cloud cover from the IASI EUMETSAT L2 products. Only pixels with a cloud fraction between 0 and 25% are processed. In addition, the brightness temperature at the 11 \( \mu \)m (BT11) and 12 \( \mu \)m (BT12) IASI channels are compared to the ECWMF skin temperature. If either the difference between BT12 and the ECMWF skin temperature is larger than 10 K or if BT11 and BT12 are differing more than \( \pm 10 \) K, the pixel is considered as contaminated and eliminated.

2.3 FORLI

The FORLI algorithm has been developed at the Université Libre de Bruxelles (ULB). It uses pre-calculated look-up tables of absorbance cross sections at various pressures and temperatures instead of the more time consuming line-by-bine calculations, and the optimal estimation for the inverse scheme (Hurtmans et al., 2012). CO profiles are calculated on 19 fixed layers from the surface up to the top of the atmosphere (set to 60 km), corresponding to 18 equidistant layers of 1 km from 0 km to 18 km, and a top
layer between 18 and 60 km.

FORLI CO profiles are retrieved from radiances in the spectral range 2143–2181 cm\(^{-1}\) (same interval as SOFRID). A diagonal measurement error covariance matrix was chosen, with an average measurement noise corresponding to \(1.8 \times 10^{-9} \text{ W} (\text{cm}^2 \text{ sr cm}^{-1})^{-1}\), the estimated radiometric noise in this spectral region (Clerbaux et al., 2009). The operational MetOp-A L2 temperature and humidity profiles are used for the radiative transfer calculations. To take into account the wavenumber dependency of the surface emissivity, a climatology built from several years of IASI data (Zhou et al., 2011) is used. In the few cases there are missing values in the Zhou et al. (2011) climatology, the MODIS/TERRA climatology (Wan, 2008) is used instead.

The a priori information was constructed from aircraft profiles from the MOZAIC program, complemented by ACE-FTS (Clerbaux et al., 2005) profiles at the highest altitudes (upper troposphere and above), as well as distributions from the LMDz-INCA (Hauglustaine et al., 2004) global chemistry transport model. The bottom panels of Fig. 1 display the a priori profile, its associated variability and covariance matrix. Compared to SOFRID we see smaller volume mixing ratios (vmrs) near the surface for the a priori profile, and a steeper descending profile in the upper troposphere. FORLI presents larger a priori variability in the upper troposphere (\(\sim 35\%\)) and in the UTLS (\(\sim 45\%\)). Surface temperature, CO\(_2\) and N\(_2\)O total columns, and a H\(_2\)O profile are retrieved in addition to the CO profile.

For profiles in the Arctic, Pommier et al. (2010) found differences between FORLI CO and smoothed in situ profiles lower than 17% in spring, and stated that FORLI overestimates the CO concentrations compared to the in situ data in summer where differences can reach up to 20% below 8 km for polluted cases. George et al. (2009) found total column discrepancies of about 7% between IASI and other satellite instruments measuring CO (for the NH and equatorial region), going up to 17% when high CO concentrations are found e.g. during fire events.

The FORLI CO products are publicly available via the Ether (http://ether.ipsl.jussieu.fr/) database. The data is updated every day with a delay of one month and includes the
twice daily distributions of CO total columns since October 2007 along with averaging kernels, associated errors, and quality flags.

For the comparison with MOZAIC data, only the more reliable pixels were taken into account using the quality flags (super quality flag equal to 0). For more information see http://ether.ipsl.jussieu.fr/ether/pubipsl/iasi_CO_uk.jsp.

3 MOZAIC

The MOZAIC program provides routine measurements of reactive gases on long distance commercial aircraft (Marenco et al., 1998). Since 1994, five airliners have been equipped with O$_3$ and relative humidity instruments, and a CO analyser was successfully added in December 2001. One aircraft carries an additional instrument to measure total odd nitrogen (NO$_y$) since 2001 (Volz-Thomas et al., 2005). With a measurement precision of ±5 ppbv for a 30 s integration time, the CO analyser has a horizontal resolution of about 7 km and a vertical resolution of about 300 m during ascents and descents (Nedelec et al., 2003). The MOZAIC data is freely accessible for scientific use at http://www.iagos.org. Since 2009, the MOZAIC program has been expanded, implementing other commercial in-service aircraft observation programs such as CARIBIC (http://www.caribic-atmospheric.com) into the IAGOS Research Infrastructure (In-service Aircraft for a Global Observing System). In the following however, for simplicity, we will continue to refer to the MOZAIC data.

For the validation of IASI CO, all MOZAIC observations taken at take-off and landing in 2008–2009 were taken into account. The results of the statistical analysis are given in Sect. 4.3. For most of the 30 airports sampled by MOZAIC in 2008–2009 the number of coincidences with IASI data comprised between 5 and 60 and was insufficient to sample seasonal variations. The two airports, Frankfurt, Germany (50.1° N, 8.7° E) and Windhoek, Namibia (22.6° S, 17.1° E) are sampled with a high frequency during the 2008-2009 period, and give us the opportunity to study the seasonal cycle at these geographical locations. Therefore a comparative study of the temporal behavior of the
IASI data and the MOZAIC data recorded during take-off and landing at these two airports is investigated in Sect. 4.4.

4 Validation

4.1 Methodology and information content

Pixels were selected within \( \pm 1^\circ \) in latitude and longitude from the MOZAIC coordinates. The quality assessment is based on the comparison of partial columns and a distinction is made between daytime and nighttime IASI retrievals. The averaging kernel matrix \( \mathbf{A} \) is an important by-product of the retrieval, which characterizes the sensitivity of the retrieved profile to the true profile. The rows of \( \mathbf{A} \) are called the averaging kernels and are peaked functions. For each retrieval level, the width of the averaging kernels corresponds to the altitude range contributing to the retrieved value and therefore gives an indication of the height resolution. The DFS (Degrees of Freedom for Signal) is calculated from the trace of \( \mathbf{A} \) and quantifies the number of independent pieces of information on the vertical for each measurement. Calculation of the DFS, for all coincidences with MOZAIC data, gives values which vary between 1.4 and 2.3 for SOFRID and between 1.1 and 2.1 for FORLI. This shows that nearly 2 independent pieces of information can be deduced from the retrieved SOFRID and FORLI CO profiles in the best cases.

Daytime and nighttime averaging kernels of SOFRID and FORLI are shown for Frankfurt (Fig. 2) and Windhoek (Fig. 3). Based on the shape of the averaging kernels, a lower (surface-480 hPa) and upper (480–225 hPa) tropospheric partial columns were defined. The upper limit of 225 hPa was chosen to be within the boundary level of the aircraft profiles. The partial column averaging kernels for the lower and upper troposphere are given in black and were calculated according to Deeter (2002). At the two locations, we see differences between daytime and nighttime partial column averaging kernels: for nighttime measurements the vertical resolution (width of the av-
eraging kernels) is lower and the maximum sensitivity is shifted upwards for the lower tropospheric averaging kernels. Especially at Frankfurt, FORLI daytime and nighttime averaging kernels show strong differences. The sensitivity near the surface is higher during the day. The lower and upper tropospheric nighttime averaging kernels are strongly overlapping, meaning that the lower and upper tropospheric information is correlated. For SOFRID the differences between daytime and nighttime averaging kernels are smaller. At both locations, the maximum sensitivity of the nighttime averaging kernels in the upper troposphere is shifted towards lower altitudes. The SOFRID lower tropospheric nighttime averaging kernel at Windhoek shows an irregularity in the upper troposphere.

4.2 Global comparisons

Global maps of lower (surface-480 hPa) and upper (480–225 hPa) tropospheric CO columns retrieved with SOFRID and FORLI are displayed in Fig. 4. Daily means are shown for 1 January and 1 July 2008, characterizing the winter and summer seasons.

In general the same features are captured by the two algorithms. The four top figures provide a boreal winter picture, with elevated CO values in the lower troposphere over West Africa, where biomass burning fires are active from October through January in the Sahel region. This CO-rich air is convectively lifted to the upper troposphere where it disperses over the African tropics towards the east coast of South America and the South Arabian peninsula (Edwards et al., 2003). In the lower troposphere, higher CO concentrations are found by FORLI compared to SOFRID for these regions affected by biomass burning. Over South-East Asia, IASI detects highly polluted air-masses that are uplifted and advected along the North-East Asian coast. In these pollution cases higher CO columns are retrieved by FORLI than by SOFRID. In the upper troposphere, higher CO background values are observed by SOFRID at midlatitudes.

In the bottom four figures, visualising the CO distributions on 1 July 2008, we see a shift of the biomass burning region from West Africa to Central Africa, featuring the beginning of the vegetation burning season, which lasts up to November. Both algo-
rithms capture the displacement of a large plume of polluted air originating from North-East Asia which is rapidly transported over the Northern Pacific towards the Western Canadian coast. FORLI shows a band of elevated lower tropospheric CO values over Northern Europe and North Russia, which is not observed by SOFRID. Similar signatures are found on 1 January 2008. Again, higher upper tropospheric CO background values are observed by SOFRID at midlatitudes.

In conclusion, SOFRID and FORLI show similar global distributions. FORLI retrieves higher CO concentrations in the lower troposphere for regions affected by biomass or fossil fuel burning, and lower CO background values in the midlatitudinal upper troposphere, compared to SOFRID.

4.3 Correlations

Table 1 presents the results of a linear regression analysis between the two IASI retrieval products and MOZAIC partial columns for 980 coincident observations taken at 30 airports in 2008 and 2009. The MOZAIC profiles were completed by coincident profiles from Aura/MLS at altitudes above the cruise altitude of the aircraft, to account for the missing altitudes where IASI is still sensitive. To account for the different resolution between the satellite and high resolution in-situ data, a smoothing was applied to the MOZAIC profiles $x_{MOZ}$ by the IASI averaging kernels:

$$\hat{x}_{MOZ} = x_a + A \cdot (x_{MOZ} - x_a)$$

where $\hat{x}_{MOZ}$ is the smoothed or convolved MOZAIC profile and $x_a$ and $A$ are the a priori profile and averaging kernel matrix of the IASI retrieval (SOFRID or FORLI).

Table 1 gives the slope ($a$), intercept ($b$) and correlation coefficient ($r$) of the comparison of IASI partial columns with smoothed MOZAIC partial columns. In brackets results of the comparison with partial columns calculated from the raw MOZAIC profiles are given. As expected, we see an improvement after smoothing of the in-situ data with the IASI averaging kernels. A high correlation is found in the lower troposphere (surface-480 hPa), with $r \sim 0.8$ for both retrievals. In the upper troposphere (480–225 hPa) the
correlation coefficients are $\sim 0.7$. For both algorithms, we see a slight improvement for daytime compared to nighttime retrievals. The slope and intercept is 1 and near 0 for daytime lower tropospheric FORLI and smoothed MOZAIC, and 0.76 and 0.32 for SOFRID.

The errors on the lower and upper tropospheric partial column have been estimated for SOFRID and FORLI. Here the retrieval error is presented, which is the sum of the smoothing error and the measurement error. The smoothing error is the dominant source of error for CO retrievals in the TIR (Barret et al., 2005; Worden et al., 2004) and accounts for the low vertical resolution of the retrievals. For SOFRID, the $1-\sigma$ retrieval errors range between 10.7 and 20.5% for the lower troposphere and between 6.5 and 9.5% for the upper troposphere. FORLI retrieval errors are slightly lower and range between 7.7 and 19.1% and 5.3 and 8.3% for the lower and upper troposphere.

### 4.4 Temporal variation

Figures 5 and 6 present time series of lower and upper tropospheric columns at the airports of Frankfurt and Windhoek, respectively. The IASI data (red) are compared to the raw (gray) and smoothed MOZAIC (black) data at these two sites. The mean ($\mu$) of the relative difference between smoothed MOZAIC and IASI partial columns (blue lines in Figs. 5 and 6) and the root-mean-square of the difference (rmsd) are summarized in Table 2. The IASI $1-\sigma$ measurement ($S_{\text{meas}}$) and retrieval error ($S_{\text{retr}}$) are listed as well. The rmsd gives an estimate of the error of the (aircraft and retrieved) partial columns and should be compared to the calculated IASI error budget. Since the smoothed MOZAIC partial columns are compared, the smoothing error has not to be considered (Haefele, 2009), but only the measurement error and errors introduced by uncertainties in the fixed parameters of the radiative transfer model. Note that for SOFRID a conservative value for the radiometric noise for the retrieval was used, to include uncertainties in temperature, spectroscopy and emissivity (see Sect. 2.2). For FORLI, the radiometric noise used for the retrievals is close to the actual IASI radiometric noise leading to slightly lower measurement errors.
At Frankfurt (Fig. 5), both products capture the same seasonal variability as the aircraft observations, but underestimate the maxima in winter-spring in the lower troposphere. However, we see a great improvement after smoothing of the MOZAIC data, clearly visible for the 2009 winter-spring period. This is linked to the insensitivity of IASI to boundary layer (BL) pollution in winter-spring when the BL height and the thermal contrasts are low (see the discussion below on Figs. 7 and 8). We find that SOFRID lower tropospheric CO is biased high compared to smoothed MOZAIC by 3.6%. Note how SOFRID captures the same variability as MOZAIC on short timescales from January to September 2009. FORLI overestimates the lower tropospheric CO concentration relative to smoothed MOZAIC with a mean positive bias of 13.0%. Furthermore, differences larger than 30% occur throughout the studied period. In the upper troposphere, FORLI and smoothed MOZAIC are in close agreement, with alternating slightly higher and lower CO concentrations, leading to a mean relative difference of 0.9%. SOFRID underestimates the seasonal variability in the upper troposphere and shows overall a positive bias of 10.5% relative to MOZAIC. The rmsd between smoothed MOZAIC and IASI is larger for the FORLI product (22.4%) compared to SOFRID (14.2%) in the lower troposphere and is comparable in the upper troposphere (∼16%). These values are higher than the IASI measurement error estimated from the theoretical analyses, especially in the upper troposphere. This is not completely surprising as several error sources are not taken into account in the present study. First, one has to consider that the rmsd includes both the error on the MOZAIC and IASI partial columns. Second, even if the coincidence criteria are chosen optimally, the difference of sampling between the satellite and the aircraft is a source of random difference between both. Third, as previously explained, a rough estimate of the uncertainties introduced by the model parameters was made (or not considered for FORLI), which probably leads to an underestimation of these uncertainties. Finally, the use of a too low (resp. too high) radiometric noise (a priori variability) may result in an artificially high variability in the retrievals and therefore an excessive rmsd. Nevertheless, the cause of the discrepancies between error estimates and rmsd need to be further in-
vestigated. Note, the measurement errors are roughly half of the retrieval errors (Table 2) showing that the smoothing error is by far the largest source of random error.

At Windhoek (Fig. 6), for both algorithms, we see a very good reproduction of the variability resulting from the vegetation fires in Southern Africa from August to November. In the lower troposphere, very close agreement is found between SOFRID and smoothed MOZAIC for the fire emission peaks, but we see an overestimation of the background CO values in December–July, leading to a mean relative difference of −12.8%. The larger overestimation of lower tropospheric CO at Windhoek than at Frankfurt can be explained by the low background concentrations at Windhoek throughout the year except during the short vegetation burning seasons. The fact that the MOZAIC data at Windhoek are not covering the period after August 2009 accentuates the low concentration bias in the data because it implies a single vegetation burning season. Lower tropospheric FORLI has a small bias of −1.6% relative to smoothed MOZAIC, although higher relative differences are observed for the fire maxima of ∼10%. The analysis of the CO profiles presented later in this section will help to understand the lower tropospheric bias difference between Frankfurt and Windhoek for FORLI. In the upper troposphere, FORLI is biased low relative to both raw and smoothed MOZAIC, most pronounced in 2008, giving a mean relative difference of 10.2%. Upper tropospheric SOFRID is biased high compared to smoothed MOZAIC by 3.7%. Note the great improvement after smoothing for the third fire maxima in October 2008, where SOFRID overestimates the CO concentration compared to raw MOZAIC (the same holds for FORLI as well, if one would correct for the bias). In this case, a possible cause could be the contamination of upper tropospheric CO with lower tropospheric CO. As can be seen from Fig. 3, the averaging kernel of the upper tropospheric partial column (dashed black line) shows sensitivity to the lower troposphere. The extreme CO values found during the vegetation fire season, in combination with the high extension of the fire plumes (see discussion below) lead to this contamination effect. However, strong differences between the raw and smoothed MOZAIC data seem to be limited to this specific period. The rmsd is below 20% and 16% in the
lower and upper troposphere respectively. The rmsd is greatly reduced for FORLI in the lower troposphere compared to the rmsd at Frankfurt. Again, rmsd values are higher than the measurement errors with larger discrepancies in the upper than in the lower troposphere.

In order to produce a complete picture of the performance of both retrievals, time series and mean differences of MOZAIC and IASI CO profiles at Frankfurt and Windhoek are displayed in Figs. 7 and 8. IASI daytime and nighttime comparisons with raw and smoothed MOZAIC profiles are shown. It is worth noting that Figs. 7 and 8 clearly highlight the different pollution conditions we have at the two airports; Frankfurt, a region affected by BL pollution (typically below 800 hPa; Rio et al., 2010), and Windhoek, a region affected by biomass fire plumes in Southern Africa, which are injected to higher altitudes (up to ∼500 hPa; [Rio et al., 2010]).

At Frankfurt (Fig. 7), we see a confirmation of the earlier assumption that the high CO concentrations observed by MOZAIC correspond to local CO emissions only affecting the BL. This pollution is not detected by the IASI instrument in winter when thermal contrast and the BL are low, leading to relative differences between raw MOZAIC and SOFRID profiles up to 40% at the surface. After smoothing we see a much better agreement in the lower troposphere, with relative differences between smoothed MOZAIC and daytime SOFRID profiles of less than −3%. SOFRID nighttime retrievals underestimate the BL pollution and slightly overestimate the CO background concentrations leading to differences with smoothed MOZAIC ranging from +13% at the surface to −7.5% at 400 hPa. In the upper troposphere, SOFRID shows a rather flat distribution with a positive bias, as previously seen in Fig. 6.

FORLI retrieves well the BL pollution compared to raw MOZAIC, with the exception of the winter period due to the earlier explained limited sensitivity of IASI. Also, elevated CO values are retrieved by FORLI in July–August 2008 (most pronounced in the nighttime set), which are not observed in the raw MOZAIC data. The smoothed MOZAIC profiles demonstrate that the FORLI vertical resolution results in a diffusion of the raw MOZAIC BL CO concentrations to higher altitudes and leads to differences
ranging from more than −20% at the surface to 0% at 510 hPa between smoothed MOZAIC and FORLI daytime profiles (around −15% in the free troposphere for nighttime retrievals).

At Frankfurt, FORLI nighttime profiles are more smoothed over the lower troposphere than daytime retrievals. This difference results from the lower resolution for nighttime retrievals, as evidenced with Fig. 2 in Sect. 4.1.

At Windhoek, we can deduce from the raw MOZAIC profiles (Fig. 8 upper panels) that the CO emitted by the vegetation fires in Southern Africa mostly impacts the troposphere up to 400 hPa. During the fire periods, IASI retrieved profiles and MOZAIC smoothed profiles show high CO concentrations up to 225 hPa indicating a contamination by the fire emissions above 400 hPa.

Nighttime SOFRID retrievals underestimate the high CO concentrations in the low and free troposphere during the vegetation fire period and overestimate the low CO background values, leading to the overall positive bias estimated by the relative differences. The same kind of behaviour was found at Frankfurt indicating a smoothing of the extreme CO values by SOFRID nighttime retrievals larger than indicated by the MOZAIC smoothed data. The radiometric noise set conservatively to $1.41 \times 10^{-8} \text{W} (\text{cm}^2 \text{sr} \text{cm}^{-1})^{-1}$ may be too high resulting in a reduced retrieved variability. For FORLI, the bias profiles are similar at Windhoek and Frankfurt except that the large overestimation (up to 20%) of FORLI in the lowermost layers at Frankfurt is not observed at Windhoek (Figs. 7 and 8). This may result from the fact that Windhoek is located at $\sim 1700$ m a.s.l., above the altitude where the overestimation is the highest. Furthermore, most of the time (except during the vegetation burning season) the BL above Windhoek is less polluted than the BL above Frankfurt and FORLI has the tendency to overestimate the high rather than the low CO concentrations. These points highlighted by the profiles analysis partly explain the difference in biases for FORLI lower tropospheric CO between Frankfurt and Windhoek.

The negative bias of 10.0% previously identified for FORLI in the upper troposphere (Fig. 6), is seen here by the underestimation of the CO concentrations above 480 hPa.
compared to MOZAIC. This bias is more pronounced for the daytime compared to nighttime retrievals.

5 Conclusions

This study presented tropospheric CO profiles retrieved from IASI spectra by two different retrieval algorithms, SOFRID and FORLI. A quality assessment of the retrieved IASI CO products was given by a detailed comparison with airborne observations recorded at 30 airports in 2008–2009 within the MOZAIC program. A correlation study of the coincidences between MOZAIC and the two IASI products of lower (surface-480 hPa) and upper (480–225 hPa) tropospheric partial columns showed correlation coefficients of \( r \sim 0.8 \) and \( r \sim 0.7 \) respectively. In the lower troposphere, FORLI reproduced the amplitude of the variations of smoothed MOZAIC data better than SOFRID (slopes closer to 1). The variability of the MOZAIC smoothed data was slightly better captured by SOFRID, showing higher correlation coefficients. The retrieval error of the IASI products was estimated to be less than 21\% and less than 10\% for lower and upper tropospheric columns respectively, with slightly lower values for the FORLI retrieval.

The temporal variation of lower and upper tropospheric columns, as well as daytime and nighttime CO profiles, was investigated in detail at the two airports Frankfurt and Windhoek. During 2008–2009 these two airports are the only ones to have enough MOZAIC CO observations for a correct seasonal cycle sampling. Overall, both retrieval products showed close agreement with smoothed MOZAIC partial columns in terms of seasonal variability, especially in the lower troposphere. At Frankfurt, the pronounced smoothing of the MOZAIC profiles by the averaging kernels of SOFRID and FORLI in the winter-spring period, indicated the insensitivity of IASI to BL pollution when the thermal contrast is low.

SOFRID lower tropospheric columns were positively biased by 3.8\% at Frankfurt and 12.8\% at Windhoek. Profile comparisons demonstrated an overestimation of the
low CO background values and an underestimation of the high CO values by the nighttime SOFRID retrievals. This leads to a larger overestimation of lower tropospheric CO at Windhoek than at Frankfurt as Windhoek is characterized by low background concentrations with exception of the short vegetation burning season. In the upper troposphere, SOFRID was biased high by 10.5\% at Frankfurt but showed a better agreement with smoothed MOZAIC at Windhoek (biased high by 3.7\%).

FORLI lower tropospheric columns were positively biased (13.0\%) at Frankfurt. At Windhoek, a small positive bias of 1.6\% relative to smoothed MOZAIC was found with increased relative difference values for the fire maxima (\(\sim 10\%\)). A closer investigation of the profiles revealed that at Frankfurt, the polluted BL CO concentrations are smoothed to higher altitudes, most pronounced for the FORLI nighttime retrievals. In addition, an overestimation of the high CO concentrations at the lowermost altitudes by the daytime retrievals was observed. Windhoek is located at \(\sim 1700\) m a.s.l., above the altitude where FORLI overestimates CO, and has a clean BL most of the time. This partly explains the lower bias observed in the lower troposphere at Windhoek than at Frankfurt. In the upper troposphere, FORLI was biased low by 0.9\% and 10.0\% at Frankfurt and Windhoek respectively.

Daytime and nighttime profiles at Windhoek of both SOFRID and FORLI indicated signatures of lower tropospheric contamination in the upper troposphere. However, we found no explanation for the differences in biases by the IASI data between Frankfurt and Windhoek in the upper troposphere.

The rmsd values between IASI retrievals and MOZAIC are larger than could be expected from the estimated errors, especially in the upper troposphere. Possible causes for this discrepancy include underestimation of errors from uncertainties in fixed parameters, sampling errors, and a too strong constraint applied on the measurement during the retrievals. This problem will be addressed in future developments of the retrieval algorithms.

In conclusion, SOFRID and FORLI showed biases no higher than 13\% compared to the MOZAIC reference set and showed their ability to correctly reproduce the CO vari-

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ability in the lower and upper troposphere. Discrepancies found between the two IASI products and MOZAIC could in a large part be explained by the lower thermal contrast during nighttime, which leads to less vertically resolved nighttime measurements.

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Table 1. Slope \((a)\), intercept \((b)\) and correlation coefficients \((r)\) of the linear least squares fit of CO partial columns computed from MOZAIC profiles and IASI retrieved profiles (SOFRID – top, FORLI – bottom). Results are given for lower (surface-480 hPa) and upper (480–225 hPa) tropospheric partial columns of raw (brackets) and smoothed MOZAIC compared to daytime and nighttime IASI retrievals.

<table>
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<tr>
<th></th>
<th>SOFRID</th>
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<tr>
<td></td>
<td>(a)</td>
<td>(b)</td>
<td>(r)</td>
<td></td>
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<tr>
<td>surface-480 hPa</td>
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<td>0.76</td>
<td>(0.52)</td>
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<td></td>
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<td>0.57</td>
<td>(0.66)</td>
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<td>(0.30)</td>
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<td></td>
<td>(a)</td>
<td>(b)</td>
<td>(r)</td>
<td></td>
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<td>0.84</td>
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<tr>
<td>480–225 hPa</td>
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<tr>
<td></td>
<td>night</td>
<td>(0.31)</td>
<td>0.59</td>
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Fig. 1. For SOFRID (top panels) and FORLI (bottom panels): the a priori profile (left panel), the a priori variability (middle panel) and the a priori covariance matrix (right panel).
Fig. 2. SOFRID (left panel) and FORLI (right panel) averaging kernels (AK) (bottom x-axis, color lines) and normalised averaging kernels of partial columns (top x-axis, black solid line–surface–480 hPa – and black dashed line – 480–225 hPa), for a daytime (top panels) and nighttime (bottom panels) retrieval of a IASI pixel near Frankfurt (50.1° N, 8.7° E) on 28 May 2008. The nominal height of each averaging kernel is marked by the horizontal tick with corresponding colour.
Fig. 3. As Fig. 2 for Windhoek (22.6° S, 17.1° E) on 24 January 2008. Windhoek lies at an altitude ~1700 m hence the lower cut-off of the averaging kernels.
Fig. 4. Global plots of CO partial columns (surface-480 hPa and 480–225 hPa) retrieved with SOFRI D (left panels) and FORLI (right panels) for 1 January 2008 (top panels) and 1 July 2008 (bottom panels), representing the global CO distribution during two composite seasons. Shown here are daily means (average of the daytime and nighttime observations). The pixels are binned on a $1^\circ \times 1^\circ$ grid.
**Fig. 5.** Temporal variation of lower (surface-480 hPa) (top panels) and upper tropospheric (480–225 hPa) (bottom panels) partial columns at Frankfurt of MOZAIC versus SOFRID (left panels) and FORLI (right panels). IASI retrieved partial columns are given in red, MOZAIC partial columns in grey and MOZAIC data smoothed with the averaging kernels of the respective IASI algorithm (SOFRID left, FORLI right) in black. The pink vertical bars represent the IASI partial column retrieval error. The relative difference between smoothed MOZAIC and IASI (MOZAIC-IASI/((MOZAIC + IASI)/2), in percentage) is given below each figure in blue, with its mean ($\mu$) and root-mean-square (rmsd). The ochre contours represent the IASI measurement error. The data is smoothed by a 5-point moving average.
Table 2. CO partial columns computed from MOZAIC profiles and IASI retrieved profiles (SOFRID – top, FORLI – bottom). Results are given for lower (surface-480 hPa) and upper (480–225 hPa) tropospheric partial columns.

<table>
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<td>FORLI</td>
<td>SOFRID</td>
<td>FORLI</td>
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<tr>
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<td>µ</td>
<td>rmsd</td>
<td>S&lt;sub&gt;meas&lt;/sub&gt;</td>
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<td>12.0</td>
<td>2.1-3.9</td>
<td>5.3-7.7</td>
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Fig. 6. As in Fig. [5] for Windhoek. Note the different timescale (MOZAIC flights to Windhoek stopped in July 2009).
Fig. 7. Left panels: temporal variation of CO profiles at Frankfurt for the years 2008–2009, as observed by (from top to bottom panels) MOZAIC, daytime SOFRID, MOZAIC convolved with SOFRID daytime averaging kernels (AK), daytime FORLI and MOZAIC convolved with FORLI daytime AK. A 5-point moving average was applied. (middle) Normalised mean differences between MOZAIC and IASI profiles (MOZAIC-IASI/((MOZAIC + IASI)/2)) and standard deviation (σ), for daytime (grey) and nighttime (black) retrievals, in percentage. Right panels: as the 5 figures on the left, but for IASI nighttime retrievals. Note, the time series of the raw MOZAIC profiles at Frankfurt is presented twice (the top left and right panels are identical).
Fig. 8. As Fig. 7 for Windhoek from January 2008 to July 2009.