A process-oriented evaluation of CAMS reanalysis ozone during tropopause folds over Europe for the period 2003–2018

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Abstract. Tropopause folds are the key process underlying stratosphere-to-troposphere transport (STT) of ozone, thus, affecting tropospheric ozone levels and variability. In the present study we perform a process-oriented evaluation of Copernicus Atmosphere Monitoring Service (CAMS) reanalysis (CAMSRA) O_3 during folding events, over Europe and for the time period from 2003 to 2018. A 3-D labeling algorithm is applied to detect tropopause folds in CAMSRA, while ozonesonde data from
5 WOUDC (World Ozone and Ultraviolet Radiation Data Centre) and aircraft measurements from IAGOS (In-service Aircraft for a Global Observing System) are used for CAMSRA O_3 evaluation. The profiles of observed and CAMSRA O_3 concentrations indicate that CAMSRA reproduces the observed O_3 increases in the troposphere during the examined folding events. Nevertheless, at some of the examined sites, CAMSRA overestimates the observed O_3 concentrations, mostly at the upper portion of the observed increases, with a median fractional gross error (FGE) among the examined sites > 0.2 above 400 hPa.
10 The use of a control run without data assimilation, reveals that the aforementioned overestimation of CAMSRA O_3 arises from the data assimilation implementation. Overall, although data assimilation assists CAMSRA O_3 to follow the observed O_3 enhancements in the troposphere during the STT events, it introduces biases in the upper troposphere resulting in no clear quantitative improvement compared to the control run without data assimilation. Less biased assimilated O_3 products, with finer vertical resolution in the troposphere, in addition to higher IFS (Integrated Forecasting System) vertical resolution, are
15 expected to provide a better representation of O_3 variability during tropopause folds.

1 Introduction

Ozone has multiple roles in the Earth's troposphere, making it one of the most important trace gases. It is a major source of the OH radical which controls the oxidizing capacity of the troposphere, and it is also a short-lived climate forcer being an important greenhouse gas, especially in the upper troposphere and lower stratosphere. Near the surface ozone is a pollutant
20 detrimental to human health, crops, and ecosystems (Monks et al., 2015; Young et al., 2018). The Intergovernmental Panel on Climate Change (IPCC) Sixth Assessment Report (AR6) assessed that tropospheric ozone has increased since the mid-20th century by 30–70% across the Northern Hemisphere based on sparse historical surface/low altitude data (Gulev et al., 2021;

Szopa et al., 2021). The tropospheric ozone budget is controlled by chemical production and loss, by stratosphere-troposphere exchange (STE), and by deposition at the Earth's surface, whose magnitude can vary widely across chemistry climate models
25 (Young et al., 2018; Griffiths et al., 2021; Szopa et al., 2021). The net stratospheric influx results from STE processes, comprised of stratosphere-to-troposphere transport (STT) and troposphere-to-stratosphere transport (TST) (Stohl et al., 2003). The main mechanism for STT is tropopause folding (Stohl et al., 2003), which results in the downward transport of stratospheric ozone-rich air into the troposphere, a process known as stratospheric intrusion (Danielsen and Mohnen, 1977). Therefore, tropopause folding events affect tropospheric composition and in particular tropospheric ozone levels (Beekmann et al., 1997; Ott et al.,
30 2016; Cooper et al., 2005; Tarasick et al., 2019), especially in regions that are known to be hot spots of fold activity (Zanis et al., 2014; Akritidis et al., 2016; Ojha et al., 2017). Occasionally, during deep and intense folding events, stratospheric air is transported down to the lower troposphere or even to the planetary boundary layer leading to changes in tropospheric and surface ozone concentrations (Langford et al., 2009; Lin et al., 2015; Knowland et al., 2017). Model projections suggested that under a changing climate tropopause folds will be associated with both future increases and interannual variability in ozone
35 STT (Akritidis et al., 2019).

The spatial and temporal characteristics of tropopause folds occurrence around the globe have been the subject of study in recent years, suggesting the jet stream location, intensity, and seasonality as their main drivers (Elbern et al., 1998; Sprenger et al., 2003; Škerlak et al., 2014; Akritidis et al., 2021). Regarding the broader European region, the summertime Eastern Mediterranean is a well-known hot spot of fold activity (Tyrlis et al., 2014; Akritidis et al., 2016) resulting from the interaction
40 of the subtropical jet stream and the South Asian Monsoon (Tyrlis et al., 2014), while further north folds occur in the vicinity of cyclones (Reutter et al., 2015; Antonescu et al., 2013; Knowland et al., 2015). During the past two decades several studies have explored the impact of stratospheric intrusions on tropospheric ozone levels and variability over Europe (Stohl et al., 2000; Cristofanelli et al., 2006; Trickl et al., 2020), as well as the quality of their forecast (Zanis et al., 2003; Trickl et al., 2010; Akritidis et al., 2018).

45 Nowadays, a comprehensive framework to study the contribution of stratospheric intrusions to tropospheric ozone are atmospheric composition reanalysis products that provide global meteorological and ozone data in relatively high spatial and temporal resolution. Yet, before estimating the impact of STT events on tropospheric ozone, a process-oriented evaluation of the reanalysis product during such events is deemed essential. The latest reanalysis of atmospheric composition produced by the European Centre for Medium-Range Weather Forecasts (ECMWF) is the Copernicus Atmosphere Monitoring Service
50 (CAMS) reanalysis (CAMSRA) (Inness et al., 2019). Within the framework of the CAMS service element CAMS_84, Akritidis et al. (2018) evaluated the performance of the ECMWF Integrated Forecasting System (IFS) in forecasting the observed O_3 increases in the troposphere during a deep STT event over Europe. However, apart from such individual case studies, there is no long-term evaluation of IFS during STT events. Recently, Akritidis et al. (2021) using a fold detection algorithm constructed a global record of tropopause folds in CAMSRA for the period from 2003 to 2018.

55 In the present study we perform a process-oriented evaluation of CAMSRA O_3 during STT events selected from the CAMSRA tropopause folds database by Akritidis et al. (2021), for the European region and over the time period 2003–2018. In addition, the role of IFS chemical data assimilation in O_3 STT is explored. Section 2 describes WOUDC (World Ozone and

Ultraviolet Radiation Data Centre) and IAGOS (In-service Aircraft for a Global Observing System) O$_3$ data used for the evaluation; ECMWF IFS system and CAMSRA data; the 3-D labeling algorithm applied for tropopause fold-detection; and the

60 methodological approach for the selection of STT events. Section 3 presents the main evaluation results, and finally Section 4 summarises the key findings of the study.

2 Data and Methodology

2.1 Observational data

To evaluate CAMSRA O$_3$ during folding events, ozonesonde measurements were obtained from the WOUDC network (WMO/GAW

65 Ozone Monitoring Community) (last access: 19 April 2020) for seven European sites, namely Lerwick, United Kingdom (UK) (LER); Uccle, Belgium (UCC); Hohenpeissenberg, Germany (HOH); Payerne, Switzerland (PAY); Legionowo, Poland (LEG); Madrid, Spain (MAD); De Bilt, the Netherlands (DBI). At all sites the measurements are carried out with electrochemical concentration cell (ecc) ozonesondes, except at Hohenpeissenberg where the Brewer Mast ozonesonde is used. The precision of ecc ozonesondes in the troposphere (below 200 hPa) is between -7% and +17%, as reported by Komhyr et al. (1995), while for

70 the Brewer Mast ozonesondes the same order of precision was found by Steinbrecht et al. (1998). These sites were selected as they exhibit measurement data for many years throughout the 2003-2018 period. The ozonesonde observations are compared against CAMSRA O$_3$ concentrations of the nearest grid point and timestep.

Aircraft ozone measurements from the IAGOS (In-service Aircraft for a Global Observing System) programme were also used (last access: 21 April 2020). Within the framework of IAGOS, instruments are carried on commercial airlines, measuring

75 ozone, carbon monoxide and water vapour along with meteorological parameters and cloud particles. Details of the IAGOS project can be found in Petzold et al. (2015), with the technical details of the instrumentation, operations, and validation presented in Nédélec et al. (2015). Five IAGOS airports were selected for the evaluation, based on their data temporal coverage, namely Paris, France (PAR); Düsseldorf, Germany (DUS); Frankfurt, Germany (FRA); Munich, Germany (MUN); Vienna, Austria (VIE). The IAGOS O$_3$ data have an accuracy of $\pm$ 2 ppb, a precision of $\pm$ 2%, and a detection limit of 2 ppb (Blot

80 et al., 2021). Landing and take-off O$_3$ profiles are compared against CAMSRA O$_3$ profiles. It should be noted that the IAGOS profiles are not strictly vertical. To this end, and in order to perform a more realistic evaluation of CAMSRA O$_3$, according to the flight position (longitude, latitude, pressure) the respective CAMSRA grid points are extracted at the nearest time to that of the take-off or landing. It is noteworthy to mention that both ozonesondes and IAGOS profiles are not assimilated and hence they constitute completely independent validation data. The location of the examined WOUDC ozonesonde sites and IAGOS

85 airports are depicted in Figure 1.

2.2 CAMS reanalysis

CAMSRA is the latest reanalysis dataset produced by ECMWF, including 3-dimensional fields of meteorological, chemical, and aerosol species for the period from 2003 onwards. It comes as a follow-up of the previous successful reanalysis products,

the Monitoring Atmospheric Composition and Climate (MACC) reanalysis (MACCRA) (Inness et al., 2013) and the CAMS
90   interim reanalysis (CAMSIRA) (Flemming et al., 2017). CAMSRA is based on the ECMWF's IFS CY42R1 cycle and the 4D-
VAR data assimilation system (Inness et al., 2019). In more detail, satellite retrievals of total column CO, tropospheric column
NO2, aerosol optical depth and total column, partial column and profile ozone retrievals are assimilated in the IFS system, using
12-hour assimilation windows from 09 UTC to 21 UTC and 21 UTC to 09 UTC. The chemical mechanism used in the IFS is an
extended version of the Carbon Bond 2005 (CB05) tropospheric chemical mechanism (Flemming et al., 2015) and stratospheric
95   ozone chemistry is parameterised by a "Cariolle-scheme" (Cariolle and Déqué, 1986; Cariolle and Teyssèdre, 2007). The
emissions consist of the MACCity (MACC and CityZEN EU projects) anthropogenic emissions (Granier et al., 2011), the
GFAS (Global Fire Assimilation System) fire emissions (Kaiser et al., 2012), and the MEGAN2.1 (Model of Emissions of
Gases and Aerosols from Nature) biogenic emissions (Guenther et al., 2006). The CAMSRA data have a spatial resolution of
approximately 80 km (0.7^o x 0.7^o grid) with 60 hybrid sigma/pressure (model) levels in the vertical (top level at 0.1 hPa), and a
100   temporal resolution of 3 hours. The quality of the CAMSRA O_3 field is documented in Wagner et al. (2021) and comprehensive
validation reports that can be found on the CAMS website https://atmosphere.copernicus.eu/eqa-reports-global-services (e.g.
Errera et al., 2021).

To investigate the role of chemical data assimilation in tropospheric ozone representation during folding events, a control
simulation of IFS without the use of chemical data assimilation (CAMSRA no DA) is also used. This approach was also
105   followed by Akritidis et al. (2018) in their evaluation of CAMS forecasting systems during a deep STT event over Europe,
indicating an overall improvement of IFS performance due to the chemical data assimilation implementation. Apart from O_3, a
stratospheric ozone tracer (O_{3s}) is also used from CAMSRA providing a diagnostic of O_3 STT. O_{3s} is defined identically with
O_3 in the stratosphere, and is subject to transport and chemical destruction in the troposphere just like O_3.

2.3   Fold detection in CAMS reanalysis

110   Tropopause folds are identified in CAMSRA using the latest version of the 3-D labeling and fold detection algorithm by Škerlak
et al. (2015), initially developed by Sprenger et al. (2003). Here, we adopted the 3-D labeling algorithm to detect folds in
CAMSRA, using as inputs the fields of potential vorticity (PV), potential temperature, specific humidity, and surface pressure.
Air-masses are classified in five categories (3-D labeling) and subsequently a fold is identified when multiple crossings of the
dynamical tropopause are detected in vertical profiles. Moreover, the upper (p_u), middle (p_m), and lower (p_l) pressure levels
115   of the tropopause crossings are identified along with the difference $\Delta p = p_m - p_u$, which depicts the vertical extent of the fold.
More details on the applied algorithm and the global climatology of tropopause folds in CAMSRA can be found in Akritidis
et al. (2021).

2.4   Selection of STT events

To perform the process-oriented evaluation of CAMSRA O_3, the STT events are selected for each WOUDC ozonesonde site
120   applying the following methodology:

(a) For every ozonesonde profile the time and location of release are extracted.

(b) For the CAMSRA grid cell including the ozonesonde site location and for the CAMSRA 3-hour timesteps before and after the time of ozonesonde release, the presence of a tropopause fold with $\Delta p \geq 50$ hPa is explored (e.g. if the ozonesonde release was 14:00 UTC, we search for folds at the 12:00 UTC and 15:00 UTC timesteps of the respective grid cell).

(c) If a fold is found the respective ozonesonde profile is classified in "STT events", while otherwise is classified in "rest of events".

(d) The ozonesonde data are vertically interpolated (linear) with a step of 25 hPa, and only the profiles exhibiting a data completeness ≥ 75 % from 900 to 300 hPa are kept in the STT events and rest of events records. Merging STT events with rest of events provides the climatology of ozonesonde profile.

The same approach is followed (steps a, b, and d) for the IAGOS data with one difference (step c). Since the aircraft measurement profiles during take-off and landing are not strictly vertical, a tracking of the aircraft position is performed and the respective CAMSRA grid cells that include the aircraft route are extracted. Subsequently, the presence of a tropopause fold with $\Delta p \geq 50$ hPa is explored if it is found in at least one of the extracted grid cells. A schematic representation of the applied methodology for the STT events selection is illustrated in Figure 2. For direct comparison with observations, CAMSRA O_3 concentrations are also vertically interpolated (linear) with a step of 25 hPa.

3 Results

3.1 Comparison of observed and CAMSRA climatological O_3 profiles

Before proceeding with the process-oriented evaluation of CAMSRA O_3 during the STT events, we present a comparison of CAMSRA O_3 profiles against observations (ozonesonde and aircraft measurements) during all the events (STT events + rest of events), to ensure that CAMSRA reproduces the climatological features of the observed O_3 profiles at the examined European sites. Figure 3 presents the climatological O_3 profiles of both observations and CAMSRA for all examined WOUDC and IAGOS sites. As depicted, CAMSRA captures the features of observed vertical O_3 profiles, with a common characteristic at all sites being an overestimation of CAMSRA mostly in the upper troposphere, which is also seen in the evaluation studies by Inness et al. (2019); Huijnen et al. (2020); Wagner et al. (2021). More specifically, CAMSRA exhibits higher O_3 concentrations throughout the troposphere at Hohenpeissenberg and Paris, and to a lesser extent at Frankfurt and Munich, with the greatest overestimation seen in the upper troposphere at all sites. At Payerne and Düsseldorf, CAMSRA O_3 is only overestimated above 500 hPa. At the rest of the sites CAMSRA O_3 is quantitatively in very good agreement with observations.

3.2 Evaluation of CAMSRA O_3 during STT events

In Figures 4 and 5 we present CAMSRA and observed O_3 profiles averaged during the selected STT events and the rest of events at the WOUDC ozonesonde sites and IAGOS airports, respectively. Also shown are the respective CAMSRA O_{3s}

profiles. As expected, both CAMSRA and observations exhibit higher O_3 concentrations in the middle and upper troposphere for the STT events compared to the rest of events, at all examined sites. Similarly, CAMSRA O_{3s} concentrations for STT events are higher than those for the rest of events, resembling the respective CAMSRA O_3 enhancements in the troposphere. This

155   highlights the stratospheric contribution in O_3 increases during the selected tropopause folding episodes. Overall, CAMSRA O_3 is in a satisfactory agreement with the observed O_3 enhancements in the troposphere during the STT events, still exhibiting specific limitations. A feature seen in some observational sites (Uccle, Hohenpeissenberg, Legionowo, Paris, and Düsseldorf), is that although CAMSRA follows the observed O_3 increases in the troposphere it misses the observed decrease back to normal tropospheric O_3 values, resulting in overestimation of O_3 in the upper troposphere. This might be due to a bias in

160   some of the assimilated data, the likely insufficient vertical resolution of O_3 data assimilated (total column and stratospheric profiles) in IFS to capture STT events, and the O_3 background error formulation in data assimilation. As mentioned above, the O_3 overestimation in the upper troposphere is an already known issue in both CAMS near-real-time analysis and reanalysis products. Moreover, for sites exhibiting a very small number of STT events over the years (e.g. Legionowo), the O_3 vertical variability is not smoothed out and CAMSRA is not found able to reproduce the high resolution features of O_3 increase,

165   probably due to its coarser vertical resolution compared to ozonesonde measurements.

For a quantitative comparison between CAMSRA and observations, we present in Figures 6 the vertical profiles of fractional gross error (FGE) and modified normalized mean bias (MNMB) of CAMSRA O_3 for the WOUDC ozonesonde sites and IAGOS airports. FGE and MNMB range between 0 to 2 and -2 to 2, respectively, behaving symmetrically with respect to under- and overestimation:

$$FGE = \frac{2}{N} \sum_{i}^{N} \left| \frac{M_i - O_i}{M_i + O_i} \right| \tag{1}$$

$$MNMB = \frac{2}{N} \sum_{i}^{N} \frac{M_i - O_i}{M_i + O_i} \tag{2}$$

where M_i is the model value for the ith STT event, O_i is the corresponding observed value, and N is the number of STT events. As can be seen in Figure 6a the FGE is mostly increasing with height, with values > 0.3 found above 500 hPa at several sites.

175   Indicatively, the median FGE value among the examined sites for each pressure level is > 0.2 above 400 hPa (Figure 7). As expected, the respective profiles of MNMB in Figure 6b indicate that the biases are mostly positive confirming the aforementioned discussion. The median MNMB value among the examined sites for each pressure level ranges approximately from 0 to +0.1 below 400 hPa (Figure 7), which is in agreement with the MNMB values of CAMSRA O_3 in the free troposphere reported by Inness et al. (2019) and Wagner et al. (2021). Above 400 hPa the respective median MNMB value ranges from

180   +0.1 to +0.19 (Figure 7).

3.3 The role of chemical data assimilation

Hereafter we investigate the role of chemical data assimilation in CAMSRA O_3 representation during the selected STT events. To this end, we present CAMSRA no DA and observed O_3 profiles averaged during the selected STT events and the rest of

events, at the WOUDC ozonesonde sites and IAGOS airports in Figures 8 and 9, respectively. As depicted in both figures, although CAMSRA no DA exhibits relatively higher O_3 concentrations during the STT events compared to the rest of events it clearly underestimates the observed O_3 increases in the troposphere at all sites above about 500 hPa. This, in combination with Figures 4 and 5, indicates that chemical data assimilation boosts O_3 concentrations in the direction of capturing the observed O_3 enhancement structures in the middle and upper troposphere. Similar results for the role of IFS chemical data assimilation in O_3 representation were reported by Akritidis et al. (2018) in their evaluation of CAMS-global forecast system during a deep STT event over Europe.

The FGE values of CAMSRA no DA O_3 shown in Figure 10a indicate similar values with that of CAMSRA, with a bias increase close to O_3 increases close to the upper troposphere. The respective MNMB values illustrated in Figure 10b reveal overall an underestimation of O_3 during the STT events. The median FGE and MNMB values depicted in Figure 7 suggest an overall improvement of MNMB and FGE in CAMSRA due to chemical data assimilation between 500 and 400 hPa and a deterioration above 350 hPa.

4 Conclusions

A process-oriented evaluation of CAMS reanalysis O_3 during tropopause folding events over the period 2003-2018 is performed using WOUDC ozonesonde data and IAGOS aircraft measurements. The selected STT events were obtained from the CAMSRA tropopause folds database by Akritidis et al. (2021) which was constructed with the implementation of the 3-D labeling and fold detection algorithm by Škerlak et al. (2015). Moreover, the role of chemical data assimilation in O_3 representation during the examined STT events was investigated using a CAMS control simulation without chemical data assimilation. The most notable findings of the study are summarized as follows:

- CAMSRA reproduces the observed O_3 increases in the troposphere during the examined folding events, which as indicated by the respective O_{3s} profiles are of stratospheric origin.
- For some sites CAMSRA misses to follow the observed return of O_3 concentrations back to normal tropospheric levels, resulting in an overestimation of O_3 in the upper troposphere, with FGE values at 350 hPa ranging from 0.13 to 0.38 (median of 0.3) at the observational sites.
- The use of chemical data assimilation in IFS is found to be beneficial for the representation of CAMSRA O_3 enhancements in the troposphere during the STT events. However, it leads to an overestimation of O_3 concentrations at the upper portion of O_3 increases.
- Overall, and in terms of O_3 bias and absolute bias, only a small improvement is found between 500 and 400 hPa due to chemical data assimilation implementation.

The present analysis indicates that CAMSRA reproduces satisfactorily the observed O_3 increases in the troposphere during the tropopause folding events. Although IFS chemical data assimilation helps CAMSRA O_3 to follow the observed O_3 increases, it mostly leads in O_3 overestimation in the upper troposphere. Future improvements in the quality and vertical resolution of the assimilated O_3 products, increases in the vertical resolution of the IFS as well a reassessment of the O_3 background

error statistics are expected to advance the performance of future IFS-based reanalyses in capturing O_3 variability during STT events.

Data availability. The CAMS reanalysis data are available from the CAMS Atmosphere Data Store (ADS) https://ads.atmosphere.copernicus. eu/cdsapp#!/dataset/cams-global-reanalysis-eac4?tab=form. The CAMS control simulation without data assimilation was obtained from the ECMWF's Copernicus Helpdesk. This study contains modified Copernicus Atmosphere Monitoring Service Information (2021); neither the European Commission nor ECMWF is responsible for any use that may be made of the information it contains. The ozonesonde data were downloaded from the World Ozone and Ultraviolet Radiation Data Center (WOUDC) at https://woudc.org/. The IAGOS aircraft measurements were obtained from the IAGOS database at http://iagos-data.fr/.

Author contributions. DA designed the study, performed the analysis, and wrote the manuscript. AP adopted the 3-D labeling algorithm and performed the fold identification calculations. JF and AI have contributed to the development of IFS and the production of CAMS reanalysis of atmospheric composition product. All authors contributed to reviewing and editing of the manuscript and interpretation of the results.

Competing interests. The authors declare that they have no conflict of interest.

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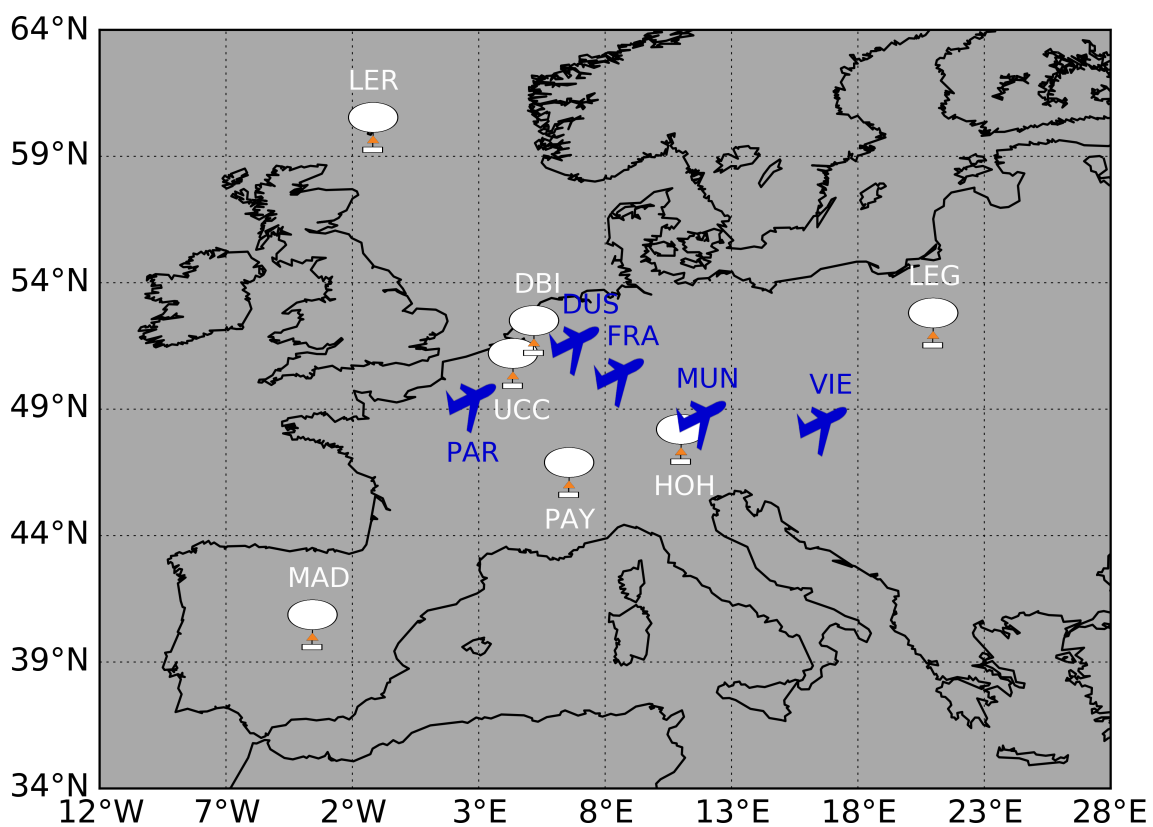
Figure 1. Location of WOUDC ozonesonde sites (white balloons) and IAGOS airports (blue airplanes) over Europe used in the present study.
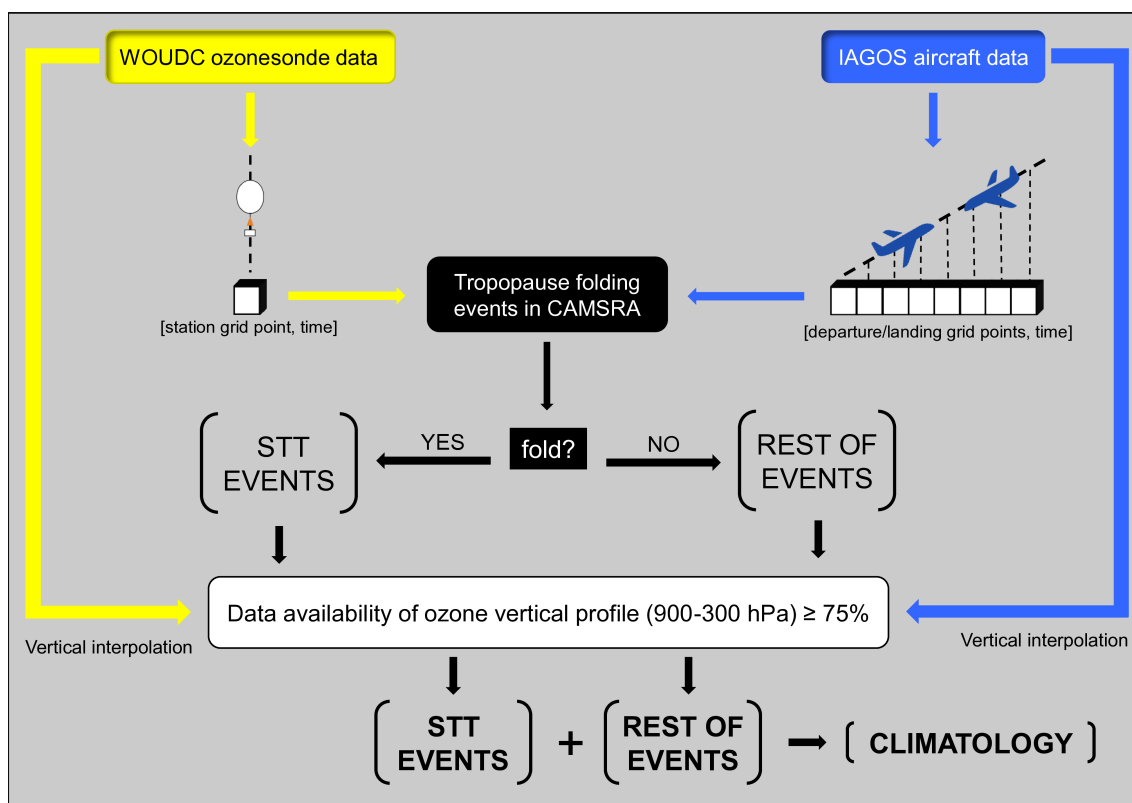
Figure 2. Schematic representation of the methodology applied to select STT events.
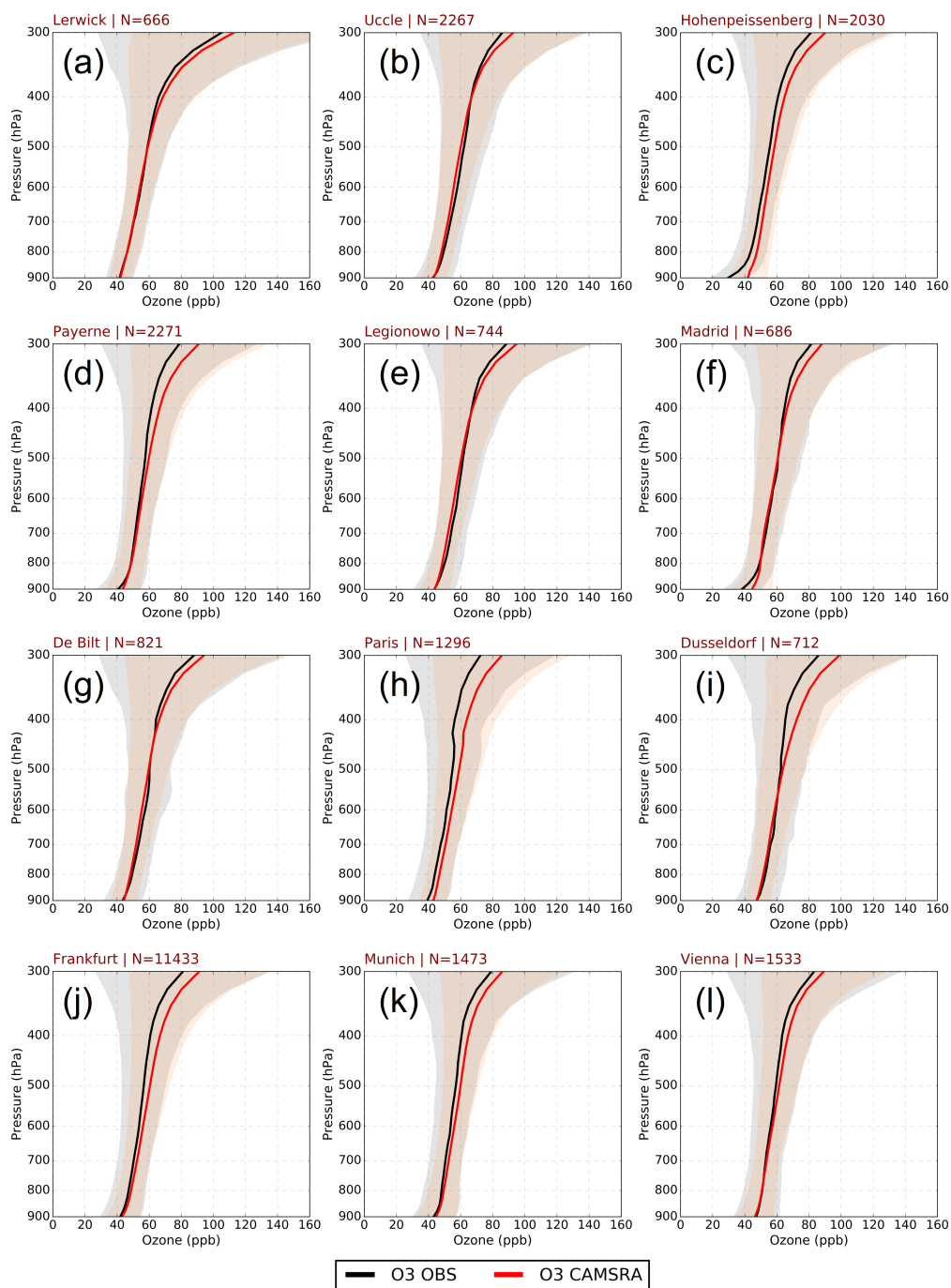
Figure 3. Vertical profiles of observed (black) and CAMSRA (red) ozone concentrations (ppb) at the WOUDC ozonesonde stations of a) Lerwick (UK), b) Uccle (Belgium), c) Hehenpeissenberg (Germany), d) Payerne (Switzerland), e) Legionowo (Poland), (f) Madrid (Spain), and (g) De Bilt (the Netherlands); at the IAGOS airports of h) Paris (France), i) Düsseldorf (Germany), j) Frankfurt (Germany), k) Munich (Germany), and l) Vienna (Austria) for the period 2003–2018. The grey and sandybrown shaded areas depict the ± one standard deviation of ozone vertical profiles in observations and CAMSRA, respectively.
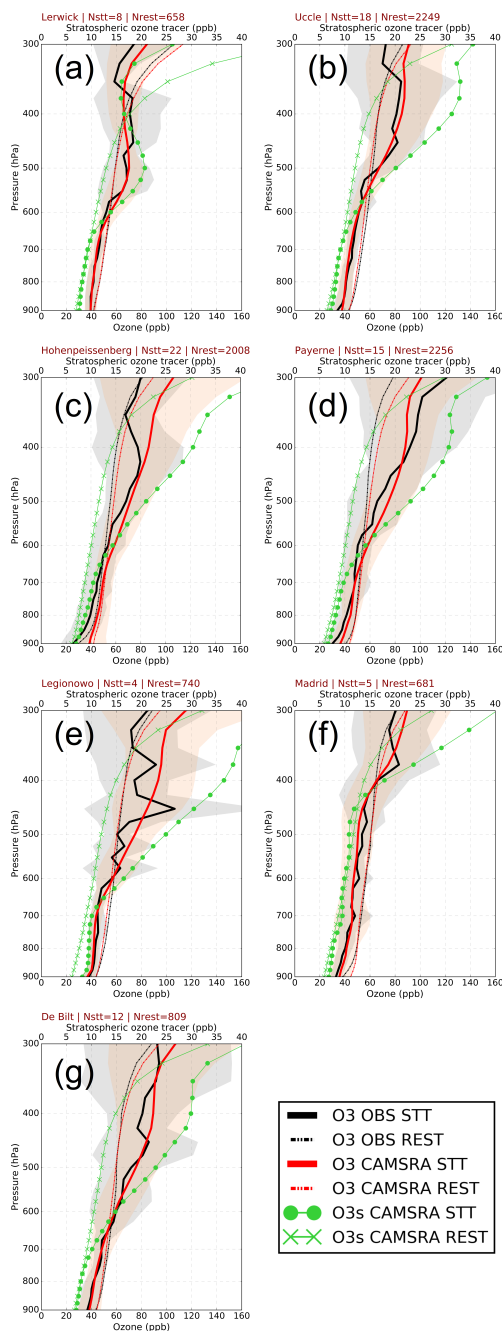
Figure 4. Vertical profiles of observed (black) and CAMSRA (red) ozone concentrations (ppb) during STT events (thick solid line) as well as during the rest of events (thin dashed line) at the WOUDC ozonesonde stations of a) Lerwick (UK), b) Uccle (Belgium), c) Hehenpeissenberg (Germany), d) Payerne (Switzerland), e) Legionowo (Poland), (f) Madrid (Spain), and (g) De Bilt (the Netherlands). Also shown are the vertical profiles of stratospheric ozone tracer concentrations (ppb) during STT (green circles) and rest of events (green x markers). The grey and sandybrown shaded areas depict the ± one standard deviation of ozone vertical profiles during STT events in observations and CAMSRA, respectively. Keep in mind that O_3 and O_{3s} concentrations are presented in different horizontal axes.
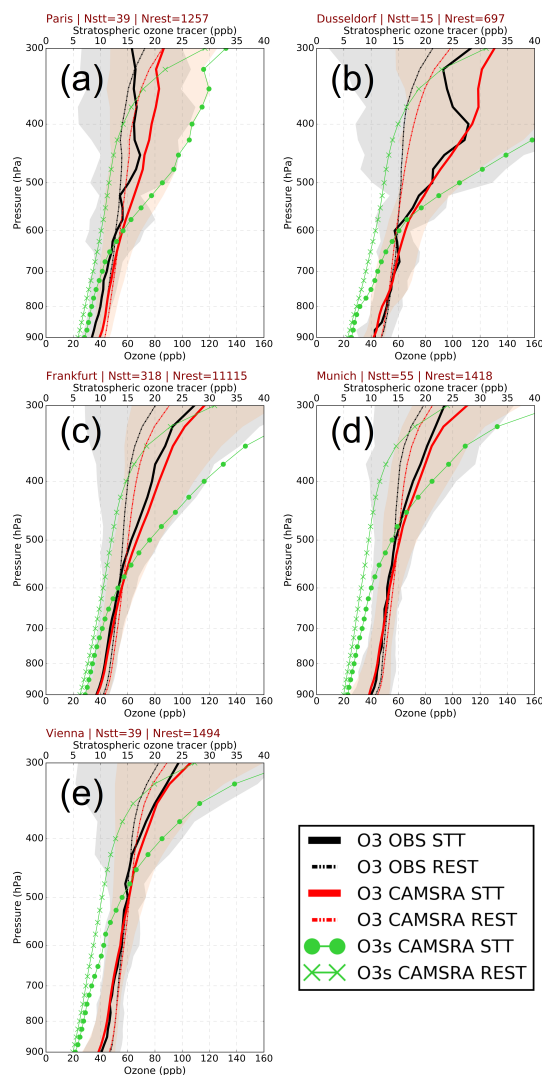
Figure 5. Vertical profiles of observed (black) and CAMSRA (red) ozone concentrations (ppb) during STT events (thick solid line) as well as during the rest of events (thin dashed line) at the IAGOS airports of a) Paris (France), b) Düsseldorf (Germany), c) Frankfurt (Germany), d) Munich (Germany), and e) Vienna (Austria). Also shown are the vertical profiles of stratospheric ozone tracer concentrations (ppb) during STT (green circles) and rest of events (green x markers). The grey and sandybrown shaded areas depict the $\pm$ one standard deviation of ozone vertical profiles during STT events in observations and CAMSRA, respectively. Keep in mind that O_3 and O_{3s} concentrations are presented in different horizontal axes.
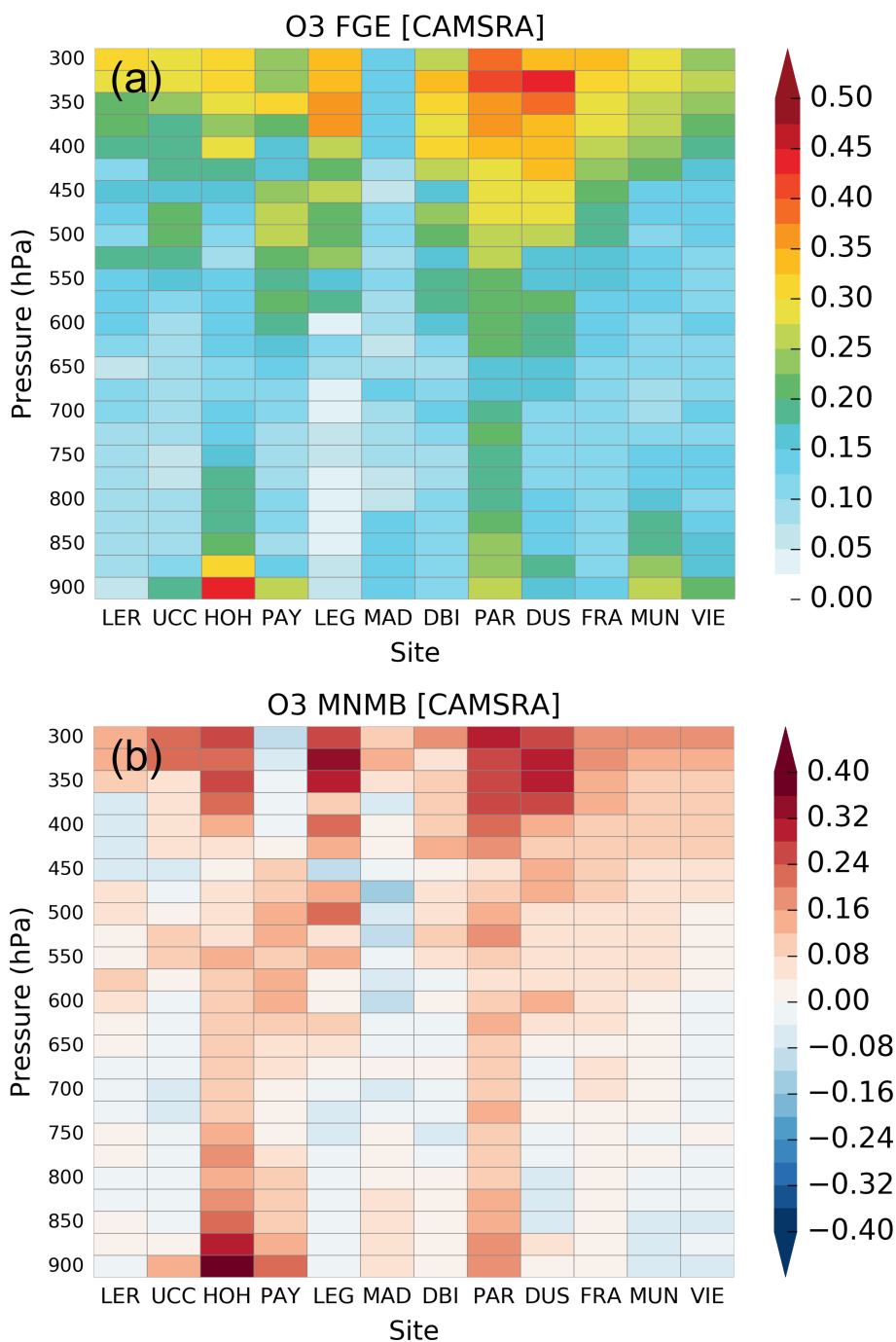
Figure 6. Vertical profiles of CAMSRA ozone (a) FGE and (b) MNMB for the examined WOUDC ozonesonde stations and IAGOS airports over the period 2003–2018.
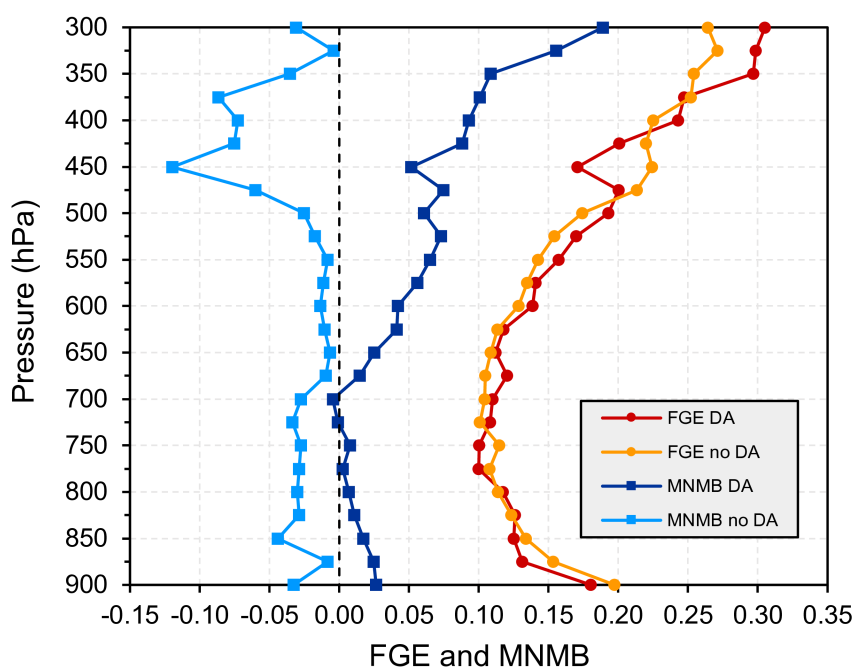
Figure 7. Vertical profiles of median (among examined sites) FGE and MNMB for CAMSRA O$_3$ with/without chemical data assimilation (DA/no DA).
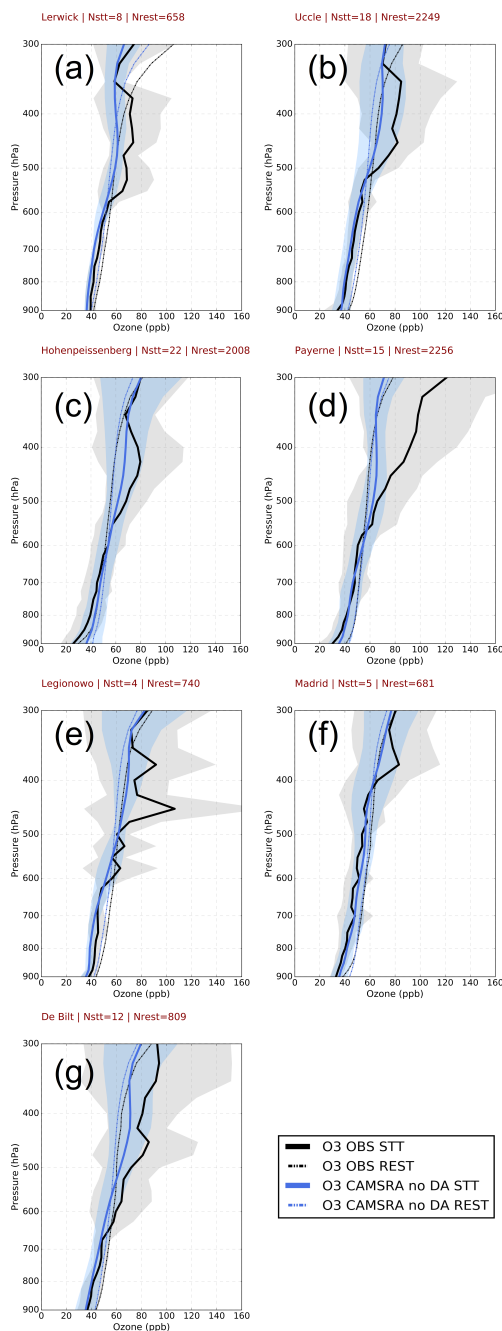
Figure 8. Vertical profiles of observed (black) and CAMSRA no DA (blue) ozone concentrations (ppb) during STT events (thick solid line) as well as during the rest of events (thin dashed line) at the WOUDC ozonesonde stations of a) Lerwick (UK), b) Uccle (Belgium), c) Hehenpeissenberg (Germany), d) Payerne (Switzerland), e) Legionowo (Poland), (f) Madrid (Spain), and (g) De Bilt (the Netherlands). The grey and sandybrown shaded areas depict the ± one standard deviation of ozone vertical profiles during STT events in observations and CAMSRA no DA, respectively.
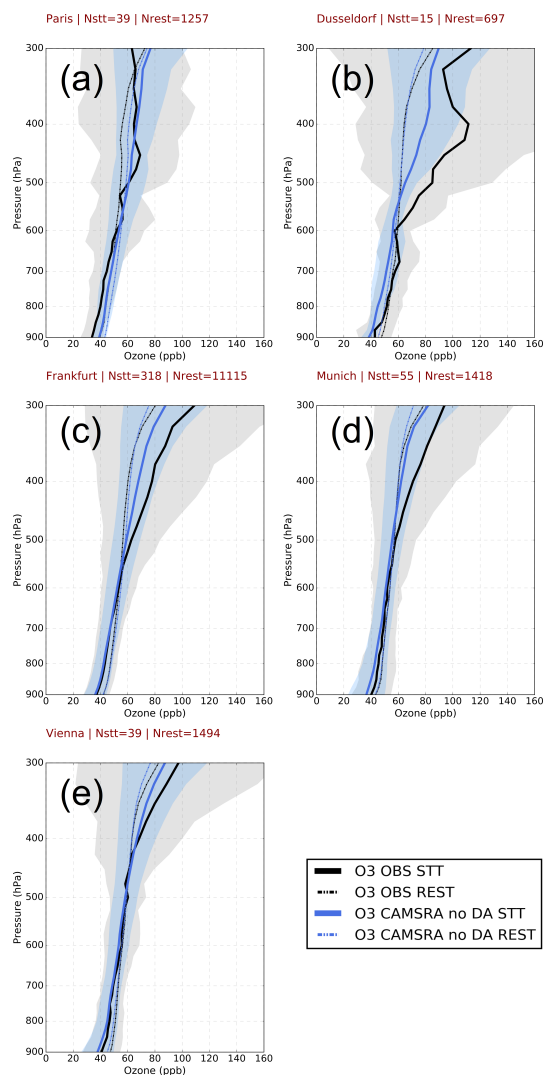
Figure 9. Vertical profiles of observed (black) and CAMSRA no DA (blue) ozone concentrations (ppb) during STT events (thick solid line) as well as during the rest of events (thin dashed line) at the IAGOS airports of a) Paris (France), b) Düsseldorf (Germany), c) Frankfurt (Germany), d) Munich (Germany), and e) Vienna (Austria). The grey and sandybrown shaded areas depict the ± one standard deviation of ozone vertical profiles during STT events in observations and CAMSRA no DA, respectively.
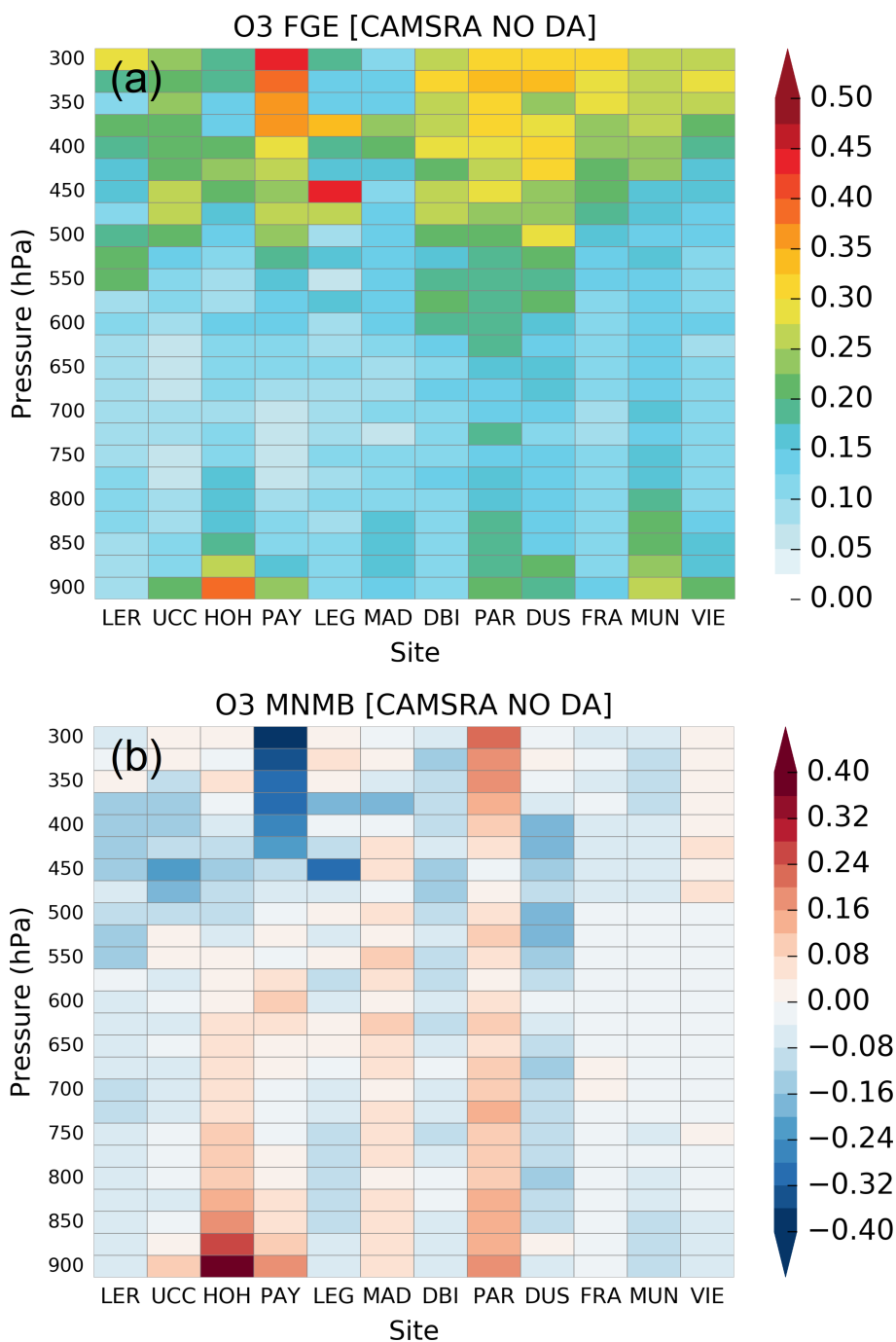
Figure 10. Vertical profiles of CAMSRA no DA ozone (a) FGE and (b) MNMB for the examined WOUDC ozonesonde stations and IAGOS airports over the period 2003–2018.