



# Validation of Sentinel-5P TROPOMI tropospheric NO<sub>2</sub> products by comparison with NO<sub>2</sub> measurements from airborne imaging, ground-based stationary, and mobile car DOAS measurements during the S5P-VAL-DE-Ruhr campaign

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**Abstract.** Airborne imaging differential optical absorption spectroscopy (DOAS), ground-based stationary and car DOAS measurements were conducted during the S5P-VAL-DE-Ruhr campaign in September 2020. The campaign area is located in the Rhine-Ruhr region of North Rhine-Westphalia, Western Germany, which is a pollution hotspot in Europe comprising urban and large industrial emitters. The measurements are used to validate space-borne NO<sub>2</sub> tropospheric vertical column density

- 5 data products from the Sentinel-5 Precursor (S5P) TROPOspheric Monitoring Instrument (TROPOMI). Seven flights were performed with the airborne imaging DOAS instrument for measurements of atmospheric pollution (AirMAP), providing measurements which were used to create continuous maps of NO<sub>2</sub> in the layer below the aircraft. These flights cover many S5P ground pixels within an area of 30 km x 35 km and were accompanied by ground-based stationary measurements and three mobile car DOAS instruments. Stationary measurements were conducted by two Pandora, two zenith-sky and two
- 10 MAX-DOAS instruments distributed over three target areas. Ground-based stationary and car DOAS measurements are used to evaluate the AirMAP tropospheric NO<sub>2</sub> vertical column densities and show high Pearson correlation coefficients of 0.87 and 0.89 and slopes of  $0.93 \pm 0.09$  and  $0.98 \pm 0.02$  for the stationary and car DOAS, respectively.

Having a spatial resolution of about 100 m x 30 m, the AirMAP tropospheric NO<sub>2</sub> vertical column density (VCD) data creates a link between the ground-based and the TROPOMI measurements with a resolution of 3.5 km x 5.5 km and is therefore well





- 15 suited to validate the TROPOMI tropospheric NO<sub>2</sub> VCD. The measurements on the seven flight days show strong NO<sub>2</sub> variability, which is dependent on the different target areas, the weekday, and the meteorological conditions. The AirMAP campaign dataset is compared to the TROPOMI NO<sub>2</sub> operational off-line (OFFL) V01.03.02 data product, the reprocessed NO<sub>2</sub> data, using the V02.03.01 of the official L2 processor, provided by the Product Algorithm Laboratory (PAL), and several scientific TROPOMI NO<sub>2</sub> data products. The TROPOMI data products and the AirMAP data are highly corre-
- 20 lated with correlation coefficients between 0.72 and 0.87, and slopes of  $0.38 \pm 0.02$  to  $1.02 \pm 0.07$ . On average, TROPOMI tropospheric NO<sub>2</sub> VCDs are lower than the AirMAP NO<sub>2</sub> results. The slope increased from  $0.38 \pm 0.02$  for the operational OFFL V01.03.02 product to  $0.83 \pm 0.06$  after the improvements in the retrieval of the PAL V02.03.01 product were implemented. Different auxiliary data, such as spatially higher resolved a priori NO<sub>2</sub> vertical profiles, surface reflectivity and the cloud treatment, are investigated using scientific TROPOMI tropospheric NO<sub>2</sub> VCD data products to evaluate their impact on
- 25 the operational TROPOMI NO<sub>2</sub> VCD data product. The comparison of the AirMAP campaign dataset to the scientific data products shows that the choice of surface reflectivity data base has a minor impact on the tropospheric NO<sub>2</sub> VCD retrieval in the campaign region and season. In comparison, the replacement of the a priori NO<sub>2</sub> profile in combination with the improvements in the retrieval of the PAL V02.03.01 product regarding cloud heights has a major impact on the tropospheric NO<sub>2</sub> VCD retrieval and increases the slope from  $0.88 \pm 0.06$  to  $1.00 \pm 0.07$ . This study demonstrates that the underestimation of
- 30 the TROPOMI tropospheric NO<sub>2</sub> VCD product with respect to the validation dataset has been and can be further significantly improved.

#### 1 Introduction

The reactive nitrogen oxides, nitrogen monoxide (NO) and nitrogen dioxide (NO<sub>2</sub>) collectively known as NO<sub>x</sub> (= NO + NO<sub>2</sub>), are important tropospheric air pollutants and have a strong impact on the tropospheric chemistry. In addition to emissions from

- soils, natural biomass burning and lightning, they are largely released into the troposphere by a variety of human activities. These include fossil fuel combustion processes of power plants, by traffic and in industrial areas, as well as man-made biomass burning. The reaction of NO with ozone ( $O_3$ ) rapidly forms  $NO_2$ . The characteristics of the  $NO_x$  sources are spatially and temporally highly variable, and nitrogen compounds are chemically active. As a result, the spatial and temporal variability of  $NO_2$ is large.  $NO_x$  in the troposphere is toxic and impacts on the chemical composition and environmental condition, e.g., through
- 40 tropospheric ozone catalytic production cycles (Chameides and Walker, 1973; Fishman and Crutzen, 1978; Jacob et al., 1996) or its reaction with the hydroxyl radical, OH, the most important tropospheric daytime oxidizing agent. Accurate knowledge of the spatial and temporal distribution of NO<sub>2</sub> in the troposphere is therefore required to better understand tropospheric chemistry.

Atmospheric NO<sub>2</sub> is remotely observed from different platforms, including ground-based stations, moving platforms such as
cars, ships or aircraft, and environmental satellites. Applying the DOAS (Differential Optical Absorption Spectroscopy) technique (Platt and Stutz, 2008) in the UV and visible spectral range, the absorption signature of NO<sub>2</sub> is identified and column densities are retrieved.





After earlier satellite missions have observed stratospheric  $NO_2$ , to investigate stratospheric  $O_3$  chemistry (Dubé et al., 2020),  $NO_2$  in the troposphere has been retrieved from space observations since the launch of GOME in 1995 (see e.g., Burrows et al.,

- 50 1999; Richter and Burrows, 2002; Beirle et al., 2010; Boersma et al., 2011; Hilboll et al., 2013a). As NO<sub>2</sub> has high spatial variability in the troposphere, the spatial resolution has been gradually improved from GOME (ground footprint 320 km x 40 km) to SCIAMACHY (60 km x 30 km), GOME-2 (80 km x 40 km), OMI (13 km x 24 km) and to the recent TROPOMI instrument (5.5 km x 3.5 km) on board the European Space Agency (ESA) S5P satellite. With a focus on diurnal variations, projects with geostationary instruments are now being deployed such as the Korean instrument GEMS (Kim et al., 2020), launched in Febru-
- 55 ary 2020, NASA's TEMPO (Zoogman et al., 2017) planned for launch in 2022, and ESA's Sentinel-4 (Ingmann et al., 2012) planned for launch in 2024.

To ensure the accuracy of satellite data products for use in research, policy making, or other applications, each data product from satellite sensors needs to be validated and its accuracy determined. Validation measurements are needed in polluted and clean regions by independent instruments operating on different platforms. Measurements from ground-based sites pro-

- 60 vide continuous validation data from different locations for the trace gas products, retrieved from satellite instruments (e.g., Verhoelst et al., 2021). Measurements from mobile ground-based platforms like cars enable the observation of the spatial variability in addition to its temporal evolution and are used for the comparison with satellite observations (Wagner et al., 2010; Constantin et al., 2013; Wu et al., 2013) and the validation of airborne remote sensing measurements (Meier et al., 2017; Tack et al., 2017; Merlaud et al., 2018). Airborne remote sensing measurements are an additional valuable source of validation data.
- 65 Airborne mapping experiments have been performed in the recent years using different aircraft imaging DOAS instruments such as AMAXDOAS, APEX, AirMAP, SWING, SBI, GeoTASO or GCAS (e.g., Heue et al., 2005; Popp et al., 2012; Schönhardt et al., 2015; Meier et al., 2017; Tack et al., 2019; Judd et al., 2020). The aircraft viewing geometry is similar to that of a satellite, but airborne measurements are able to measure at higher spatial resolution than the satellite sensors. Airborne observations are only available for short periods and are concentrated on the campaign region, but compared to measurements
- 70 from ground-based sites offer the advantage that larger areas and full satellite ground pixels are observed in a relatively short period around the satellite overpass. Thus, spatiotemporal variations of trace gas data products become visible at sub satellite ground pixel resolution. The combination of airborne imaging, ground-based stationary and mobile measurements enables the validation of satellite data products over a long period and at a high spatial resolution.

Focussing on TROPOMI, Verhoelst et al. (2021) have compared satellite columns to tropospheric NO<sub>2</sub> VCD data from in total
seventy ground stations. Depending on the level of pollution, TROPOMI tropospheric NO<sub>2</sub> VCD data (OFFL product) show a negative bias compared to ground-based observations. Recent studies by Tack et al. (2021) and Judd et al. (2020), comparing airborne tropospheric NO<sub>2</sub> VCD data products to TROPOMI tropospheric NO<sub>2</sub> VCD data V01.02 and V01.03.01, also show a significant underestimation of TROPOMI compared to the airborne observations.

Different aspects that influence the tropospheric NO<sub>2</sub> VCD determination and possible reasons for the underestimation of the
TROPOMI tropospheric NO<sub>2</sub> VCD data, compared to the validation data, are discussed in several studies (e.g., Judd et al., 2020; Tack et al., 2021; Verhoelst et al., 2021; van Geffen et al., 2022; Douros et al., 2022). The limited knowledge of the NO<sub>2</sub> profiles, and differences in the averaging kernels between instruments having different viewing geometries, are identified as



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significant potential sources of disagreement between satellite and validation data. Similarly, inaccuracies in the knowledge of the aerosol load and aerosol vertical profile lead to underestimations as well as overestimations of the tropospheric NO<sub>2</sub> VCD, depending also on the viewing geometry. In addition, the knowledge about the surface reflectivity and cloud conditions and

their treatment in satellite retrieval algorithms needs to be taken into account.
In the present study, results from a comprehensive field study conducted in North Rhine-Westphalia in September 2020 are presented. The campaign area is located in the West of Germany and includes the highly polluted Ruhr Area, a metropolitan region with large cities, industrial estates, power plants and arterial highways. However, background areas, having low pollution,

- 90 and somewhat polluted regions are included, which increases the dynamic range of observed values. This campaign utilized the mapping capabilities of the Airborne imaging DOAS instrument for Measurements of Atmospheric Pollution (AirMAP) and includes a ground-based component for the evaluation of the AirMAP dataset, comprised of three mobile car DOAS and six stationary DOAS devices. AirMAP is used for regional mapping of areas large enough to contain many TROPOMI pixels. Possible reasons for the low bias of the TROPOMI tropospheric NO<sub>2</sub> VCD product are investigated by a systematic variation
- 95 of the relevant input parameters in the satellite retrieval.

In the following, the field campaign site and setup are described in Sect. 2. The instruments and data sets are explained in Sect. 3. After a thorough comparison of AirMAP to stationary DOAS (Sect. 4) and car DOAS data (Sect. 5), the campaign data set is used to evaluate TROPOMI tropospheric NO<sub>2</sub> products (Sect. 6), including the operational OFFL V01.03.02 product version active during the campaign phase and the reprocessed data version PAL V02.03.01. Starting from these base versions, scientific

100 products are developed that enable a dedicated assessment of the retrieval issues described above and the assumptions used about the  $NO_2$  profile, clouds, and surface reflectivity.

#### 2 The S5P-VAL-DE-Ruhr campaign

The objective of the S5P-VAL-DE-Ruhr campaign, an activity within the ESA QA4EO project, was to perform comprehensive field studies optimized for TROPOMI tropospheric  $NO_2$  VCD validation including airborne, ground-based stationary and mobile car DOAS measurements.

The campaign activities took place in September 2020 in North Rhine-Westphalia including the Ruhr area, a densely populated and strongly polluted urban agglomeration in the west of Germany. The Ruhr area itself has over 5 million inhabitants. Together with the populated surroundings and metropolitan centers along the Rhine, the region is termed the Metropolitan area Rhine-Ruhr (MRR). More than 10 million inhabitants in total, large power plants, energy intensive industrial estates and

110 several arterial highways belong to the MRR. NO<sub>2</sub> pollution above the campaign location is clearly visible in satellite maps of Europe showing widespread enhanced NO<sub>2</sub> amounts (cf. Fig. 2).

A key contribution to the campaign is the airborne AirMAP instrument explained below in Sect. 3.2. AirMAP was installed on the FU-Berlin Cessna T207A aircraft that was based at an airport close to Dinslaken, North Rhine-Westphalia. Within the designated campaign area, three research flight areas were defined, where AirMAP performed in total seven flights on seven

115 consecutive days. The aircraft observations covered a large number of neighboring TROPOMI ground pixels reasonably close





in time to the TROPOMI observations.

Figure 1 shows a map of the region, in which flights were made during the campaign, including examples of the flight patterns flown in the three research flight areas within the region: around Jülich in the Southwest (blue track), around Cologne in the Southeast (red track) and around Duisburg in the North (green track). The research flight area around Jülich is expected

- 120 to be dominated by power plant emissions because of three large lignite fired power plants, located in this target area, as documented by the European Pollutant Release and Transfer Register (E-PRTR). The research flight area around Cologne is a mixed urban and industrial area, and the flight area around Duisburg has a similar character to that of the Cologne area with a mixture of urban and industrial emitters but includes the central metropolitan Ruhr area, which has a large variety of pollution sources. The individual research flight area on each of the campaign days was selected after assessment
- 125 of the weather and atmospheric conditions, in particular wind direction and speed and the objective of measuring all of the three research flight areas on a clear-sky day. For the flight days, the weather conditions were favorable having mostly cloud free scenes over the particular target area. The cloud radiance fraction retrieved in the TROPOMI NO<sub>2</sub> spectral window (cloud\_radiance\_fraction\_nitrogendioxide\_window\_crb) for S5P overpass times, was on average  $0.21 \pm 0.10$  with a maximum of 0.48 and thus for all measurements below the recommended filter criterion of 0.5.
- 130 The selected flight area is covered with straight flight tracks in a lawn mower style. Neighboring flight legs are flown in opposite directions and have an overlap of approximately 30 % at the edges of the airborne instrument swath. For each flight, 13 to 15 flight tracks, each having a width and length of approximately 3 km and 35 km, were performed above the target area. The transfer flights between airport and target areas were used to overpass nearby stationary instruments. Flight schedules used the S5P overpass times to optimize the amount of data for validation. In general, it was planned to have the S5P overpass in the
- 135 middle of the flight. On days where two overpasses per day occurred in the target area, the flight schedules were optimized towards the overpass time at the smaller viewing zenith angle (VZA) of TROPOMI. More details of the flights are given in Tab. 1.

Date	Flight time (UTC)	Flight area	S5P overpass (UTC) with VZA	Comments
12 Sep 2020	10:17-13:37	Cologne	10:51 (67.4°), 12:31 (15.9°)	
13 Sep 2020	10:20-13:36	Jülich	12:12 (8.8°)	
14 Sep 2020	10:14-13:47	Duisburg	11:53 (30.7°), 13:35 (64.9°)	No TROPOMI data
15 Sep 2020	09:15-12:44	Duisburg	11:35 (46.7°), 13,15 (55.4°)	
16 Sep 2020	10:37-14:05	Duisburg	11:16 (57.7°), 12:56 (41.9°)	Only one car DOAS
17 Sep 2020	10:45-14:16	Jülich	10:57 (65.5°), 12:37 (22.6°)	
18 Sep 2020	10:48-14:08	Cologne	12:18 (1.6°)	

**Table 1.** List of the aircraft activities including S5P overpass information. All times are UTC. On days with two S5P overpasses over the area, flights were arranged to coincide with the overpass at smaller VZA of TROPOMI.







**Figure 1.** Overview of the flight area of the Ruhr campaign, including exemplary flight patterns in the three target areas and locations of the stationary instruments in Jülich (blue), Cologne (red), Dinslaken airport (purple), Gelsenkirchen (cyan) and Duisburg (green).

The campaign delivered measurements by a mobile and a stationary component. In addition to the measurements made by

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AirMAP, the mobile component included three car DOAS devices. The stationary component comprised six ground-based remote sensing instruments of three different types, i.e., two Pandora instruments, two MAX-DOAS instruments and two fixed zenith-sky devices. All the instruments were placed at suitable locations within the selected research flight areas shown in Fig. 1. With this combination of measurements, a comprehensive comparison of the aircraft measurements with different types of ground-based instruments is made possible, prior to the dedicated evaluation of TROPOMI tropospheric  $NO_2$  VCD products with airborne mapping  $NO_2$  data products, which cover well the satellite pixel areas. In this manner, the airborne imaging data

145 link the local observations with restricted spatial but good temporal coverage on the one hand with satellite observations that have large swath widths but at a single instance in time on the other hand.





#### **3** Instruments and datasets

During the S5P-VAL-DE-Ruhr campaign, tropospheric VCDs of NO<sub>2</sub> are retrieved from instruments mounted on satellite, airborne, car and stationary ground-based platforms. All these instruments are passive remote sensing spectrometers using the
differential optical absorption spectroscopy (DOAS) technique (Platt and Stutz, 2008) by analyzing visible and UV spectra of scattered sun light. The instruments involved in the S5P-VAL-DE-Ruhr campaign activities are listed in Tab. 2.

**Table 2.** List of instruments included in S5P-VAL-DE-Ruhr campaign activities with location and observation geometry. Car DOAS instruments are operated by three different institutes: Institute of Environmental Physics, University of Bremen (IUP), Max Planck Institute for Chemistry in Mainz (MPIC) and the Royal Belgian Institute for Space Aeronomy (BIRA).

Instrument	Location/Platform	Observation geometry	
TROPOMI	Sentinel-5P	Push-broom, nadir	
AirMAP	FU-Berlin Cessna T207A aircraft	Push-broom, nadir	
IUP car DOAS	Mobile car	Zenith-sky	
MPIC car DOAS	Mobile car	Zenith and 22° elevation angle	
BIRA car DOAS	Mobile car	Zenith and 22° elevation angle	
Pandora COL	Cologne (50.94° N, 6.98° E)	Multi-axis	
Pandora JUE	Jülich (50.91° N, 6.41° E)	Multi-axis	
Zenith-DOAS JUE	Jülich (50.91° N, 6.41° E)	Zenith-sky	
Zenith-DOAS GEL	Gelsenkirchen (51.56° N, 7.09° E)	Zenith-sky	
MAX-DOAS DUI	Duisburg (51.46° N, 6.73° E)	Multi-axis	
MAX-DOAS AIRPT	Airport Dinslaken (51.62° N, 6.87° E)	Multi-axis	

# 3.1 S5P TROPOMI

The Copernicus satellite S5P was launched into a Sun-synchronous orbit at 824 km in October 2017. S5P carries a single instrument, TROPOMI, which comprises a hyperspectral spectrometer measuring radiation in the ultraviolet, visible, and near and shortwave infrared spectral regions (Veefkind et al., 2012). TROPOMI provides observations between 10:50 and 13:45 UTC over the campaign region, measuring the distribution of atmospheric columns from trace gases such as NO<sub>2</sub>, HCHO, CHO.CHO, BrO, SO<sub>2</sub>, O<sub>3</sub>, CO, CH<sub>4</sub> and of aerosol and cloud properties. Thereby TROPOMI extends a long record of satellite-based observations. With its good signal-to-noise ratio and a spatial resolution of 3.5 km x 5.5 km (initially 3.5 km x 7 km, changed on 6 August 2019), which is more than 10 times better than that of its predecessor, the ozone monitoring instrument

160 (OMI, Levelt et al. (2006)), it is thus by far the best instrument for monitoring small-scale emission sources of  $NO_x$  from space.





# 3.1.1 TROPOMI NO<sub>2</sub> operational OFFL V01.03.02 product version

During the campaign activities in September 2020, the TROPOMI L2 NO<sub>2</sub> OFFL V01.03.02 product was generated operationally. For the retrieval of NO<sub>2</sub> slant column densities (SCD) the measured spectra are analyzed using the DOAS technique in
the fitting window 405 nm - 465 nm. The SCDs are separated into their stratospheric and tropospheric parts, using the TM5-MP global chemistry transport model. The tropospheric SCDs are then converted into tropospheric VCDs by applying tropospheric air mass factors (AMFs), estimated using a look-up table of altitude-dependent AMFs, the OMI Lambertian equivalent reflectivity (LER) climatology (Kleipool et al., 2008), NO<sub>2</sub> vertical profiles from the TM5-MP model and cloud fraction and pressure information from the FRESCO-S algorithm (van Geffen et al., 2022).

- 170 Validation by comparison with other observations has shown that  $NO_2$  data versions V01.02 01.03 are biased low by up to 50 % over highly polluted regions (Verhoelst et al., 2021). As discussed in several validation studies, this underestimation could be related to biases in the cloud pressure retrieval, to a too high cloud pressure from the FRESCO-S algorithm, in particular when the cloud fractions are low and/or during periods of high aerosol loading. Other factors that could contribute to the underestimation are the low spatial resolution of the used a priori  $NO_2$  profiles from the TM5-MP global chemistry transport
- 175 model, the use of the OMI LER climatology given on a grid of 0.5° x 0.5° for the AMF and cloud fraction retrieval in the NO<sub>2</sub> fit window and the GOME-2 LER climatology used for the NIR-FRESCO cloud retrieval given on a grid of 0.25° x 0.25° measured at mid-morning. These LER climatologies are not optimal for TROPOMI, because of TROPOMI's higher spatial resolution and the missing consideration of the viewing angle dependency in the LER products (see e.g., Judd et al., 2020; Verhoelst et al., 2021; van Geffen et al., 2022). In V02.04.00, operational since July 2022, a DLER climatology derived from
- 180 TROPOMI measurements given on a resolution of  $0.125^{\circ} \times 0.125^{\circ}$  is applied for AMF and cloud fraction retrieval in the NO<sub>2</sub> fit window and to the NIR-FRESCO cloud retrieval (Eskes and Eichmann, 2022).

#### 3.1.2 Scientific TROPOMI NO<sub>2</sub> V01.03.02 CAMS product

The scientific TROPOMI NO<sub>2</sub> V01.03.02 CAMS product is based on the operational OFFL V01.03.02 product. The original 1° x 1° TM5 a priori NO<sub>2</sub> profiles are replaced by the Copernicus Atmospheric Monitoring Service (CAMS) analyses. AMFs and tropospheric NO<sub>2</sub> VCDs were recalculated using the averaging kernels and other quantities available in the L2 NO<sub>2</sub> files, following the recipe provided in the TROPOMI Product User Manual. Between the surface and 3 km the CAMS European regional analyses with an improved resolution of 0.1° x 0.1° are used. For altitudes between 3 km and the tropopause the CAMS global analyses are used. More detailed explanations can be found in Douros et al. (2022).

#### 3.1.3 TROPOMI NO<sub>2</sub> PAL V02.03.01 product version

190 Improvements in the TROPOMI NO<sub>2</sub> retrieval led to the OFFL V02.02 product, which is operationally produced, since 1 July 2021. To obtain a harmonized dataset, a complete mission reprocessing was performed using the latest operational version OFFL V02.03.01, of 14 November 2021. The reprocessed data version available from 1 May 2018 to 14 November 2021 is labeled as PAL V02.03.01. This provided the opportunity to compare the campaign dataset to the OFFL V01.03.02 and the new





PAL V02.03.01 version. The main change compared to the OFFL V01.03.02 is the use of the FRESCO-wide algorithm, which
was already introduced in V01.04.00 and was operational from 29 November 2020 to 1 July 2021, instead of the FRESCO-S algorithm. The FRESCO-wide algorithm provides lower and therefore more realistic cloud pressures (i.e. clouds are at higher altitudes), especially for scenes when cloud fractions are low. This change results in decreased tropospheric AMFs, which lead to higher tropospheric NO<sub>2</sub> VCDs. For cloud-free scenes the surface albedo is corrected by using the observed reflectance. This increases the tropospheric NO<sub>2</sub> VCDs by about 15 % over polluted regions in case the retrieved cloud fraction is zero.
Typically, the new data version increased the tropospheric NO<sub>2</sub> VCDs by 10 % to 40 % compared to the version V1.x data, depending on season and pollution. The largest increase is found in wintertime at mid and high latitudes. First comparisons to ground-based measurements show an improvement of the negative bias of the TROPOMI tropospheric NO<sub>2</sub> VCDs from on

# average -32 % to -23 % (van Geffen et al., 2022).

### 3.1.4 Scientific TROPOMI NO<sub>2</sub> IUP V02.03.01 product

For the evaluation of the influence of auxiliary data on the TROPOMI NO<sub>2</sub> product, we developed a customized scientific product rebuilding the V02.03.01 data version, named IUP V02.03.01. The IUP V02.03.01 gives the possibility to change the a priori assumptions such as surface reflectance, which cannot be done using the averaging kernel approach used for V01.03.02 CAMS.

The a priori NO<sub>2</sub> vertical profile shapes for the TROPOMI NO<sub>2</sub> retrieval are taken from the TM5 model and have a resolution of  $1^{\circ} x 1^{\circ}$  (~100 km x 100 km), which is much coarser than the TROPOMI data (3.5 km x 5.5 km). In highly polluted regions, such as the campaign area, high spatial variability of NO<sub>2</sub> VCDs are observed. The NO<sub>2</sub> plumes from sources, such as power plants, industrial complexes or cities, cannot be resolved in the model. To demonstrate the impact of higher resolved a priori NO<sub>2</sub> vertical profiles, we recalculated AMFs and the tropospheric NO<sub>2</sub> VCDs using a priori tropospheric profiles from the 0.1° x 0.1° CAMS regional analyses for altitudes between the surface and 3 km. For altitudes between 3 km and the tropopause,

215 where horizontal variability is in general small, the TM5 model analyses are used. Two maps showing the NO<sub>2</sub> distribution of the CAMS regional and the TM5 analyses for the campaign region can be found in the Appendix Fig. A1. In the following, this data version using the CAMS regional analyses is called IUP V02.03.01 REG.

The surface reflectivity information from the 5-year OMI LER climatology, used for the operational TROPOMI AMF calculations has a resolution of 0.5° x 0.5°. After more than 3 years of TROPOMI data acquisition, a TROPOMI surface reflectivity

- 220 database, estimated from 36 months of TROPOMI v1.0.0 level-1b data, provides LER data, as a function of month, wavelength, latitude and longitude and at a finer spatial resolution of 0.125° x 0.125°, made possible by the smaller pixel size of TROPOMI (Tilstra, 2022). The recalculation of AMFs with a lookup-table created with the radiative transfer model SCIATRAN (Rozanov et al., 2014) using the regional CAMS NO<sub>2</sub> profiles and the TROPOMI LER results in the product named IUP V02.03.01 REG TROPOMI LER. The use of the TROPOMI LER in this data set is limited to the NO<sub>2</sub> AMFs and not extended to the cloud retrieval.
  - In addition to the traditional LER database, a directionally dependent LER (DLER) has been generated using TROPOMI data. The DLER database is in addition a function of the TROPOMI viewing direction and provides generally higher values than the



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LER database, which does not take into account the directional dependence of the surface reflectance (Tilstra, 2022). Recalculating AMFs with the regional CAMS NO<sub>2</sub> profiles and the TROPOMI DLER yields the IUP V02.03.01 REG DLER product, which again does not recalculate cloud parameters.

The different TROPOMI NO<sub>2</sub> product versions with their most important differences are summarized in Tab. 3.

TROPOMI NO <sub>2</sub> product versions	NO <sub>2</sub> vertical profile	Reflectivity	Clouds	Comments, Availability
OFFL V01.03.02	TM5	OMI LER	FRESCO-S	operational 26 Jun 2019 - 29 Nov 2020
OFFL V01.03.02 CAMS	CAMS regional < 3 km	OMI LER	FRESCO-S	scientific, based on OFFL V01.03.02
	CAMS global > 3 km			
PAL V02.03.01	TM5	OMI LER	FRESCO-W	operational 4 Nov 2021 - 17 Jul 2022
				as OFFL V02.03.01
				reprocessed 1 May 2018 - 14 Nov 2021
				as PAL V02.03.01
IUP V02.03.01	TM5	OMI LER	FRESCO-W	scientific, similar to PAL V02.03.01,
				a priori assumptions can be changed,
				campaign period
IUP V02.03.01 REG	CAMS regional < 3 km	OMI LER	FRESCO-W	scientific, campaign period
	TM5 > 3  km			
IUP V02.03.01 REG TROPOMI LER	CAMS regional < 3 km	TROPOMI LER	FRESCO-W	scientific, campaign period
	TM5 > 3  km			
IUP V02.03.01 REG TROPOMI DLER	CAMS regional < 3 km	TROPOMI DLER	FRESCO-W	scientific, campaign period
	TM5 > 3  km			

Table 3. TROPOMI NO2 product versions with the most important differences between the analyzed products.

#### 3.1.5 S5P TROPOMI dataset

In the present study, we evaluate the TROPOMI tropospheric NO<sub>2</sub> VCD product from 12 September to 18 September 2020 of the two described data versions OFFL V01.03.02 and PAL V02.03.01, as well as several scientific data products. Each TROPOMI pixel has a quality assurance value (qa\_value) indicating the quality of the processing and retrieval result.

Following the recommendation by Eskes and Eichmann (2022), we only use measurements with a qa\_value above 0.75 for all used TROPOMI data products. This removes problematic retrievals and measurements with cloud radiance fractions of more than 50 % Figure 2 shows the monthly average of the trapsopheric NO<sub>2</sub> VCD using the TROPOMI PAL V02 03 01

240 more than 50%. Figure 2 shows the monthly average of the tropospheric NO<sub>2</sub> VCD using the TROPOMI PAL V02.03.01 product for central Europe (left) in September 2020 and a close-up of the S5P-VAL-DE-Ruhr campaign region (right). Large tropospheric NO<sub>2</sub> VCDs are observed in central Europe, e.g., over Paris, London, Milan, and Antwerp, with the largest values





of  $1.6 \cdot 10^{16} \text{ molec cm}^{-2}$  in the campaign region in North Rhine-Westphalia. The area is clearly distinguished from surrounding rural areas, which have low tropospheric NO<sub>2</sub> VCDs below approximately  $3 \cdot 10^{15} \text{ molec cm}^{-2}$ .



**Figure 2.** S5P TROPOMI tropospheric  $NO_2$  VCD taken from the PAL V02.03.01 product for the month of September 2020, in central Europe (left) and a close-up map of the campaign target area, North Rhine-Westphalia (right). The research flight areas and the ground-based measurement sites are shown.

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# 3.2 AirMAP

AirMAP, an airborne imaging spectrometer developed by the Institute of Environmental Physics in Bremen (IUP-Bremen), has been used in several campaigns for trace gas measurements and pollution mapping (Schönhardt et al., 2015; Meier et al., 2017; Tack et al., 2019; Merlaud et al., 2020). During the campaign, AirMAP was installed on a Cessna 207-Turbo, operated by the

- 250 Freie Universität Berlin. AirMAP is a push-broom imaging DOAS instrument with the ability to create spatially continuous and nearly gap-free measurements. The scattered sunlight from below the aircraft is collected with a wide-angle entrance optic resulting in an across track field of view of around 52°. This leads to a swath width of approximately 3 km, about the same size as the flight altitude, during the campaign. With a sorted fiber bundle of 35 fibers, vertically stacked at the spectrometer entrance slit, orthogonally oriented to the flight direction, the radiation is coupled into the UV-Vis imaging grating spectrometer.
- The used  $400 \,\mathrm{g}\,\mathrm{mm}^{-1}$  grating, blazed at  $400 \,\mathrm{nm}$  provides measurements in the  $429 492 \,\mathrm{nm}$  wavelength range, with a spectral resolution between 0.9 nm and 1.6 nm full width at half maximum. The spectrometer is temperature stabilized at  $35^{\circ}$  C. The





along-track resolution depends on the speed of the aircraft (around  $60 \text{ m s}^{-1}$ ) and the exposure time (0.5 s). At a flight altitude of 3300 m, this results in a typical ground scene having a footprint of around 100 m x 30 m. More details about AirMAP can be found in Schönhardt et al. (2015), Meier et al. (2017) and Tack et al. (2019).

# 260 3.2.1 AirMAP data retrieval

For the NO<sub>2</sub> retrieval, the DOAS method is applied to the measured spectra in a fitting window of 438 - 490 nm. The NO<sub>2</sub> differential slant column densities (dSCD) are retrieved relative to in-flight-measured reference background spectra, which were measured over a region with small NO<sub>2</sub> concentrations during the same flight. The dSCDs are converted to tropospheric slant column densities (SCD<sup>trop</sup>) by correcting for the amount of NO<sub>2</sub> in the reference background measurement (SCD<sub>ref</sub>):

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$$SCD^{trop} = dSCD + SCD_{ref} = dSCD + VCD_{ref}^{trop} \cdot AMF_{ref}^{trop}$$
 (1)

For the conversion to the desired tropospheric VCDs (VCD<sup>trop</sup>), the SCD<sup>trop</sup> are divided by the tropospheric airmass factors (AMF<sup>trop</sup>):

$$VCD^{trop} = \frac{SCD^{trop}}{AMF^{trop}} = \frac{dSCD + VCD_{ref}^{trop} \cdot AMF_{ref}^{trop}}{AMF^{trop}}$$
(2)

To correct for the NO<sub>2</sub> in the reference spectrum (SCD<sub>ref</sub>), we assume a tropospheric VCD of  $1 \cdot 10^{15}$  molec cm<sup>-2</sup> over the reference background region, which is a typical value during summer in Europe (Popp et al., 2012; Huijnen et al., 2010). All measurements of the campaign were performed around noon during the S5P overpass. With measurement times of around 3 h the time between the reference background and the actual measurement is relatively small. We assume that the effect of the changing solar zenith angle (SZA) and the diurnal variation of the stratospheric NO<sub>2</sub> concentration are small, and a stratospheric correction of the measurement data is therefore not necessary.

- 275 The AMF calculated using SCIATRAN estimates the relative light path length through the absorbing layer by accounting for the effects of sun and viewing geometry, surface reflectance, aerosols and the  $NO_2$  profile assuming cloud free conditions. As only limited information about the  $NO_2$  profile is available in the campaign area, and the profile shape is expected to vary strongly within each flight region every day, we use the assumption of a 1 km box profile. This assumption is supported by typical boundary layer heights of approximately 1 km in the measurement area and time (ERA5 reanalysis data are freely available
- 280 from the Copernicus Climate Change (C3S) climate data store (CDS), Hersbach et al. (2018)). Input parameters related to aerosols (single scattering albedo, asymmetry factor and aerosol optical thickness) were extracted from the AERONET station FZJ-JOYCE at the Jülich research center (Löhnert et al., 2015), which is the only known source providing aerosol information in the campaign area. During the campaign measurement days, the daily averages of aerosol optical thickness (AOT) at 440 nm measured at FZJ-JOYCE ranged between 0.235 and 0.398 with a mean value of 0.285. This information is spatially constrained,
- and the situation can differ during the flights in the Duisburg and Cologne area. A sensitivity study using AMFs for a range of AOTs between 0.003 and 0.6 for the AirMAP NO<sub>2</sub> VCD retrieval demonstrated that the influence on the AirMAP tropospheric NO<sub>2</sub> VCD dataset is small (< 1 %, comparing AirMAP tropospheric NO<sub>2</sub> VCDs assuming AOTs of 0.003 and 0.6). TROPOMI and AirMAP tropospheric NO<sub>2</sub> VCD scatter plots for AOTs of 0.003, 0.3 and 0.6 can be found in the Appendix Fig. A2.



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Considering the mean AOT of 0.285 from the AERONET station and the results from the sensitivity study, the AirMAP dataset was retrieved using an AOT of 0.3 for all measurement days.

Surfaces with different brightness introduce artefacts in the maps of  $NO_2$ , which need to be corrected by accounting for the surface reflectance in the AMF calculations. As far as we are aware, reflectance data, having a sufficient spatial resolution are not available for the region of our flight campaign. Therefore, we use the individual AirMAP recorded intensities together with a method, based on a reference area with a known surface reflectance taken from the ADAM database (A surface reflectance DAtabase for ESA's earth observation Missions, Prunet et al. (2013)) and a look-up table of AirMAP radiances. Detailed

295 DAtabase for ESA's earth observation Missions, Prunet et al. (2013)) and a look-up table of AirMAP radiances. Detailed information about the derivation of the surface reflectance and also about the general conversion from dSCDs to tropospheric NO<sub>2</sub> VCDs can be found in Meier et al. (2017).

The total uncertainty on the tropospheric  $NO_2$  VCD comprises error sources of the dSCD retrieval, the estimation of the  $NO_2$  in the reference background spectrum and the AMF calculation. We follow the same approach for error estimation and thus the same assumptions, as made in Meier et al. (2017) and Tack et al. (2019), further details can be found therein.

The total uncertainty of the AirMAP tropospheric NO<sub>2</sub> VCD follows the error propagation of the three error sources given by:

$$\sigma_{\rm VCD^{trop}} = \sqrt{\left(\frac{\sigma_{\rm dSCD}}{\rm AMF^{trop}}\right)^2 + \left(\frac{\sigma_{\rm SCD_{ref}}}{\rm AMF^{trop}}\right)^2 \left(\frac{\rm SCD^{trop}}{\rm AMF^{trop^2}} \cdot \sigma_{\rm AMF^{trop}}\right)^2} \tag{3}$$

The error from the dSCD retrieval is estimated from the fit residual and is a direct output of the DOAS retrieval algorithm. Since no direct measurements of the NO<sub>2</sub> column in the reference ground scene exist, we assume a systematic error with an uncertainty of 100 % on the estimated value of  $1 \cdot 10^{15}$  molec cm<sup>-2</sup>. The error resulting from the AMF determination depends in large part on the values of the uncertainty attributed to the surface reflectance, the accuracy of the NO<sub>2</sub> vertical profile, and the aerosol optical depth as a function of altitude and location. Following Meier et al. 2017, the total error on the AMF is estimated to be smaller than 26 %. Taking the mean dSCD value and the mean dSCD error in polluted regions as typical values, the total error of the tropospheric NO<sub>2</sub> VCD is ~30 %. More details on error contributions can be found in Meier et al. (2017).

#### 310 3.2.2 AirMAP campaign dataset

Figure 3 shows a timeseries of tropospheric  $NO_2$  VCDs measured by AirMAP for each of the seven flight days of the campaign. The mean over the 35 viewing directions is shown in dark colors and their standard deviation in light colors. The colors red, blue and green represent the respective research flight areas around Cologne, Jülich and Duisburg. The S5P overpass times with respective viewing zenith angle (VZA) and the times of the AirMAP reference background measurement are marked

- by the vertical dashed lines. Two flights were performed in the research flight area around Cologne (red), two flights in the Jülich area (blue) and three flights in the Duisburg area (green). The first two flights, shown in Fig. 3 are weekend days, a Saturday, and a Sunday. The columns show strong variability between the different target areas and from day to day with the highest tropospheric NO<sub>2</sub> VCDs being ~  $5 \cdot 10^{16}$  molec cm<sup>-2</sup> over the Duisburg area on Monday 14 September and Tuesday 15 September 2020 and much lower values for both flights in the Cologne area, having tropospheric NO<sub>2</sub> VCDs of up to
- 320  $2.5 \cdot 10^{16} \,\mathrm{molec} \,\mathrm{cm}^{-2}$ . Maps of the tropospheric NO<sub>2</sub> VCD for each flight are displayed in Fig. 4.







**Figure 3.** Plots of the AirMAP timeseries of tropospheric  $NO_2$  VCD (mean over the 35 viewing directions with standard deviation as dark line and bright area, respectively) for the seven flight days from Saturday 12 September 2020 – Friday 18 September 2020. These show strong variability from day to day (weekday vs weekend) and between the different target areas (Cologne, Jülich, Duisburg). The dashed black vertical lines indicate S5P overpass times with their viewing zenith angle. The dashed colored vertical lines indicate the times of the AirMAP reference measurement.







Figure 4. Maps of VCD NO<sub>2</sub> from AirMAP flights from 12 September to 18 September 2020. Two flights in the research flight area around Cologne (left column), two flights in the flight area around Jülich (second column) and three flights in the flight area around Duisburg (third and fourth column). The mean wind direction and speed in the flight area, determined from ERA5 10 m wind data for the middle of the flight, are given in the top left corner.

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Jülich research flight area: The tropospheric NO<sub>2</sub> VCD over the Jülich flight area is smaller during the flight on Sunday 13 September than on Thursday 17 September, where several peaks in the NO<sub>2</sub> VCD up to  $2.5 \cdot 10^{16}$  molec cm<sup>-2</sup> are visible. These peaks are caused by plumes of NO<sub>2</sub> coming from three large power plants, located in the Jülich research flight area, which are clearly visible in the maps of the AirMAP NO<sub>2</sub> VCD in Fig. 4. Two power plants are located in the Northeast and one in the Southwest of the Jülich flight area. The plumes, which have enhanced tropospheric NO<sub>2</sub> VCDs compared to low background VCDs outside of the plume, are blown in the mean wind direction in the flight area (shown in the top left corner of the maps) determined from ERA5 10 m wind data (Hersbach et al., 2018) for the middle of the flight. Differences between the two measurement days over the Jülich flight area are related to wind conditions potentially enhanced by a weekend effect. On Sunday 13 September, there was a weak wind coming from the Southwest blowing the plumes to the Northeast, thus two out of three plumes were mostly outside the flight area and cleaner air from a rural area was prevalent. On Thursday 17 September,

Duisburg research flight area: The three maps from flights over the Duisburg flight area show the strong  $NO_x$  emissions from power plants and the industrial area in Duisburg with plumes oriented depending on wind direction.

a stronger wind coming from the opposite direction, the Northeast, was blowing the plumes to the Southwest.





335 Cologne research flight area: The two AirMAP measurement flights in the Cologne area show only slightly enhanced NO<sub>2</sub> amounts compared to the background tropospheric NO<sub>2</sub> VCD on both days.

#### 3.3 Car DOAS instruments

During the S5P-VAL-DE-Ruhr campaign, mobile car DOAS measurements were performed by three institutions, the Institute of Environmental Physics, University of Bremen (IUP), the Max Planck Institute for Chemistry in Mainz (MPIC) and the Royal Belgian Institute for Space Aeronomy (BIRA). More information about the different car DOAS instruments can be

- 340 Royal Belgian Institute for Space Aeronomy (BIRA). More information about the different car DOAS instruments can be found in Schreier et al. (2019), Donner (2016), and Merlaud (2013). The measurement elevation angle was for the majority of the measurements in zenith-sky with some off-zenith measurements. These measurements are used in the estimation of the NO<sub>2</sub> SCD in the reference spectrum and the stratospheric NO<sub>2</sub> contribution for the BIRA and MPIC car DOAS measurements. The focus on zenith-sky measurements during driving has the advantage of a stable viewing direction when the direction of
- travel changes, variations from relative azimuth changes are avoided and measurements cannot be blocked by buildings, which can be a large problem in cities. In addition, the highest horizontal resolution is achieved with this viewing geometry.

# 3.3.1 IUP car DOAS instrument and data retrieval

The IUP car DOAS instrument uses an experimental setup, which comprises an Avantes spectrometer and a light fiber with a fixed viewing direction to the zenith measuring scattered sun light in the UV-Vis range. Collected spectra are averaged over 10 s, which corresponds to travelled distances of around 80 - 300 m, depending on the driving speed. The DOAS method is applied to the measured spectra in a fitting window of 425 - 490 nm. The tropospheric NO<sub>2</sub> VCD from car DOAS zenith-sky measurements is determined in a similar manner to that used for the AirMAP measurements by the following equation:

$$VCD^{trop} = \frac{dSCD + SCD_{ref} - VCD^{strat} \cdot AMF^{strat}}{AMF^{trop}}$$

$$=\frac{dSCD + VCD_{ref}^{trop} \cdot AMF_{ref}^{trop} + VCD_{ref}^{strat} \cdot AMF_{ref}^{strat} - VCD^{strat} \cdot AMF^{strat}}{AMF^{trop}}$$
(4)

The dSCD are retrieved relative to reference background spectra, measured in a region with small NO<sub>2</sub> concentrations on 13 September around noon. The SCD<sub>ref</sub> cannot be measured directly. Similar to the AirMAP VCD determination, the NO<sub>2</sub> in the reference background spectrum is corrected for by assuming a tropospheric NO<sub>2</sub> VCD of  $1.5 \cdot 10^{15}$  molec cm<sup>-2</sup> over the reference background region. Since we used a fixed reference background measurement for all car DOAS measurement days, a stratospheric correction based on the Bremen 3d chemistry transport model (B3dCTM, Hilboll et al. (2013b)), providing the diurnal cycle of the stratospheric NO<sub>2</sub> VCDs, scaled to TROPOMI stratospheric VCDs in the measurement area is applied to the car DOAS data. Stratospheric AMFs are calculated with the radiative transfer model SCIATRAN (Rozanov et al., 2014) as function of the solar zenith angle (SZA). For the conversion of tropospheric SCDs to tropospheric NO<sub>2</sub> VCDs, a constant tropospheric AMF of 1.3 with an assumed uncertainty of 20 % was used. The AMF of 1.3 for an elevation angle of 90° is closer





to the true AMF (derived from radiative transfer simulations) than the geometric approximation for the tropospheric AMF of 1 (Shaiganfar et al., 2011; Merlaud, 2013; Schreier et al., 2019).

#### 365 3.3.2 MPIC car DOAS instrument and data retrieval

The MPIC car DOAS instrument uses an Avantes spectrometer with an active temperature stabilization and takes in addition to the zenith-sky measurements also off-axis measurements at 22° elevation. During the validation measurement period, only zenith-sky measurements were used to increase spatial and temporal coverage. The integration time was 30 s. Before and after the validation measurements, the elevation angles alternate between 22° elevation and zenith-sky (90°). The combination of both angles allows the determination of the absorption in the reference spectrum, as well as the absorption in the stratosphere. The DOAS analysis is performed in a wavelength interval of 400 - 460 nm using a daily fixed reference background at 90° elevation, at low SZA in a region with small NO<sub>2</sub> concentrations. NO<sub>2</sub> dSCDs retrieved from the DOAS analysis are converted to tropospheric NO<sub>2</sub> VCDs by using Eq. 4 (see also Wagner et al. (2010) and Ibrahim et al. (2010). Measurements in scan mode are used to calculate the NO<sub>2</sub> in the reference spectra, SCD<sub>ref</sub>, and the stratospheric SCD. Radiative transfer model calculations

375 for NO<sub>2</sub> box profiles of 500 m or 1000 m and moderate aerosol loads provide on average tropospheric AMFs of 3 and 1.3 with an assumed uncertainty of 20 % for the 22° and 90° elevation angle measurements, respectively (Shaiganfar et al., 2011).

#### 3.3.3 BIRA car DOAS instrument and data retrieval

The BIRA car DOAS instrument consists of two Avantes spectrometers measuring simultaneously scattered light in 90° and 30° elevation. Individual spectra are co-added, and the DOAS analysis is performed in a wavelength interval of 450 - 515 nm on spectra averaged every 30 s using a single pair of time-coincident low SZA zenith reference spectra for all measurement days. The measurements on both channels being simultaneous, the retrieval of tropospheric NO<sub>2</sub> VCDs follows the MAX-DOAS principle (see Eq. 6), using the differences in dSCDs and AMFs for two elevation angles. For the AMFs, a sun position-dependent look-up table (LUT) is used. This LUT was calculated using DISORT and provides AMFs of 2.5 and 1.3 for the 30° and 90° elevation angle measurements, respectively (Merlaud, 2013). An additional zenith-DOAS instrument was operated for SO<sub>2</sub> measurements, results are not shown in this study.

#### 3.3.4 Car DOAS campaign dataset

For the verification of the car measurements, regular collocations of the cars were used at selected meeting points and overlapping measurement routes. In general, the car DOAS measurements were planned in a way that each car made measurements during a round trip of a large part of the research flight area. The routes were also chosen to pass by the ground-based measure-

390 ment stations. The duration of the car measurements was typically around 4 h per day. This enabled measurements to be made during the complete AirMAP flight and the S5P overpass times to gather many and closely collocated measurements. Several round trips, about three to four, were performed, dependent on traffic conditions. In addition to spatial variations of  $NO_2$  also temporal changes are observed.





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Figure 5 shows maps of car DOAS tropospheric NO<sub>2</sub> VCDs for three days in the research flight areas around Duisburg, Jülich and Cologne, respectively. Measurements are within  $\pm 1$  h of the S5P overpass time given in the figure title. As already seen in the AirMAP data, strong variability between the different flight areas is observed. Maps of all seven measurement days are shown in the Appendix (Fig. A3). The highest amounts of NO<sub>2</sub> are visible around Duisburg with high spatial variability within the flight area. The lowest amounts of NO<sub>2</sub> are found in the area around Cologne, which confirms the findings of the AirMAP measurements. The car DOAS measurements in the Jülich area show enhanced NO<sub>2</sub> values where the AirMAP measurements also see the plumes of the two power plants located in the Northeast of the flight area.



Figure 5. Maps of tropospheric NO<sub>2</sub> VCDs for three days from car DOAS measurements in the research flight areas around Duisburg, Jülich and Cologne. Measurements are within  $\pm 1$  h of the S5P overpass time given in the title. Maps of all seven measurement days are shown in the Appendix Fig. A3.

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#### 3.4 Ground-based instruments

During the campaign period, six ground-based instruments, two zenith-sky DOAS, two MAX-DOAS and two Pandora instruments were measuring in the different target areas. The instrument locations are marked in the map of the TROPOMI tropospheric  $NO_2$  VCDs in Fig. 2 and the flight overview map in Fig. 1.

#### 405 3.4.1 Zenith-sky DOAS

Two zenith-sky DOAS instruments were deployed and operated within the Ruhr area for several months. The instruments use an experimental setup, which comprises an Avantes spectrometer (290 - 550 nm) and a light fiber with a fixed viewing direction to the zenith measuring scattered sun light in the UV-Vis spectral range. One instrument is located at the Jülich research center next to the Pandora (Zenith-DOAS JUE) and the second at a local residence in Gelsenkirchen (Zenith-DOAS GEL), in the

410 Duisburg research flight area. The tropospheric NO<sub>2</sub> VCDs are estimated from the dSCDs resulting from the DOAS fit using





the following conversion:

$$VCD^{trop} = \frac{dSCD + SCD_{ref} - VCD^{strat} \cdot AMF^{strat}}{AMF^{trop}}$$
(5)

For the reference background spectra in the DOAS fit, we use a fixed spectrum taken in summer on a clean day around noon. The amount of  $NO_2$  in the reference background spectrum,  $SCD_{ref}$ , is determined from the long time series using the lowest measured NO. For the measurements made by the Calconkirchen genith elay DOAS instrument, this is a SCD.

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lowest measured NO<sub>2</sub>. For the measurements made by the Gelsenkirchen zenith-sky DOAS instrument, this is a SCD<sub>ref</sub> of  $1.7 \cdot 10^{16}$  molec cm<sup>-2</sup>. For the Jülich zenith-sky instrument, the SCD<sub>ref</sub> is determined as  $1.0 \cdot 10^{16}$  molec cm<sup>-2</sup> using the same approach. An uncertainty of 30 % for the SCD in the reference spectrum is assumed. The VCD<sub>strat</sub>, is estimated from twilight Langley fits with an uncertainty of  $2 \cdot 10^{14}$  molec cm<sup>-2</sup>, and the stratospheric AMFs are obtained from SCIATRAN calculations. For the tropospheric AMF we use the same value of 1.3 as for the car DOAS.

#### 420 3.4.2 MAX-DOAS measurement truck

From 7 September to 19 September 2020, the IUP Bremen measurement truck performed MAX-DOAS measurements in the harbor area of Duisburg close to the Rhine River (MAX-DOAS DUI). This MAX-DOAS instrument uses a UV spectrometer (282 - 412 nm) with a light fiber connected to a telescope on a pan-tilt head and was scanning in multiple elevation angles. The tropospheric NO<sub>2</sub> VCDs are estimated from the dSCD measurements in 30° elevation angle with a sequential zenith sky reference spectrum (interpolated from the zenith sky measurements shortly before and after the off-axis measurement):

$$VCD^{trop} = \frac{dSCD(30^{\circ})}{AMF^{trop}(30^{\circ}) - AMF^{trop}(90^{\circ})}$$
(6)

Similar to the car and zenith-sky DOAS measurements, AMFs of 2.5 and 1.3 for elevation angles of  $30^{\circ}$  and  $90^{\circ}$ , respectively, are used as they are closer to the true AMF from radiative transfer calculations than the geometric approximation for the tropospheric AMF. The total uncertainty of the tropospheric NO<sub>2</sub> VCD originates from uncertainties in the retrieved dSCD, which results mainly as the error of the DOAS fit, and uncertainties from the AMF.

#### 3.4.3 BIRA SkySpec MAX-DOAS

A further MAX-DOAS instrument was setup at the airport Schwarze Heide in Dinslaken (MAX-DOAS AIRPT) from 3 August 2020 to 29 September 2020. The instrument, deployed by BIRA, was an Airyx Compact SkySpec MAX-DOAS, based on an Avantes spectrometer (300-463 nm). A scanning prism in elevation direction can rotate 180° enabling elevation scan

435 measurements in two azimuthal directions (Airyx GmbH, 2022). At the airport, the instrument was scanning in azimuths of 132° and 312° and in multiple elevation angles. In this study, only measurements in north-westerly direction (312°) are used for the analysis.

The tropospheric NO<sub>2</sub> VCDs are retrieved by applying the Mexican MAX-DOAS Fit (MMF, Friedrich et al. (2019)) inversion algorithm using dSCDs retrieved with the spectral fitting software QDOAS (Danckaert et al., 2017) using the FRM4DOAS

settings and setup (Hendrick et al., 2016). The tropospheric NO<sub>2</sub> VCD error is calculated from the covariance smoothing error





matrix, the covariance measurement noise error matrix and a systematic error as a fixed fraction of the VCD, based on the systematic uncertainty of the cross section, for NO<sub>2</sub> as 3 % (Vandaele et al., 1998).

#### 3.4.4 Pandora

- The Pandora instrument is a ground-based UV-Vis spectrometer that provides direct Sun total column and sky scan MAXDOAS tropospheric column observations. Two Pandoras are deployed and operated in the campaign area to provide long term measurements. They were installed in August 2019 and are still in operation in 2022. One Pandora is located at the Jülich research center (Pandora JUE) and a second is located in Cologne, district Deutz (Pandora COL). Locations are marked in Fig. 2. All data are processed as part of the Pandonia Global Network (PGN, https://www.pandonia-global-network.org/, last access: 18 March 2022). Tropospheric NO<sub>2</sub> VCDs are provided using the Blick processing software (BlickP) with a
  NO<sub>2</sub> retrieval algorithm and empirical AMFs determined by comparison of coincident sky scan MAX-DOAS and direct-sun
- $NO_2$  retrieval algorithm and empirical AMPs determined by comparison of concident sky scale MAX-DOAS and direct-sum observations. NO<sub>2</sub> values are given, together with the respective uncertainty, as tropospheric NO<sub>2</sub> VCD. The analyzed data is labelled with quality flags, which indicate whether the data is quality assured, whether the data quality is high, medium or low, and whether the data is usable or not. Only data with a quality flag accounting for high and medium quality (assured as well as not assured) are used.

#### 455 4 Evaluating airborne tropospheric NO<sub>2</sub> VCD with stationary ground-based data

- The data set of the stationary ground-based instruments, deployed at different sites in the three selected flight areas, is used to evaluate the AirMAP tropospheric NO<sub>2</sub> VCD. This, together with the mobile measurements, provides a basis for using the AirMAP data for the evaluation of the TROPOMI tropospheric NO<sub>2</sub> VCD. During the campaign, AirMAP overflights were conducted for all ground-based measurement stations. A scatter plot of all coincident measurements is shown in Fig. 6. Each point is colored according to its instrument type and location. The shown AirMAP tropospheric NO<sub>2</sub> VCD, are averages of the measurements from an area of 500 m x 500 m around the ground-based measurement station. This is then assigned to the selected ground-based stationary measurements, which are averaged in time intervals of 20 min around the AirMAP overpass time. In total 23 coincident measurements were obtained by this procedure. Error bars of Fig. 6 represent the error in the tropospheric NO<sub>2</sub> VCD retrieval, averaged within the 500 m x 500 m grid boxes and 20 min time intervals. Fitting of
- the data was done with orthogonal distance regression, as for all following data shown in the present study. The AirMAP and ground-based tropospheric NO<sub>2</sub> VCDs are highly correlated (Pearson correlation coefficient r = 0.87) with a slope and standard deviation of  $0.93 \pm 0.09$ . Overall, the data show good agreement with a tendency of slightly larger values from the ground-based instruments as compared to the airborne data. Part of the scatter and deviation may result from the different retrieval algorithms with different assumptions on radiative transfer, aerosols and reference background spectra. Additionally,
- 470 spatiotemporal variability of NO<sub>2</sub> is influencing the agreement of the comparison. Figure A4 in the Appendix shows the same as Fig. 6, but error bars represent the  $\pm$  10th – 90th percentiles within the 500 m x 500 m grid boxes and 15 min time intervals to illustrate the spatiotemporal variability within the comparison criteria.







Figure 6. Scatter plot of AirMAP data against the stationary ground-based NO<sub>2</sub> VCDs averaged over a time interval of 20 min closest to the aircraft overpass data, which are averaged over a 500 m x 500 m box around the station site. Each point is colored according to its instrument type and location. Error bars represent the error in the tropospheric NO<sub>2</sub> VCD retrieval, averaged within the  $500 \text{ m} \times 500 \text{ m}$  grid boxes and 20 min time intervals. The 1:1 line is indicated by the grey dashed line. The solid black line represents the orthogonal distance regression.

#### Evaluating airborne tropospheric NO<sub>2</sub> VCD with car DOAS data 5

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The mobile car DOAS measurements performed by IUP, MPIC and BIRA were synchronized to the AirMAP measurements. They were measuring during the complete flight in the same area as the AirMAP instrument to gather many closely collocated measurements between the instruments. The data is used, in addition to the stationary ground-based measurements, to evaluate the tropospheric  $NO_2$  VCD maps retrieved from AirMAP. Compared to the stationary data, the car measurements have the advantage that they can cover larger and more diverse areas and thus potentially also a wider range of  $NO_2$  values. As a result of having more opportunities to make near simultaneous synchronized measurements, a larger number of collocated measurements can be compared. For the comparison, the car DOAS measurements are averaged in time intervals of 15 min and 480 gridded in boxes of 500 m x 500 m. The same grid is applied to the AirMAP measurements and a comparison of measurements in the same grid box and time interval is performed. Scatter plots of all coincident car DOAS and AirMAP measurements fulfilling a time criterion of  $\pm 15$  min are shown in Fig. 7. In the left plot each point is colored by the respective car DOAS





instrument. In the right plot the color coding shows the time difference between the AirMAP and car DOAS measurement.
In total, 572 pairs of coincident measurements are considered. Error bars of Fig. 7 represent the error in the tropospheric NO<sub>2</sub> VCD retrieval, averaged within the 500 m x 500 m grid boxes and 15 min time intervals. The comparison shows a good correlation between the airborne and car DOAS instruments, with a correlation coefficient of r = 0.89. The orthogonal distance regression reveals a slope of 0.98 ± 0.02, i.e. close to unity. Considering tropospheric NO<sub>2</sub> VCD retrieval errors, that the data retrieved from the different instruments used for this comparison were analyzed independently by the different groups and retrieval methods are only partly harmonized, with different assumptions about the radiative transfer, aerosols and reference background spectra, the data show good agreement. Coincident measurements that are furthest from the 1:1 line are mostly cases where the time difference was at the outer edge of the time filter criterion and may therefore be caused by the rapid natural variability of NO<sub>2</sub>. Figure A5 shows the same as Fig. 7, but error bars represent the ± 10th – 90th percentiles within the 500 m x 500 m grid boxes and 15 min time intervals to illustrate the spatiotemporal variability.



**Figure 7.** Scatter plots between collocated car DOAS ( $\pm$  15 min window from the aircraft overpass) and AirMAP NO<sub>2</sub> VCDs using grid boxes of 500 m x 500 m and 15 min time intervals. The data points from BIRA, MPIC and IUP car DOAS instruments are color coded red, green and orange (left). The color coding in the right plot shows the time difference between the AirMAP and car DOAS measurements. The 1:1 line is indicated by the grey dashed line. The thick solid black line represents the orthogonal distance regression. Error bars represent the error in the tropospheric NO<sub>2</sub> VCD retrieval, averaged within the 500 m x 500 m grid boxes and 15 min time intervals.

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#### 6 Evaluating TROPOMI tropospheric NO<sub>2</sub> VCD with AirMAP tropospheric NO<sub>2</sub> VCD data

The good agreement of the ground-based stationary and car DOAS dataset with the AirMAP data, gives confidence for using the AirMAP tropospheric  $NO_2$  VCD dataset to evaluate the TROPOMI products. Airborne observations are valuable for the





evaluation of TROPOMI data, as a large number of satellite pixels are mapped in relatively short time. During the S5P-ValDE-Ruhr campaign, the AirMAP flights were synchronized with the time of the respective S5P overpass and measurements were taken at least ± 1 h around the overpass with the smallest VZA, c.f. Fig. 3. To compare the TROPOMI and AirMAP tropospheric NO<sub>2</sub> VCDs, spatial and temporal coincident criteria suggested by Judd et al. (2020) are used. TROPOMI pixels are only considered in the comparison, when they are at least 75 % mapped by AirMAP pixels. AirMAP data are considered when they match the temporal coincidence criteria of ± 30 min around the S5P overpass time. During the seven flight days (for which TROPOMI data are available on six days), AirMAP measured data coincide with 117 TROPOMI pixels. For the comparison of the two datasets, the AirMAP measurements are averaged within the TROPOMI pixel. Maps demonstrating how the AirMAP data are matched to the TROPOMI pixels can be found in the Appendix Fig. A6. The daily maps show TROPOMI

The averaged AirMAP tropospheric NO<sub>2</sub> VCDs are compared to the coincident satellite data for three different TROPOMI 510 NO<sub>2</sub> data versions. Figure 8 shows scatter plots with an orthogonal distance regression analysis of the TROPOMI and AirMAP NO<sub>2</sub> VCDs for (a) the TROPOMI operational OFFL V01.03.02 data, (b) the adapted scientific TROPOMI V01.03.02 CAMS data using CAMS-based NO<sub>2</sub> profiles, and (c) the reprocessed data version PAL V02.03.01. Details on the different data versions are summarized in Tab. 3.

tropospheric NO<sub>2</sub> VCDs of version PAL V02.03.01 and coincident AirMAP data scaled to the TROPOMI pixels.



**Figure 8.** Scatter plots of TROPOMI NO<sub>2</sub> VCDs versus collocated AirMAP NO<sub>2</sub> VCDs for different versions of TROPOMI data: (a) the operational OFFL V01.03.02, (b) the V01.03.02 based on the CAMS NO<sub>2</sub> profiles, (c) the PAL V02.03.01. Collocation criteria for AirMAP:  $\pm$  30 min around S5P overpass, gridded to the TROPOMI pixels and covering them at least to 75%. The horizontal error bars show the 10th–90th percentiles of airborne measurements within the TROPOMI pixel. Vertical error bars show the reported precision of the TROPOMI tropospheric NO<sub>2</sub> VCD. Error bars on the TROPOMI measurements are shown to illustrate their magnitude and are not shown for all further plots for better visibility of the data.





- 515 The horizontal error bars show the 10th 90th percentiles of all airborne measurements within the respective TROPOMI pixel. Vertical error bars show the reported precision of the TROPOMI tropospheric NO<sub>2</sub> VCD. Error bars are shown here only for these three examples to illustrate their magnitude and are not shown in the following plots for a better visibility of the data. The TROPOMI NO<sub>2</sub> VCDs are consistently smaller than the AirMAP VCDs for all three data versions. An investigation of the different available TROPOMI NO<sub>2</sub> data versions compared to the AirMAP data with their different behavior (scatter, low bias) gives further insight into the influence of different a priori assumptions made within each retrieval.
- Figure 8a shows coincidences between the TROPOMI operational OFFL V01.03.02 data and the AirMAP data, with a high correlation coefficient of 0.86, a slope of  $0.38 \pm 0.02$  and an offset of  $2.54 \pm 0.15 \cdot 10^{15}$  molec cm<sup>-2</sup>. The regression parameters and their standard errors are calculated for the plotted data points. Taking the uncertainties of the data points into account and considering the parameters of the orthogonal distance regression over the complete range of these uncertainties yields a
- standard deviation of 0.14 for the slope and  $0.39 \cdot 10^{15}$  molec cm<sup>-2</sup> for the offset. The slope of 0.38 is significantly lower than the 0.68 from comparisons of TROPOMI NO<sub>2</sub> OFFL V01.03.02 data and aircraft measurements in the New York City/Long Island Sound region reported by Judd et al. (2020) and the 0.82 from comparisons of TROPOMI and APEX measurements over Brussels and Antwerp reported by Tack et al. (2021).
- The scientific TROPOMI data version V01.03.02 CAMS based on the OFFL data V01.03.02 has the objective to investigate 530 the influence of the NO<sub>2</sub> profile information by replacing the  $1^{\circ} x 1^{\circ}$  TM5 NO<sub>2</sub> profiles with the spatially higher resolved 0.1° x 0.1° CAMS-based profiles. The scatter plot comparing this TROPOMI data version with the AirMAP data is presented in Fig. 8b and shows a correlation coefficient of 0.86 and a slope of 0.41 ± 0.02. The correlation has not changed compared to the original data version and the slope increased only slightly demonstrating that the replacement of the NO<sub>2</sub> profile has only a small impact on this dataset. In general, the replacement of the NO<sub>2</sub> profile increases the dynamical range of NO<sub>2</sub> VCDs
- with the largest impact (5 30 %) in emission hot spots but is dependent on the location and conditions (Douros et al., 2022). Tack et al. (2021) observed an increasing slope from 0.82 to 0.93 from the original data version to the version using the CAMS regional a priori over Belgium. Thus, the relative difference between the V01.03.02 original and the V01.03.02 CAMS data version is similar with 13 % in Tack et al. (2021) and 8 % found in this study.
- Since already several validation activities reported that the NO<sub>2</sub> data versions V01.02 01.03 are biased low, an improved TROPOMI NO<sub>2</sub> retrieval led to the development of version V02.03.01 and a complete mission reprocessing. The scatter plot comparing this TROPOMI data version (PAL V02.03.01) with the AirMAP data in Fig. 8c shows a correlation coefficient of 0.76 and a slope of  $0.83 \pm 0.06$ . The correlation coefficient is poorer than for the OFFL V01.03.02 changing from 0.86 to 0.76. The slope, however, increased by more than a factor of 2 from 0.38 to 0.83, demonstrating that the improvements in the new TROPOMI NO<sub>2</sub> data version have a large impact on the analyzed dataset from the Rhine-Ruhr region. As described in
- 545 Sect. 3.1, the main change is the switch to the FRESCO-wide product, which provides more realistic higher cloud altitudes for measurements with cloud fractions larger than zero, which is the case for 116 out of 117 TROPOMI measurements used in this study. This results in decreased tropospheric AMFs and therefore higher tropospheric NO<sub>2</sub> VCDs. The improvements in the new TROPOMI NO<sub>2</sub> data version bring the TROPOMI VCDs closer to the airborne measurements, while remaining low biased and have poorer correlation coefficients. However, most of the data points are now closer to the 1:1 line due to





- the increased TROPOMI VCDs, but there is a lower branch of data points (with low TROPOMI NO<sub>2</sub>, but large AirMAP NO<sub>2</sub> VCDs) which is not much affected by the improvements in the new data version and is still matching the pattern of the OFFL V01.03.02 comparison (Fig. 8a). This lower branch is the dominant cause of the low bias in the V02.03.01 data version. Comparisons of coincidences between the AirMAP and TROPOMI OFFL V01.03.02 and PAL V02.03.01 data, on a basis of single days show different magnitudes of the described impact from the TROPOMI data version change (see Appendix Fig.
- 555 A7 and Fig. A8). The addressed lower branch visible in the overall comparison of TROPOMI PAL V02.03.01 and AirMAP (Fig. 8c) is dominated by measurements from 17 September and is linked to FRESCO cloud pressures close to the surface also in the new TROPOMI data version. These high cloud pressures are probably not correct and might be influenced by low cloud fractions or an aerosol load, which FRESCO sees as an effective cloud resulting in too high cloud pressures for this kind of scenes. Aerosol information on the flight days is limited to the AERONET station at the Jülich research center, which is the
- 560 only known source providing aerosol properties and cannot be representative for all target regions. In order to provide more information about aerosol properties with AOTs and extinction profiles, more sun photometers and MAX-DOAS distributed over the campaign area are needed.

#### 6.1 Cloud effects

For TROPOMI the tropospheric NO<sub>2</sub> VCDs are corrected for cloud and aerosol effects by the AMFs accounting for cloud-565 contaminated pixels using a combination of a cloudy tropospheric AMF and a clear-sky tropospheric AMF (AMF<sup>trop</sup><sub>clr</sub>). Due to nearly cloud free conditions during the six measurement days, the determined cloud radiance fractions from the NO<sub>2</sub> window are on average  $0.21 \pm 0.10$  with a maximum of 0.48. To investigate the impact of the cloud correction on the tropospheric NO<sub>2</sub> VCDs, we calculated VCDs without this correction, VCD<sup>trop</sup><sub>no cc</sub>, by:

$$VCD_{no\ cc}^{trop} = \frac{VCD^{trop} \cdot AMF^{trop}}{AMF_{clr}^{trop}}$$
(7)

- 570 Figure 9b shows the scatter plot between the TROPOMI PAL V02.03.01 tropospheric NO<sub>2</sub> VCD without cloud correction and the AirMAP tropospheric NO<sub>2</sub> VCD, having a high correlation of 0.85 and a slope of 0.73 ± 0.04. For comparison Fig. 9a shows the original PAL V02.03.01 tropospheric NO<sub>2</sub> VCD data with cloud correction, having a correlation of 0.76 and a slope of 0.83 ± 0.06. The data version without cloud correction does not show the discussed lower branch anymore, and the upper branch is much reduced. Hence, the product without cloud correction has a much better correlation and illustrates that the two 575 branches are caused by the cloud correction.
  - An additional coincidence criterion is introduced to see the effect of excluding TROPOMI measurements with detected clouds close to the surface, having differences between the cloud pressure and the surface pressure ( $\Delta$ CS) of less than 50 hPa, which is the reported uncertainty of the cloud pressure retrieval (van Geffen et al., 2022). This criterion reduces the number of coincidences from the six measurement days from 117 to 89. The resulting scatter plot is shown in Fig. 9c. The cloud pressure
- filter brings the TROPOMI and AirMAP measurements closer together, changing the slope from  $0.83 \pm 0.06$  to  $0.96 \pm 0.06$ , and increasing the correlation from 0.76 to 0.84. As the cloud treatment produces cloud pressures close to the surface for these measurements, we replace them with the VCDs without cloud correction, shown in Fig. 9d. In this way, the number of







**Figure 9.** Scatter plots of TROPOMI NO<sub>2</sub> VCDs versus collocated AirMAP NO<sub>2</sub> VCDs for different versions of TROPOMI data: (a) PAL V02.03.01, (b) PAL V02.03.01 without cloud correction, (c) PAL V02.03.01 only pixels with surface pressure - cloud pressure  $\Delta$ CS > 50 hPa, (d) PAL V02.03.01 pixels with  $\Delta$ CS < 50 hPa are replaced by NO<sub>2</sub> VCDs without cloud correction.

coincidences is maintained, and the result is a slope of  $0.89 \pm 0.05$  with a correlation of 0.84.

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The TROPOMI data version V02.03.01 already provides a more realistic estimate of the cloud pressure for measurements with low cloud fractions as compared to earlier data versions. However, for certain cases, the cloud pressures remain close to the surface and lead to low biased TROPOMI tropospheric NO<sub>2</sub> VCDs. These high cloud pressures might be caused by aerosol loads which are not treated adequately in the cloud correction. To investigate this further, additional information about aerosol properties are needed in the campaign area.





#### 6.2 NO<sub>2</sub> profile shape and surface reflectivity effects

changing auxiliary data would be similar for the PAL V02.03.01 product.

590 To evaluate the influence of the auxiliary data, such as albedo or a priori vertical profiles on the TROPOMI NO<sub>2</sub> data we developed a custom TROPOMI NO<sub>2</sub> product based on the retrieval of the PAL V02.03.01 product, named IUP V02.03.01, with the possibility to change auxiliary data used within the retrieval.

Figure 10a shows the comparison between the IUP V02.03.01 tropospheric NO<sub>2</sub> VCD and the AirMAP VCDs in dark blue. The PAL V02.03.01 data are shown in light blue (for details and regression statistics see Fig. 8c). The correlation is 0.76, as in the PAL data comparison. The slope of 0.88 ± 0.06 is slightly higher than the 0.83 ± 0.06, and within the uncertainties. Since the agreement between the PAL V02.03.01 and the IUP V02.03.01 version is fairly good, we assume that the effects of

To demonstrate the impact of higher resolved a priori NO<sub>2</sub> vertical profiles on the PAL V02.03.01 data version, we recalculated AMFs and the tropospheric NO<sub>2</sub> VCDs using a priori tropospheric profiles from the regional  $0.1^{\circ} \times 0.1^{\circ}$  CAMS Europe

- analyses for altitudes between the surface and 3 km as described in Sect. 3.1.4. These IUP V02.03.01 REG tropospheric NO<sub>2</sub> VCDs are compared to the AirMAP data in Fig. 10b. Using the spatially higher resolved NO<sub>2</sub> profiles in the IUP V02.03.01 retrieval brings the TROPOMI data closer to the AirMAP data, increasing the slope from  $0.88 \pm 0.06$  (IUP V02.03.01) to  $1.00 \pm 0.07$  (IUP V02.03.01 REG), while maintaining nearly the same correlation of 0.75 as compared to 0.76. This behavior is different from the small impact that we observed for changing the a priori NO<sub>2</sub> profile information from TM5 to CAMS for
- 605 the OFFL V01.03.02 dataset. In the OFFL V01.03.02 product, clouds are very close to the surface for all measurement days (see Appendix Fig. A7), whereas the clouds have lower cloud pressures for most cases of the FRESCO-wide product used in PAL V02.03.01 (see Appendix Fig. A8). Using the spatially higher resolved profile information has the effect that the profile shape over source regions is improved in the sense that there is more NO<sub>2</sub> near the ground which decreases the AMF and thus increases the tropospheric NO<sub>2</sub> VCD and is compensating the reduced sensitivity of TROPOMI for trace gases close to
- 610 the surface. This has a larger effect in the case of the more realistic lower cloud pressures. Measurements for which the cloud pressure is still determined to be close to the surface, which are represented by the lower branch of points, e.g. in Fig. 8c, are less affected by the change to the higher resolved profiles. In combination with the improved cloud treatment, however, the improved NO<sub>2</sub> profiles reveal their positive impact.
- Recalculating AMFs with the regional CAMS NO<sub>2</sub> profiles and the TROPOMI LER result in the IUP V02.03.01 REG LER product. Figure 10c compares the IUP V02.03.01 REG TROPOMI LER and AirMAP tropospheric NO<sub>2</sub> VCD, showing a slope of  $1.02 \pm 0.07$  and a correlation of 0.74. Compared to the IUP V02.03.01 REG data (Fig. 10b) the slope increased slightly from  $1.00 \pm 0.07$  to  $1.02 \pm 0.07$  and the correlation hardly changed from 0.75 to 0.74. This comparison shows that replacing the OMI LER with the TROPOMI LER data only has a small impact on the TROPOMI NO<sub>2</sub> VCD retrieval for our dataset. Differences between the OMI LER and TROPOMI LER are rather small in the campaign region and in the NO<sub>2</sub> fit window but can be
- 620 larger in other regions and a change would thus have a greater impact there.
  Recalculating AMFs with the regional CAMS NO<sub>2</sub> profiles and the TROPOMI DLER result in the IUP V02.03.01 REG
  DLER product which is compared to the AirMAP data in Fig. 10d. The implementation of the DLER product leads to de-







**Figure 10.** Scatter plots of TROPOMI NO<sub>2</sub> VCDs versus collocated AirMAP NO<sub>2</sub> VCDs for different versions of TROPOMI data: (a) the IUP V02.03.01 version in dark blue and the PAL V02.03.01 in light blue, regression information are given for IUP V02.03.01, (b) the IUP V02.03.01 with regional CAMS profiles replacing the TM5 profile information, (c) the IUP V02.03.01 with regional CAMS profiles and TROPOMI LER replacing the OMI LER, (d) the IUP V02.03.01 with regional CAMS profiles and TROPOMI DLER.

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creased TROPOMI NO<sub>2</sub> VCDs as compared to the products using OMI LER (b) or TROPOMI LER (c) and results in a slope of  $0.95 \pm 0.07$  with a correlation of 0.75. Thus, the directional aspect of the surface reflectivity only plays a small role in the tropospheric NO<sub>2</sub> retrieval in the campaign region with nearly cloud free conditions (mean cloud radiance fraction =  $0.21 \pm 0.10$ ) during the measurement days. As for the comparison between OMI LER and TROPOMI LER, it should be pointed out that this result is specific to the area, month and also cloud conditions, as the reflectivity is influencing the cloud height retrieval and thus also the AMF.





All statistics of the comparisons between the different TROPOMI tropospheric  $NO_2$  VCDs data versions and the AirMAP 630 measurements are summarized in Tab. A1 in the Appendix.

#### 7 Conclusions

The presented comparisons have shown that the airborne imaging DOAS measurements performed by the AirMAP instrument are specifically well suited for validating the TROPOMI tropospheric  $NO_2$  VCDs. The airborne dataset provides independently measured tropospheric  $NO_2$  VCDs from seven mapping flights during the S5P-VAL-DE-Ruhr campaign in North-

- Rhine-Westphalia from 12 to 18 September 2020 covering in total 117 TROPOMI ground pixels on six of the days. These flights were accompanied by ground-based stationary and mobile car DOAS instruments. The important advantage of airborne imaging DOAS measurements is the mapping of the NO<sub>2</sub> variability within a satellite footprint, quantifying the expected differences (representative errors) between satellite and surface measurements at a fixed location.
- The ground-based stationary measurements conducted by different types of DOAS instruments (2 zenith-sky DOAS, 2 MAX-640 DOAS, 2 Pandora) deployed at different locations in the flight area provide independent, high precision and well-established data for the evaluation of the AirMAP retrievals. The AirMAP tropospheric NO<sub>2</sub> VCDs are highly correlated (r = 0.87) with the stationary ground-based VCDs with a slope of  $0.93 \pm 0.09$ . Due to limited overflight possibilities, the comparison is limited to in total 23 coincident measurements.

The car DOAS measurements have the advantage that they are mobile, can cover larger and more diverse areas and can be better

synchronized to the AirMAP measurements. They have a high temporal resolution and are coordinated in the AirMAP flight area to gather many collocated measurements. For the evaluation of the AirMAP NO<sub>2</sub> VCD, 572 coincident measurements are considered which are highly correlated (r=0.89) with a slope of  $0.98 \pm 0.02$ .

The combination of the two independent datasets to assess the AirMAP data gives confidence for using the AirMAP tropospheric  $NO_2$  VCD dataset to evaluate the TROPOMI products. Much of the scatter visible in the coincident measurements

- can be attributed to spatial and temporal variability of  $NO_2$  in urban environments. Despite the fairly good spatial resolution of the TROPOMI measurements, the spatial variability within TROPOMI pixels can be large and cannot be fully captured by ground-based instruments. The AirMAP data, having a resolution of about 100 m x 30 m, create a link between the groundbased and the TROPOMI measurements with a resolution of 3.5 km x 5.5 km. Airborne measurements are more representative of the satellite measurements than point measurements as a large number of TROPOMI pixels can be fully mapped in a rela-
- tively short time. Naturally, airborne observations are only available for short periods of time and concentrated on the campaign region.

For the comparison of TROPOMI and AirMAP tropospheric NO<sub>2</sub> VCDs, only TROPOMI pixels that are at least 75 % mapped by AirMAP are used and measurements that are less than  $\pm$  30 min separated in time. This results in 117 TROPOMI pixels coinciding with AirMAP measurements during the six measurement flights. Due to nearly cloud free conditions during the

660 measurement days, the cloud fractions retrieved in the TROPOMI  $NO_2$  spectral window are always lower than 0.14 and thus far below the recommended filter criterion of 0.5



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We evaluate the TROPOMI tropospheric  $NO_2$  VCD data from 12 September to 18 September 2020, using the two data versions OFFL V01.03.02 and PAL V02.03.01 as well as scientific data versions. One scientific version is based on OFFL V01.03.02 with a replacement of the a priori  $NO_2$  profiles from the TM5 model by the CAMS-Europe and CAMS-global product, and one scientific product reproduces the PAL V02.03.01 where different a priori assumptions are replaced for comparison.

- The TROPOMI and AirMAP datasets are all highly correlated with correlation coefficients between 0.74 and 0.86, and slopes of  $0.38 \pm 0.02$  to  $1.02 \pm 0.07$ . On average, TROPOMI tropospheric NO<sub>2</sub> VCDs are lower than the AirMAP data, most prominently for the operational OFFL V01.03.02 and the scientific product V01.03.02 CAMS with a slope of  $0.38 \pm 0.02$  and  $0.41 \pm 0.02$ , respectively, but with varying magnitude for different days. The improvements implemented in the TROPOMI
- 670 PAL V02.03.01 product increase the slope from  $0.38 \pm 0.02$  to  $0.83 \pm 0.06$  with a reduced correlation of 0.76 (compared to 0.86), demonstrating the large impact of the improvements on the analyzed dataset. The main change in the product are more realistic higher cloud altitudes with the change to the FRESCO-wide product. This results in decreased tropospheric AMFs and therefore higher tropospheric NO<sub>2</sub> VCDs, which brings TROPOMI and AirMAP observations much closer together while TROPOMI VCDs are still underestimating the AirMAP data. The improvements have different impacts on the datasets of the
- 675 individual measurement days. The decreased correlation is mainly caused by a separation of the data into two branches; one branch around the 1:1 line and a second branch close to the distribution seen in OFFL V01.03.02 causing the remaining low bias.

We found for the TROPOMI measurements on the lower branch that the cloud heights are still close to the surface as in the OFFL V01.03.02 product, i.e. they are not much affected by the improvements. These high cloud pressures might be caused

- by aerosol loads which are not treated adequately in the cloud correction. In our data set, they are dominated by measurements from one specific day. Introducing an additional criterion excluding low clouds by excluding measurements from the TROPOMI PAL V02.03.01 having surface to cloud pressure differences of less than 50 hPa reduces the number of coincidences from 117 to 89 but improves the slope from  $0.83 \pm 0.06$  to  $0.96 \pm 0.06$  and the correlation from 0.76 to 0.84. This indicates that under some conditions, which might be caused by low cloud fractions or an aerosol load, even the new FRESCO-wide
- 685 cloud retrieval results in too low cloud heights. For further investigations additional information about aerosol properties by sun photometers and MAX-DOAS instruments distributed over the campaign area are needed. Comparing TROPOMI PAL V02.03.01 VCDs without cloud correction with the AirMAP VCDs brings the two branches together which improves the correlation from 0.76 to 0.84 but decreases the slope from  $0.83 \pm 0.06$  to  $0.73 \pm 0.04$ . This illustrates that the two branches are caused by the cloud correction.
- 690 We developed a custom TROPOMI NO<sub>2</sub> product based on the retrieval of the PAL V02.03.01 but replacing the TM5 a priori NO<sub>2</sub> profiles with the spatially higher resolved CAMS-Europe product for altitudes up to 3 km. This improvement increases the slope from  $0.88 \pm 0.06$  to  $1.00 \pm 0.07$  with consistent correlation.

Replacing, in addition, the OMI LER data with the higher resolved TROPOMI LER or DLER data in the NO<sub>2</sub> fit window, respectively, only has a small impact on the TROPOMI NO<sub>2</sub> VCDs of our dataset and the comparison to the AirMAP data. The

slope increases from  $1.00 \pm 0.07$  to  $1.02 \pm 0.07$  using the TROPOMI LER and decreases to  $0.95 \pm 0.07$  using the TROPOMI DLER. The influence of the surface reflectivity on the VCD retrieval is rather small in the campaign region but can be larger in





other regions, seasons and under different cloud conditions, as the reflectivity is influencing the cloud height retrieval and thus also the AMF. A larger impact is expected when applying the TROPOMI DLER in the NIR-FRESCO cloud retrieval, effecting the NO<sub>2</sub> retrieval through adjusted cloud parameters.

- In summary, a validation of the TROPOMI tropospheric  $NO_2$  retrievals based on airborne mapping flights, supported by ground-based stationary and car DOAS measurements, has been presented. We found that the improved cloud pressure treatment in the TROPOMI PAL V02.03.01 data product brings the TROPOMI tropospheric  $NO_2$  VCD much closer to the airborne validation data than the OFFL V01.03.02. An additional cloud height filter and spatially higher resolved a priori  $NO_2$  profile information can further improve the agreement, while application of the TROPOMI LER and DLER had only small effects.
- Further validation activities on the TROPOMI PAL V02.03.01 data product using larger datasets in more regions with different pollution levels, surface reflectance, aerosol and cloud conditions would help to evaluate the performance of the TROPOMI NO<sub>2</sub> product under different conditions and confirm the results found in this dataset. After reprocessing of the new V02.04 retrieval, which has a consistent implementation of the TROPOMI DLER climatology in the NO<sub>2</sub> fit window and the NIR band for the cloud retrieval, comparisons to the campaign dataset can investigate the impact of this improvement. The presented
- validation strategy can be assigned to future validation activities for upcoming satellite missions such as GEMS, TEMPO, Sentinel-4 and Sentinel-5.



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*Data availability.* TROPOMI data from July 2018 onwards are freely available via https://s5phub.copernicus.eu/ (S5P Data Hub, 2022). The reprocessed PAL V02.03.01 data version is freely available via https://data-portal.s5p-pal.com (S5P PAL Data Portal, 2022). The data of both Pandora instruments are freely available from the PGN data archive (https://pandonia-global-network.org/, last access: 21 March 2022). The TROPOMI DLER database is freely available via https://www.temis.nl/surface/albedo/tropomi\_ler.php.





# Appendix A



**Figure A1.** Tropospheric NO<sub>2</sub> VCD of the TM5-MP ( $1^{\circ} x 1^{\circ}$ ) and the CAMS regional ( $0.1^{\circ} x 0.1^{\circ}$ ) analyses for the campaign region on 17 September 2020, interpolated to TROPOMI pixels and oversampled to a  $0.03^{\circ} x 0.03^{\circ}$  resolution.



**Figure A2.** Scatter plots of TROPOMI PAL V02.03.01 tropospheric NO<sub>2</sub> VCDs versus collocated AirMAP tropospheric NO<sub>2</sub> VCDs with (a) AOT of 0.003, (b) AOT of 0.3 and (c) AOT of 0.6. Collocation criteria for AirMAP:  $\pm$  30 min around S5P overpass, gridded to the TROPOMI pixels and covering them at least to 75 %.







Figure A3. Maps of tropospheric NO<sub>2</sub> VCDs from car DOAS measurements from 12 September to 18 September 2020 in the research flight area around Cologne, Jülich and Duisburg. Measurements are within  $\pm 1$  h of the S5P overpass time given in the title. Same as Fig. 5 but here for all measurement days.







Figure A4. Same as Fig. 6 with different error bars. Scatter plot showing the stationary ground-based NO<sub>2</sub> VCDs averaged in a time interval of 20 min closest to the aircraft overpass data which are averaged over a 500 m x 500 m box around the station site. Error bars represent the  $\pm$  10th – 90th percentiles within the 500 m x 500 m grid boxes and 20 min time intervals







Figure A5. Same as Fig. 7 with different error bars. Scatter plots showing collocated car DOAS ( $\pm$  15 min window from the aircraft overpass) and AirMAP NO<sub>2</sub> VCDs using grid boxes of 500 m x 500 m and 15 min time intervals. Error bars represent the  $\pm$  10th–90th percentiles within the 500 m x 500 m grid boxes and 15 min time intervals.







**Figure A6.** Daily maps of tropospheric NO<sub>2</sub> VCDs demonstrating how AirMAP data are matched to TROPOMI measurements. (top) TROPOMI PAL V02.03.01 tropospheric NO<sub>2</sub> VCDs where qa\_value > 0.75. (middle) AirMAP tropospheric NO<sub>2</sub> VCDs with overlaid TROPOMI pixel outlines which are fulfilling the collocation criteria of a coverage of at least to 75 % and AirMAP measurements  $\pm$  30 min around the S5P overpass. (bottom) AirMAP tropospheric NO<sub>2</sub> VCDs scaled to the TROPOMI pixel.







Figure A7. Scatter plots of TROPOMI operational OFFL V01.03.02 tropospheric NO<sub>2</sub> VCDs versus collocated AirMAP tropospheric NO<sub>2</sub> VCDs for the six measurement days. Collocation criteria for AirMAP:  $\pm$  30 min around S5P overpass, gridded to the TROPOMI pixels and covering them at least to 75 %.



**Figure A8.** Same as Fig. A7 but for TROPOMI PAL V02.03.01 tropospheric NO<sub>2</sub> VCDs versus collocated AirMAP tropospheric NO<sub>2</sub> VCDs for the six measurement days.





Table A1. Statistics of the comparisons between the different TROPOMI tropospheric NO<sub>2</sub> VCDs data versions and AirMAP measurements.

TROPOMI NO2 data version	Slope $\pm$ SD	Median difference	Offset $\pm$ SD	Correlation coefficient
		(%)	$(\cdot 10^{15} \mathrm{molec}\mathrm{cm}^{-2})$	
OFFL V01.03.02	$0.38\pm0.02$	-19	$2.54\pm0.15$	0.86
OFFL V01.03.02 CAMS	$0.41\pm0.02$	-15	$2.63\pm0.16$	0.86
PAL V02.03.01	$0.83\pm0.06$	21	$1.71\pm0.42$	0.76
PAL V02.03.01, AirMAP AOT=0.003	$0.81\pm0.06$	14	$1.89\pm0.41$	0.76
PAL V02.03.01, AirMAP AOT=0.6	$0.82\pm0.06$	9	$1.66\pm0.43$	0.76
PAL V02.03.01 no cloud correction (no cc)	$0.73\pm0.04$	8	$2.12\pm0.29$	0.85
PAL V02.03.01 $\Delta cs > 50 hPa$	$0.96\pm0.06$	29	$1.76\pm0.41$	0.84
PAL V02.03.01 $\Delta cs > 50$ hPa replaced with no cc	$0.89\pm0.05$	21	$1.93\pm0.37$	0.84
IUP V02.03.01	$0.88\pm0.06$	14	$1.56\pm0.45$	0.76
IUP V02.03.01 REG	$1.00\pm0.07$	17	$0.99 \pm 0.51$	0.75
IUP V02.03.01 REG TROPOMI LER	$1.02\pm0.07$	16	$0.86 \pm 0.54$	0.74
IUP V02.03.01 REG TROPOMI DLER	$0.95\pm0.07$	11	$0.96\pm0.50$	0.75



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*Author contributions.* All co-authors contributed to the campaign either as participants and instrument operators and/or during campaign preparation, follow-up data analysis and providing their data of the individual instruments. KL and ACM performed the final data analysis. KL, AR, AS, ACM, TB, ASE and JPB interpreted the results of the study and wrote the paper with feedback and contributions from all other co-authors.

*Competing interests.* The authors declare that they have no conflict of interest. Andreas Richter and Thomas Wagner are executive editors at AMT.

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