# 1 POMINO-GEMS: A Research Product for Tropospheric NO<sub>2</sub> Columns from

# 2 Geostationary Environment Monitoring Spectrometer

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# 36 Abstract

- 37 Tropospheric vertical column densities (VCDs) of nitrogen dioxide (NO<sub>2</sub>) retrieved from sun-
- 38 synchronous satellite instruments have provided abundant NO<sub>2</sub> data for environmental studies, but such

39 data are limited by retrieval uncertainties and insufficient temporal sampling (e.g., once a day). The 40 Geostationary Environment Monitoring Spectrometer (GEMS) launched in February 2020 monitors NO2 41 at an unprecedented hourly resolution during the daytime. Here we present a research product for 42 tropospheric NO<sub>2</sub> VCDs, referred to as POMINO-GEMS. We develop a hybrid retrieval method 43 combining GEMS, TROPOMI and GEOS-CF data to generate hourly tropospheric NO<sub>2</sub> slant column 44 densities (SCDs). We then derive tropospheric NO2 air mass factors (AMFs) with explicit corrections for 45 surface reflectance anisotropy and aerosol optical effects, through parallelized pixel-by-pixel radiative 46 transfer calculations. Prerequisite cloud parameters are retrieved with the O<sub>2</sub>-O<sub>2</sub> algorithm by using 47 ancillary parameters consistent with those used in NO<sub>2</sub> AMF calculations.

48 Initial retrieval of POMINO-GEMS tropospheric NO<sub>2</sub> VCDs for June-August 2021 exhibits strong 49 hotspot signals over megacities and distinctive diurnal variations over polluted and clean areas. POMINO-GEMS NO<sub>2</sub> VCDs agree with the POMINO-TROPOMI v1.2.2 product (R = 0.98, and NMB 50 51 = 4.9%) over East Asia, with slight differences associated with satellite viewing geometries and cloud 52 and aerosol properties affecting the NO2 retrieval. POMINO-GEMS also shows good agreement with 53 OMNO2 v4 (R = 0.87, and NMB = -16.8%) and GOME-2 GDP 4.8 (R = 0.83, and NMB = -1.5%) NO<sub>2</sub> 54 products. POMINO-GEMS shows small biases against ground-based MAX-DOAS NO2 VCD data at 55 nine sites (NMB = -11.1%) with modest or high correlation in diurnal variation at six urban and suburban 56 sites (R from 0.60 to 0.96). The spatiotemporal variation of POMINO-GEMS correlates well with 57 mobile-car MAX-DOAS measurements in the Three Rivers' Source region on the Tibetan Plateau (R =58 0.81). Surface NO<sub>2</sub> concentrations estimated from POMINO-GEMS VCDs are consistent with 59 measurements from the Ministry of Ecology and Environment of China for spatiotemporal variation (R60 = 0.78, and NMB = -26.3%) as well as diurnal variation at all, urban, suburban and rural sites ( $R \ge 0.96$ ). 61 POMINO-GEMS data will be made freely available for users to study the spatiotemporal variations, 62 sources and impacts of NO<sub>2</sub>.

#### 63 1. Introduction

 Tropospheric nitrogen dioxide (NO<sub>2</sub>) is an important air pollutant. It <u>threatsthreatens</u> human health, and contributes to the formation of tropospheric ozone (O<sub>3</sub>) and nitrate aerosols (Crutzen, 1970; Shindell et al., 2009; Hoek et al., 2013; Chen et al., 2022). Satellite instruments provide observations of tropospheric NO<sub>2</sub> on a global scale, and they have been extensively used to estimate emissions of nitrogen oxides (NO<sub>x</sub> = NO + NO<sub>2</sub>) (Lin and Mcelroy, 2011; Beirle et al., 2011; Gu et al., 2014; Kong et al.,
2022a), surface NO<sub>2</sub> concentrations (Wei et al., 2022; Cooper et al., 2022), trends and variabilities
(Richter et al., 2005; Cui et al., 2016; Krotkov et al., 2016; Van Der A et al., 2017), and impacts on human
health and environment (Chen et al., 2021).

To date, most spaceborne instruments for NO2 measurements, including the Global Ozone 72 73 Monitoring Instrument (GOME) (Burrows, 1999), the Ozone Monitoring Instrument (OMI) (Levelt et 74 al., 2006), the Global Ozone Monitoring Experiment 2 (GOME-2) (Callies et al., 2000) and the 75 TROPOspheric Monitoring Instrument (TROPOMI) (Veefkind et al., 2012), are mounted on sun-76 synchronous low Earth orbit (LEO) satellites. These instruments passively measure backscattered 77 radiance from the Earth's atmosphere, and measurements at each ground location are done 1-2 times a 78 day. The Geostationary Environment Monitoring Spectrometer (GEMS) on board the Geostationary 79 Korea Multi-Purpose Satellite-2B (GK-2B) was successfully launched in February 2020. The instrument 80 provides measurements of NO<sub>2</sub> and other pollutants in the daytime on an hourly basis (Kim et al., 2020). 81 It complements LEO satellite observations by providing a more comprehensive picture of the daytime 82 evolution of NO<sub>2</sub>.

83 There are three successive stages in the retrieval of tropospheric NO<sub>2</sub> vertical column densities 84 (VCDs) in the UV-Vis range based on satellite observations. The first step is to retrieve total NO<sub>2</sub> slant 85 column densities (SCDs) with spectral fitting techniques, such as the Differential Optical Absorption 86 Spectroscopy (DOAS). The SCD represents the abundance of NO<sub>2</sub> along the effective light path from 87 the sun through the atmosphere to the satellite instrument. Next, the contributions from stratospheric  $NO_2$ 88 to the total SCDs are removed in order to obtain tropospheric SCDs. Finally, the tropospheric SCDs are 89 converted to VCDs using calculated air mass factors (AMFs). The AMF calculations are highly sensitive 90 to the observation geometry, cloud parameters, aerosols, surface conditions and the shape of the  $NO_2$ 91 vertical distribution. Over polluted areas, errors in the retrieved tropospheric NO<sub>2</sub> VCDs are dominated 92 by the uncertainties in AMF calculations (Boersma et al., 2004; Lorente et al., 2016) associated with 93 aerosol optical effects, surface reflectance and a priori NO2 vertical profiles (Zhou et al., 2010; Lin et al., 94 2014; Lin et al., 2015; Vasilkov et al., 2016; Lorente et al., 2018; Liu et al., 2019; Liu et al., 2020; 95 Vasilkov et al., 2021).

96 The official GEMS retrieval algorithm for tropospheric NO<sub>2</sub> VCDs is developed by Lee et al. (2020).

97 The total NO<sub>2</sub> SCDs are retrieved using the DOAS technique. They are then converted to total NO<sub>2</sub> VCDs 98 by using a precomputed look-up table of box AMFs based on the linearized pseudo-spherical scalar and 99 vector discrete ordinate radiative transfer code (VLIDORT) version 2.6. Finally, stratosphere-100 troposphere separation (STS) is performed to derive tropospheric NO<sub>2</sub>. Validation results have shown the 101 overall capability of the official GEMS NO<sub>2</sub> algorithm (Kim et al., 2023), but several problems are also 102 reported, such as overestimation of total NO<sub>2</sub> SCDs and tropospheric NO<sub>2</sub> VCDs, and some degree of 103 striping in NO<sub>2</sub> retrieval data.

104 In this study, we present a research product which we name as POMINO-GEMS. This product is 105 built upon our Peking University OMI NO<sub>2</sub> (POMINO) algorithm which focuses on the tropospheric 106 AMF calculations and has been applied to OMI and TROPOMI (Lin et al., 2014; Lin et al., 2015; Liu et 107 al., 2019; Liu et al., 2020; Zhang et al., 2022). Here we extend the AMF calculation by constructing a 108 hybrid method to estimate tropospheric SCDs for GEMS. The hybrid method makes use of the total 109 SCDs from the official GEMS product, total SCDs and stratospheric VCDs from the official TROPOMI 110 product, as well as hourly stratospheric VCD data from the NASA Global Earth Observing System 111 Composition Forecast (GEOS-CF) v1 product. We validate our initial set of retrieval results for 112 tropospheric NO<sub>2</sub> VCDs in June-July-August (JJA) 2021, by using independent data of tropospheric NO<sub>2</sub> 113 from the POMINO-TROPOMI v1.2.2, OMNO2 v4 and GOME-2 GDP 4.8 products, ground-based and 114 mobile-car MAX-DOAS measurements, and surface concentration observations from the Ministry of 115 Ecology and Environment (MEE) of China. We provide a simplified estimate of retrieval errors in the 116 end.

#### 117 **2. Method and data**

#### 118 2.1 Construction of POMINO-GEMS retrieval algorithm

Figure 1 shows the flow chart of POMINO-GEMS retrieval algorithm. There are two essential steps.
 The first is to calculate tropospheric NO<sub>2</sub> SCDs on an hourly basis, through fusion of total SCDs from

121 the official GEMS v1.0 L2 NO<sub>2</sub> product, total SCDs and stratospheric VCDs from the TROPOMI PAL

- 122 v2.3.1 L2 NO<sub>2</sub> product, and diurnal variations of stratospheric NO<sub>2</sub> from the GEOS-CF v1 product. We
- 123 then calculate tropospheric NO<sub>2</sub> AMFs to convert SCDs to VCDs.





Figure 1. Flow chart of POMINO-GEMS retrieval algorithm. The numbers in the boxes, such as 5 km, refer to horizontal resolutions.

#### 127 **2.1.1 GEMS NO<sub>2</sub> and cloud data**

128 The GEMS instrument is on board the GK-2B satellite locating at 128.2°E over the equator (Kim 129 et al., 2020). The spectral wavelength range of GEMS is 300-500 nm, covering main absorption spectra 130 of aerosols and trace gases. The nominal spatial resolution is typically  $7 \text{ km} \times 8 \text{ km}$  for gases and 3.5 km131  $\times$  8 km for aerosols in the eastern and central scan domains; however, the north-south spatial resolution 132 can exceed 25 km in the western side. The whole field of view (FOV) covers about 20 Asian countries 133 within latitudes 5°S to 45°N and longitudes 80°E to 152°E. Given the variation of solar zenith angle 134 (SZA), there are four scan scenarios moving from east to west, including Half East (HE), Half Korea (HK), Full Central (FC) and Full West (FW). It takes 30 minutes (for example, 00:45 - 01:15 UTC) for 135 136 GEMS to scan its full coverage during each scenario, and the next 30 minutes to transmit data to the 137 ground data center. The number of hourly GEMS observations per day varies from 6 in winter to 10 in 138 summer, corresponding to the annual movement of subsolar points relative to the Earth.

We take hourly total (stratospheric + tropospheric) NO<sub>2</sub> SCDs from the official GEMS v1.0 L2 NO<sub>2</sub> product, and convert them to  $0.05^{\circ} \times 0.05^{\circ}$  gridded data by means of an area-weighted oversampling technique. The value of each grid cell is the mean value of pixel-based GEMS observations weighted by the ratio of the overlap area of each pixel to the area of grid cell. We also use continuum reflectance data (i.e., spectrally smooth reflectance from molecular and aerosol extinction as well as surface reflectance effects) and O<sub>2</sub>-O<sub>2</sub> SCDs from the official GEMS v1.0 L2 cloud product to re-calculate cloud parameters as a prerequisite for tropospheric NO<sub>2</sub> AMF calculations. Details of the GEMS retrievals can be found
in the algorithm theoretical basis document (ATBD) (Lee et al., 2020).

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# 7 2.1.2 TROPOMI, OMI and GOME-2 NO<sub>2</sub> data

148Table S1 compares the basic information of GEMS with those of TROPOMI, OMI and GOME-2149instruments. In this study, TROPOMI data are used for derivation of POMINO-GEMS NO2 VCDs, and150data from all of the three LEO instruments are used for comparison with POMINO-GEMS.

151 We use total NO<sub>2</sub> SCDs and stratospheric NO<sub>2</sub> VCDs from the official TROPOMI PAL v2.3.1 L2 152 NO<sub>2</sub> product, and convert them to  $0.05^{\circ} \times 0.05^{\circ}$  gridded data, again using an area-weighted oversampling 153 technique. Details of TROPOMI total SCD retrievals and stratospheric VCD calculations are given in 154 the TROPOMI ATBD (Van Geffen et al., 2022a). The TROPOMI PAL product is reprocessed with 155 TROPOMI NO<sub>2</sub> data processor v2.3.1 for the period from 1 May 2018 to 14 November 2021; it will be 156 replaced by the full mission reprocessing with NO<sub>2</sub> processor v2.4.0 in the future (Eskes et al., 2021). 157 The most important improvement in this PAL product upon the previous OFFL v1.3 is the replacement 158 of the FRESCO-S algorithm with the FRESCO-wide cloud retrieval algorithm, which leads to higher, 159 more reasonable cloud pressure (CP) estimates and substantial increases in tropospheric NO<sub>2</sub> VCDs (by 160 20% – 50%) over polluted regions like Eastern China in winter (Eskes et al., 2021; Van Geffen et al., 161 2022b).

162 We use the POMINO-TROPOMI v1.2.2, OMNO2 v4 (Krotkov et al., 2019)(Lamsal et al., 2021) 163 and GOME-2 GDP 4.8 (Valks et al., 2019) tropospheric NO<sub>2</sub> VCD products to compare with POMINO-164 GEMS results. The previous POMINO-TROPOMI v1 data show higher accuracy in polluted situations 165 and improved consistency with MAX-DOAS measurements when compared with the official TM5-MP-166 DOMINO (OFFLINE) product (Liu et al., 2020). POMINO-TROPOMI v1.2.2 improves upon v1 by (1) 167 using tropospheric NO<sub>2</sub> SCD and CP data from the updated TROPOMI PAL v2.3.1 NO<sub>2</sub> product, (2) 168 interpolating the daily NO<sub>2</sub>, pressure, temperature and aerosol vertical profiles from nested GEOS-Chem 169 (v9-02) simulations into a horizontal grid of 2.5 km x 2.5 km for subsequent tropospheric AMF 170 calculations, and (3) including several minor bug fixes.

We select valid satellite pixels following common practice. For the daily POMINO-TROPOMI
v1.2.2 L2 NO<sub>2</sub> product, we exclude pixels with SZA or viewing zenith angle (VZA) greater than 80°,
high albedos caused by ice or snow on the ground, quality flag values (from the TROPOMI PAL v2.3.1

174 product) less than 0.5 or cloud radiance fraction (CRF) greater than 50%, and then map the valid data to a  $0.05^{\circ} \times 0.05^{\circ}$  grid. For the daily OMNO2 v4 L2 NO<sub>2</sub> product, we exclude pixels with SZA or VZA 175 176 greater than 80°, with scene Lambert-equivalent reflectivity (LER) greater than 0.3, affected by row 177 anomaly (XTrackQualityFlags is not zero), marked without quality assurance (vcdQualityFlag is not an even integer) or with CRF greater than 50%, and then map the valid data to a  $0.25^{\circ} \times 0.25^{\circ}$  grid. For the 178 179 daily GOME-2 GDP 4.8 L2 NO<sub>2</sub> product, we exclude pixels with latitude greater than 70°, SZA greater 180 than 80°, failed retrieval (NO2Tropo\_Flag is set to 1 or 2) or with CRF greater than 50%, and then map 181 the valid data to a  $0.5^{\circ} \times 0.5^{\circ}$  grid.

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#### 2.1.3 GEOS-CF stratospheric NO<sub>2</sub> data

183 The NASA GEOS-CF system combines the Global Earth Observing System (GEOS) weather 184 analysis and forecasting system with GEOS-Chem v12.0.1 chemistry module (http://geoschem.org) to 185 provide near real-time estimates of atmospheric compositions with daily 5-day forecasts. Detailed 186 information of the model, including chemistry, emissions and deposition, and evaluation of the GEOS-187 CF tropospheric simulation and forecast skill are presented in Keller et al. (2021). In particular, the 188 GEOS-Chem v12.0.1 chemistry scheme includes online stratospheric chemistry that is fully coupled with 189 tropospheric chemistry through the Unified tropospheric-stratospheric Chemistry eXtension (UCX) 190 mechanism (Eastham et al., 2014). The GEOS-CF stratospheric results are consistent with satellite 191 observations, albeit with notable underestimation of NO<sub>x</sub> and HNO<sub>3</sub> in the polar regions (Knowland et 192 al., 2022b).

The GEOS-CF outputs have a horizontal resolution of  $0.25^{\circ} \times 0.25^{\circ}$  and a temporal resolution of 1 hour for NO<sub>2</sub> and other ancillary data used here (Knowland et al., 2022a). We convert instantaneous stratospheric NO<sub>2</sub> volume mixing ratio in dry air at each hour (e.g., 00:00 UTC) into  $0.05^{\circ} \times 0.05^{\circ}$ gridded vertical column densities based on estimated tropopause information in GEOS-CF v1. In Section 2.1.5, we first evaluate GEOS-CF v1 stratospheric NO<sub>2</sub> VCDs with those of TROPOMI PAL v2.3.1 product, and then calculate hourly stratospheric NO<sub>2</sub> VCDs by combining GEOS-CF v1 data for each hour and TROPOMI PAL v2.3.1 stratospheric NO<sub>2</sub> VCD data in the early afternoon.

### 200 2.1.4 Calculation of total NO<sub>2</sub> SCDs

We use TROPOMI data to correct GEMS total NO<sub>2</sub> SCDs, given known issues in GEMS data.
 Specifics for the NO<sub>2</sub> SCD retrieval of TROPOMI PAL v2.3.1 and GEMS v1.0 operational products are

203 provided in Table S2.

204 Figure 2a and b show the spatial distribution of monthly mean total NO<sub>2</sub> geometric column densities 205 (GCDs, calculated as SCDs divided by geometric AMFs) in June 2021 from TROPOMI PAL v2.3.1 and 206 GEMS v1.0, respectively. The horizontal resolution is  $0.05^{\circ} \times 0.05^{\circ}$ . The GCDs are used to compare the two products after removing the effect of measurement geometry. Matching for each day between hourly 207 208 GEMS observations and the TROPOMI data at the closest observation time is done to ensure temporal compatibility. The figures show that the spatial pattern of GEMS GCDs agrees well with that of 209 210 TROPOMI, with high values over the North China Plain (NCP) and Northwestern India, as well as major 211 metropolitan clusters such as Seoul and the Yangtze River Delta (YRD). However, there are two 212 systematic problems in GEMS GCDs. First, the GEMS GCD values are abnormally high over the northern and northwestern parts of GEMS FOV, especially over Mongolia, Qinghai, Inner Mongolia, 213 214 Xinjiang and Tibet of China. Second, west-east stripes exist over the whole domain, similar to the 215 spurious across-track variability issue for OMI. This stripe issue exists at all hours (Figure S1). It is likely 216 associated with the specific scan modes of GEMS, as well as periodically occurring bad pixels as one of 217 remaining calibration issues (Boersma et al., 2011; Lee et al., 2023).



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219Figure 2. Spatial distribution of monthly mean total NO2 GCDs on a 0.05° × 0.05 °grid in June 2021. (a) The220TROPOMI PAL v2.3.1 product, (b) the official GEMS v1.0 product that spatiotemporally matches with

221 TROPOMI, (c) the corrected POMINO-GEMS product that spatiotemporally matches with TROPOMI,

# and (d) the corrected POMINO-GEMS product averaged over 02:45 - 07:45 UTC. Note the range of the color bar is $2.0 - 5.0 \times 10^{15}$ molec. cm<sup>-2</sup>. The regions in grey mean there are no valid observations.

To correct the two issues in the GEMS official total NO<sub>2</sub> SCD product, we combine GEMS and TROPOMI observations to obtain hourly  $0.05^{\circ} \times 0.05^{\circ}$  corrected total NO<sub>2</sub> SCDs for each day using Eqs. (1) and (2):

227 
$$\Delta GCD = \frac{1}{n} \sum_{i=1}^{n} (GCD_{\text{total},h_i}^{\text{TROPOMI}} - GCD_{\text{total},h_i}^{\text{GEMS}})$$
(1)

(2)

228 
$$SCD_{total,h}^{corrected} = SCD_{total,h}^{GEMS} + \Delta GCD \times AMFgeo_h^{GEMS}$$

229 In Eqs. (1) and (2), index h represents the hour of GEMS observations on each day;  $h_i$  the hour 230 when both GEMS and TROPOMI have valid observations for the same grid cell; and n the number of  $h_i$ . 231 The value of n is 1 or 2 depending on the overpass times of TROPOMI. There are two steps in the 232 correction process. First, we calculate a geometry-independent correction map for each day using total 233 NO<sub>2</sub> GCDs from GEMS and TROPOMI that match spatially and temporally (Eq. (1)). We use the 234 absolute difference instead of a scaling factor as a simple correction. We then apply the correction to the 235 original GEMS total NO<sub>2</sub> SCDs at each hour on the same day, with the diurnal variation in AMF 236 associated with measurement geometry accounted for (Eq. (2)).

In Eq. (2), we implement a simple geometric correction (concerning SZAs and VZAs) for AMFs instead of using the actual AMFs; the latter could account for the differences in relative azimuth angles and other factors. Specific derivation of this assumption is given in Section 1 of the Supplement Information (SI). The correction is assumed to be acceptable with an extra uncertainty introduced to the total NO<sub>2</sub> SCDs, as will be further discussed in Section 3.5.

242 Figure 2c shows the monthly mean corrected POMINO-GEMS total NO<sub>2</sub> GCDs in June 2021 after 243 spatial and temporal matching with TROPOMI. The corrected GCD values in the northern GEMS FOV 244 are much reduced compared with those in the original GEMS data. Moreover, most stripe-like patterns 245 are removed in the corrected GCDs. Figure 2d is similar to Fig. 2c but for GCDs averaged over 02:45 -246 07:45 UTC in June 2021. Figure S3 further compares the original GEMS and POMINO-GEMS total 247 NO<sub>2</sub> GCDs at each hour in JJA 2021, showing similar improvements as well. The differences between 248 Figure 2c and d indicate the influence of different sampling hours combined with the daily correction 249 map. Specifically, the correction value of each grid cell is calculated at the specific hour when both 250 GEMS and TROPOMI have valid observations, but this value is applied to original GEMS SCDs at all

251 hours.

Our correction method is done for each grid cell. We tested other correction methods by applying the same correction value to grid cells within a  $20^{\circ} \times 20^{\circ}$  domain, at the same latitude, or at the same longitude. These alternative methods can reduce the high bias over the northern and northwestern GEMS FOV to various extents, but cannot remove the stripes (not shown). We also note that our simple correction is a temporary solution before the aforementioned systematic problems in the official GEMS SCD retrieval are solved by improving spectral fitting. In Sections 3.3 and 3.4, we compare the diurnal

258 variations of tropospheric NO<sub>2</sub> VCDs based on corrected and uncorrected GEMS SCDs.

# 259 2.1.5 Calculation of stratospheric and tropospheric NO<sub>2</sub> SCDs

260 We construct a dataset of hourly stratospheric NO<sub>2</sub> SCDs at  $0.05^{\circ} \times 0.05^{\circ}$  by using TROPOMI PAL 261 v2.3.1 stratospheric NO<sub>2</sub> VCDs, diurnal variation of stratospheric NO<sub>2</sub> VCDs provided by GEOS-CF v1 262 product, and GEMS geometric AMFs.

Figure S4 shows the comparison results between GEOS-CF v1 and TROPOMI PAL v2.3.1 stratospheric NO<sub>2</sub> VCDs in June 2021. Consistent spatial and temporal sampling is done. N is the total number of matched  $0.05^{\circ} \times 0.05^{\circ}$  grid cells. The stratospheric VCDs from both products vary in the range of  $2 - 5 \times 10^{15}$  molec. cm<sup>-2</sup>, with spatiotemporal correlation of 0.99, linear regression slope of 0.99 and normalized mean bias (NMB) of 0.02%. This consistency provides confidence on the overall reliability of GEOS-CF stratospheric NO<sub>2</sub> data.

# First, we calculate stratospheric NO<sub>2</sub> VCDs at a reference hour for each day using Eqs. (3) and (4):

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270 
$$\operatorname{ratio}_{h_0}^{h} = \frac{\operatorname{VCD}_{\operatorname{strat},h}^{\operatorname{GEOS-CF}}}{\operatorname{VCD}_{\operatorname{strat},h_0}^{\operatorname{GEOS-CF}}}$$
(3)

271 
$$VCD_{\text{strat},h_0} = \frac{1}{n} \sum_{i=1}^{n} \frac{VCD_{\text{strat},h_i}^{\text{TROPOMI}}}{\operatorname{ratio}_{h_0}^{h_i}}$$
(4)

Here, Eq. (3) defines the ratio of GEOS-CF stratospheric NO<sub>2</sub> at hour *h* to that at the reference hour  $h_0$ , which is chosen to be 01:00 UTC (Figure S5). In Eq. (4),  $h_i$  represents the observation time of every TROPOMI orbit that overlaps with GEMS FOV, and *n* the number of  $h_i$  for each grid cell.

- 275 Second, we use the ratio from a given time *h* to  $h_0$  and stratospheric NO<sub>2</sub> VCDs at  $h_0$  to derive 276 stratospheric NO<sub>2</sub> VCDs at *h* for each day (Eq. (5)).
- 277  $VCD_{\text{strat},h} = VCD_{\text{strat},h_0} \times \text{ratio}_{h_0}^h$ (5)
- Figure 3 shows the derived monthly mean stratospheric NO<sub>2</sub> VCDs at each hour in June 2021 on a

279  $0.05^{\circ} \times 0.05^{\circ}$  grid. The abrupt decease of stratospheric NO<sub>2</sub> VCDs after sunrise is caused by resumed 280 photochemical conversion of NO<sub>2</sub> to NO (Li et al., 2021b). There is a strong meridional gradient of 281 stratospheric NO<sub>2</sub> in the daytime, with the higher values in the north associated with longer lifetimes. 282 The stratospheric NO<sub>2</sub> increase quasi-linearly during the daytime; linear regression to the mean 283 stratospheric NO<sub>2</sub> VCDs over the whole domain from 01:45 to 07:45 UTC results in an increasing rate 284 of  $(1.12\pm0.03) \times 10^{14}$  molec. cm<sup>-2</sup> h<sup>-1</sup>. This result is consistent with previous work showing quasi-linear growth in the daytime at rates of  $0.5 - 2 \times 10^{14}$  molec. cm<sup>-2</sup> h<sup>-1</sup> depending on latitude and season (Li et 285 286 al., 2021b; Dirksen et al., 2011).

Finally, we use GEMS geometric AMFs to convert the stratospheric  $NO_2$  VCDs to SCDs at each hour, and then subtract them from the total SCDs to obtain tropospheric SCDs (Eqs. (6) and (7)). In the stratosphere, the geometric AMFs are essentially the same as the actual AMFs

$$SCD_{strat,h} = VCD_{strat,h} \times AMFgeo_h^{GEMS}$$
(6)

![](_page_10_Figure_3.jpeg)

![](_page_10_Figure_4.jpeg)

![](_page_10_Figure_5.jpeg)

Figure 3. Spatial distribution of POMINO-GEMS derived monthly mean stratospheric NO<sub>2</sub> VCDs at each hour on a  $0.05^{\circ} \times 0.05^{\circ}$  grid in June 2021. Note the range of the color bar is  $2.0 - 4.0 \times 10^{15}$  molec. cm<sup>-2</sup>.

#### 295 2.1.6 Calculation of tropospheric AMFs

Tropospheric  $NO_2$  AMF is dependent on three factors as defined in Palmer et al. (2001): the viewing geometry, the scattering weights describing the sensitivity of the backscattered spectrum to the abundance of the absorber, and a priori  $NO_2$  vertical profile (Eq. (8)).

299  $AMF = AMF_G \int_0^{z_T} w(z)S(z)dz$ (8)

300 In Eq. (8), AMF<sub>G</sub> is the geometric AMF and a function of SZA and VZA, w(z) the scattering weight 301 at altitude z, S(z) the normalized vertical profile of NO<sub>2</sub> number density, and  $z_T$  the tropopause. Following Yang et al. (2023), we refer to  $\int_0^{z_T} w(z)S(z)dz$  as the scattering correction factor for discussion in 302 303 Section 3.2. For tropospheric AMF calculations (Figure 1), we use a parallelized AMFv6 package driven 304 by LIDORT version 3.6; this is similar to the one used in our previous POMINO products (Lin et al., 305 2014; Lin et al., 2015; Liu et al., 2019) but with modifications to adapt to the geostationary observing 306 characteristics and high spatiotemporal resolution of GEMS. We take daily BRDF coefficients with a 307 horizontal resolution of 5 km from the MODIS MCD43C2.006 dataset (Lucht et al., 2000) to account for 308 the anisotropy of surface reflectance over land and coastal ocean regions, and OMLER v3 albedo over 309 open ocean (Zhou et al., 2010; Lin et al., 2014; Liu et al., 2020). Hourly-varying aerosol parameters, a 310 priori NO<sub>2</sub> profiles, temperature profiles and pressure profiles are interpolated from nested GEOS-Chem 311 (v9-02) results to a horizontal resolution of 2.5 km, using the Piecewise Cubic Hermite Interpolating 312 Polynomial (PCHIP) method. Furthermore, we deploy AOD observations from the MODIS/Aqua 313 Collection 6.1 MYD04 L2 dataset to constrain model-simulated AOD on a monthly basis (Lin et al., 314 2014; Lin et al., 2015; Liu et al., 2019; Liu et al., 2020); and we use a self-constructed monthly 315 climatological dataset of aerosol extinction profiles based on CALIOP L2 data over 2007-2015 to 316 constrain modeled aerosol vertical profiles on a monthly climatology basis (Liu et al., 2019). We re-317 retrieve cloud parameters based on O<sub>2</sub>-O<sub>2</sub> SCDs and continuum reflectances from the official GEMS 318 v1.0 cloud product, using ancillary parameters consistent with those used in NO<sub>2</sub> AMF calculations. 319 Instead of relying on a look-up table (LUT), we conduct pixel-by-pixel radiative transfer calculations 320 with the parallelized AMFv6 package. The independent pixel approximation (IPA) is assumed for cloud-321 contaminated pixels as in other algorithms. Finally, we use the AMF data to convert tropospheric  $NO_2$ 322 SCDs to VCDs.

323 Invalid pixels in the POMINO-GEMS product are filtered based on the following criteria. We

exclude pixels with SZA or VZA greater than 80°, or with the ground covered by ice or snow. To
 minimize cloud contamination, we exclude pixels with CRF greater than 50%.

## 326 **2.2 Estimation of surface NO<sub>2</sub> concentrations**

331

In order to validate satellite NO<sub>2</sub> products with surface concentration measurements from MEE, we convert tropospheric NO<sub>2</sub> VCDs from satellite products on a  $0.05^{\circ} \times 0.05^{\circ}$  grid to surface NO<sub>2</sub> mass concentrations using GEOS-Chem simulated NO<sub>2</sub> vertical profiles and the box heights of the lowest model layer (Eq. (9)).

$$C_{\rm surf} = VCD_{\rm trop}^{\rm SAT} \times R^{\rm GC} \times \frac{M}{N \times H^{\rm GC}} \times 2$$
(9)

In Eq. (9),  $C_{surf}$  represents the estimated surface NO<sub>2</sub> mass concentration in  $\mu g m^{-3}$ , VCD<sup>SAT</sup><sub>trop</sub> the 332 satellite tropospheric VCD in molecules.  $m^{-2}$ ,  $R^{GC}$  the GEOS-Chem simulated hourly ratio of NO<sub>2</sub> sub-333 334 column in the lowest layer to the total tropospheric column, M the NO<sub>2</sub> molar mass in  $\mu$ g mol<sup>-1</sup>, N the Avogadro constant, and  $H^{GC}$  the box height of the lowest layer in m. The thickness of the lowest layer 335 336 of GEOS-Chem (about 130 m) is too large for the layer average NO<sub>2</sub> mass concentration to represent 337 that near the ground (Liu et al., 2018a); thus the derived concentration is multiplied by a factor of 2 to 338 roughly account for the vertical gradient from the height of ground instrument to the center of the model 339 layer. However, the constant correction factor of 2 neglects the diurnal variation of NO<sub>2</sub> vertical gradient, 340 which is related to the diurnal variation of planetary boundary layer (PBL) heights. This issue is discussed 341 in detail in Section 3.4.

# 342 2.3 Ground-based MAX-DOAS measurements

343 We use ground-based MAX-DOAS NO<sub>2</sub> measurements, together with POMINO-TROPOMI v1.2.2, 344 OMNO2 v4 and GOME-2 GDP 4.8 NO2 products, to validate the POMINO-GEMS retrieval results. The 345 types, geolocations and observation times of MAX-DOAS stations are summarized in Table S3, and the 346 location of each site is shown in Figure S6. Details of each site are described in Section 2 of the SI. 347 Kanaya et al. (2014) and Hendrick et al. (2014) have discussed the error in MAX-DOAS NO<sub>2</sub> retrieval: 348 uncertainties from a priori aerosol and NO<sub>2</sub> profiles are the largest source by 10% - 14%, and the total 349 retrieval uncertainty is typically 12% - 17%. 350 To ensure sampling consistency in time, we average all valid MAX-DOAS measurements within

each observation period of GEMS (i.e., 30 minutes) for hourly comparison, and within  $\pm 1.5$  h of

352 TROPOMI, OMI and GOME-2 overpass time for daily comparison. Following the procedures in 353 previous studies (Lin et al., 2014; Liu et al., 2020), we exclude all matched MAX-DOAS data for which 354 the standard deviation exceeds 20% of the mean value to minimize the influence of local events. To 355 ensure sampling consistency in space, we select valid satellite pixels within 5 km of MAX-DOAS sites 356 for POMINO-GEMS and POMINO-TROPOMI v1.2.2, 25 km for OMNO2 v4 and 50 km for GOME-2 357 GDP 4.8, and conduct spatial averaging. The Grubbs statistical test, which is used to detect outliers in a univariate data set assumed to exhibit normal distribution (Grubbs, 1950), is performed to exclude 358 359 outliers in both MAX-DOAS and satellite data before comparison. Only one data pair from Fudan 360 University site is identified as an outlier and removed (Figure S7), and we get 1348 matched hourly data 361 pairs in total.

# 362

# 2.4 Mobile-car MAX-DOAS measurements

363 We use tropospheric NO<sub>2</sub> VCDs from mobile-car MAX-DOAS measurements performed by the 364 Chinese Academy of Meteorological Sciences (CAMS) in the Three Rivers' Source region in July 2021 365 (Cheng et al., 2023). The Three Rivers' Source region is on the northeastern Tibetan Plateau in western 366 China, which is isolated from massive anthropogenic activities, and hence a good place for observations of atmospheric compositions in the background atmosphere. The field campaign lasted from 18th to 30th 367 368 July 2021 and included four closed-loop journeys, beginning from the meteorological bureau of the city 369 of Xining (the Capital of Qinghai Province) to the meteorological bureau of Dari County of the Guoluo 370 Tibetan Autonomous Prefecture, to the meteorological bureau of Yushu Tibetan Autonomous Prefecture, 371 and then back to Xining City (Figure S6). The spectral analysis of the measurement spectra in the fitting 372 window of 400-434 nm was implemented with the DOAS method. Sequential Fraunhofer reference 373 spectrum (FRS) is used to derive NO<sub>2</sub> differential slant column densities (DSCDs), which are then 374 converted to VCDs by adopting the geometric approximation method. The errors are estimated to be less 375 than 20% at high altitudes. More detailed descriptions of instrumentation, field campaign and data 376 retrieval are in Cheng et al. (2023).

We average all valid mobile-car MAX-DOAS measurements within each observation period of GEMS in each  $0.05^{\circ} \times 0.05^{\circ}$  grid cell, to ensure spatiotemporal consistency. Over relatively clean areas with little human influence and biomass burning such as the Three Rivers' Source region, a large portion of NO<sub>2</sub> is located in the middle and upper troposphere, which is not accounted for in the mobile-car data via such a DSCD-based retrieval method. Indeed, Cheng et al. (2023) showed that the official TROPOMI
 NO<sub>2</sub> VCDs are higher than mobile-car data by about 40%. Considering that the diurnal variation of
 middle and upper tropospheric NO<sub>2</sub> is much smaller than that in the lower troposphere, we focus on the
 correlation of NO<sub>2</sub> diurnal variation between POMINO-GEMS and mobile car MAX-DOAS data.

#### 385 **2**

### 2.5 Ground-based MEE NO<sub>2</sub> measurements

386 We use hourly surface  $NO_2$  mass concentration measurements from the MEE air quality monitoring 387 network. By 2021, more than 2000 MEE stations across China have been established, providing hourly 388 observations for  $NO_2$  and five other air pollutants. Most stations are in urban or suburban areas.

The spatial distribution of all MEE sites in the GEMS FOV is shown in Figure S8a, and that of MEE sites over urban, suburban and rural regions are shown in Figure S8b–d, respectively. The classification of sites is based on Tencent user location data with a horizontal resolution of 0.05° × 0.05 ° for every 0.5 second from 31 August to 30 September 2021 (Figure S8e), adopted from previous work (Kong et al., 2022a). Here, urban MEE sites are defined as where the mean location request times is larger than 50 times per second, suburban sites refer to 5-50 times per second, and rural sites refer to less than 5 times per second. The number of sites for urban, suburban and rural sites are 808, 554 and 71, respectively.

At MEE sites, molybdenum catalyzed conversion from NO<sub>2</sub> to NO and subsequent chemiluminescence measurement of NO is done to estimate NO<sub>2</sub> concentrations. The heated molybdenum catalyst has low chemical selectivity, leading to strong interference from other oxidized nitrogen species such as nitric acid (HNO<sub>3</sub>) and peroxyacetyl nitrate (PAN). Therefore, MEE data tend to overestimate the actual NO<sub>2</sub> concentrations, with the extent of overestimation about 10% - 50%(Boersma et al., 2009; Liu et al., 2018a). The overestimation is dependent on the oxidation level of NO<sub>x</sub>, but is currently unclear for each site and hour.

To compare with satellite-derived surface NO<sub>2</sub> concentration data, we average over all valid MEE sites in each  $0.05^{\circ} \times 0.05^{\circ}$  grid cell to generate gridded MEE NO<sub>2</sub> data for each hour. To ensure sampling consistency for each day, we average MEE observations at two consecutive hours to match GEMS hourly observations – for example, we match the mean value of MEE NO<sub>2</sub> concentrations in 13:00 – 14:00 and 14:00 – 15:00 local solar time (LST) with the GEMS NO<sub>2</sub> in 13:45 – 14:15 LST. We also match MEE observations over the period 13:00 – 14:00 LST with TROPOMI-derived and OMI-derived surface NO<sub>2</sub>, and 9:00 – 10:00 LST with GOME-2-derived surface NO<sub>2</sub>.

#### 410 **3. Results and discussion**

### 411 **3.1 POMINO-GEMS tropospheric NO<sub>2</sub> VCDs**

412 Figure 4 shows mean POMINO-GEMS tropospheric NO<sub>2</sub> VCDs at each hour on a  $0.05^{\circ} \times 0.05^{\circ}$ grid in JJA 2021. High values of tropospheric NO<sub>2</sub> columns (>  $10 \times 10^{15}$  molec. cm<sup>-2</sup>) are evident over 413 414 populous regions such as South Korea, central and eastern China, and northern India. Clear hotspot 415 signals reveal intense NO<sub>x</sub> emissions over city clusters such as Beijing-Tianjin-Hebei (BTH), Yangtze 416 River Delta (YRD), Pearl River Delta (PRD) and Seoul Metropolitan Area (SMA), as well as isolated 417 megacities such as Osaka and Nagoya in Japan, Chengdu and Urumqi in China, and New Delhi in India. Tropospheric NO<sub>2</sub> VCDs are much lower ( $< 1 \times 10^{15}$  molec. cm<sup>-2</sup>) over most of western China and the 418 419 open ocean, due to low anthropogenic and natural emissions.

![](_page_15_Figure_3.jpeg)

420

Figure 4. Spatial distribution of POMINO-GEMS tropospheric NO<sub>2</sub> VCDs at each hour on a 0.05° × 0.05°
 grid in JJA 2021. The regions in grey mean there are no valid observations.

Figure 5a-c present NO<sub>2</sub> VCDs in the morning, noon and afternoon in JJA 2021 for eastern China.
Data are averaged in 22:45 - 01:45 UTC (06:45 - 09:45 Beijing Time, BJT), 02:45 - 04:45 UTC (10:45

425 -12:45 BJT) and 05:45 - 07:45 UTC (13:45 - 15:45 BJT) to represent the morning, noon and afternoon, 426 respectively. In the morning (Figure 5a), there are clear city signals with high NO<sub>2</sub> values, reflecting 427 abundant NO<sub>x</sub> emissions from traffic. The spatial gradients of NO<sub>2</sub> from urban centers to outskirts are 428 very strong. However, these spatial gradients are greatly reduced in the noon and afternoon (Figure 5b 429 and c). For example, the differences of tropospheric NO2 VCDs between the urban center of Xi'an 430 (108.93°N, 34.27°E) and its surrounding areas (within 50 km) are reduced from about  $8 \times 10^{15}$  molec. cm<sup>-2</sup> in the morning to about  $4 \times 10^{15}$  molec. cm<sup>-2</sup> at noon, and then to below  $2 \times 10^{15}$  molec. cm<sup>-2</sup> in the 431 432 afternoon. This is likely due to chemical loss of traffic-associated NO<sub>2</sub>, increased emissions from other 433 sectors (e.g., industry), and/or enhanced horizontal transport smearing the spatial gradient.

![](_page_16_Figure_1.jpeg)

434

Figure 5. Spatial distribution of three-hour-mean POMINO-GEMS tropospheric NO<sub>2</sub> VCDs in JJA 2021 on
a 0.05° × 0.05° grid. The first row is for eastern China in the (a) morning (22:45 – 01:45 UTC), (b) noon
(02:45 – 04:45 UTC) and (c) afternoon (05:45 – 07:45 UTC). The second row is for western China in the (d)
early morning (00:45 – 01:45 UTC), (e) morning to noon (02:45 – 04:45 UTC) and (f) noon (05:45 – 07:45
UTC). The regions in grey mean there are no valid observations.

440 Over western China with low tropospheric NO<sub>2</sub> VCDs (Figure 5d-f), there is a gradual increase of 441 tropospheric NO<sub>2</sub> by about  $1 \times 10^{15}$  molec. cm<sup>-2</sup> from the early morning to noon. This increase is likely 442 dominated by biogenic NO<sub>x</sub> emissions that are sensitive to sunshine intensity and surface temperature 443 (Kong et al., 2022b; Weng et al., 2020; Kong et al., 2023). Future studies are needed to understand the 444 exact causes.

445 Figure 6 shows the diurnal variation of POMINO-GEMS tropospheric NO<sub>2</sub> VCDs over six different 446 region groups in the GEMS FOV. The six groups are defined based on the levels of mean POMINO-447 GEMS tropospheric NO<sub>2</sub> VCDs at 12:00 LST in JJA 2021 (VCD<sub>12:00 LST</sub>), and their spatial distributions 448 are also shown in each panel. We convert the observation time from UTC to LST for each time zone in 449 this domain (+5 time zone:  $70^{\circ}E - 82.5^{\circ}E$ ; +6 time zone:  $82.5^{\circ}E - 97.5^{\circ}E$ ; +7 time zone:  $97.5^{\circ}E - 97.5^{\circ}E$ ; 112.5°E; +8 time zone: 112.5°E – 127.5°E; +9 time zone: 127.5°E – 140°E), and show the NO<sub>2</sub> diurnal 450 451 variations in each time zone with different colors. For low NO<sub>2</sub> situations (VCD<sub>12:00 LST</sub>  $\leq 2 \times 10^{15}$  molec. 452  $cm^{-2}$ ), NO<sub>2</sub> grow in the morning time in +5 and +6 time zones but not in other time zones. Over high NO<sub>2</sub> situations (VCD<sub>12:00 LST</sub> >  $8 \times 10^{15}$  molec. cm<sup>-2</sup>, in cities and suburban areas), NO<sub>2</sub> in all time zones 453 454 exhibit a minimum around noontime and a morning peak at 09:00 - 10:00 LST, consistent with previous 455 findings for specific polluted locations (Boersma et al., 2008; Boersma et al., 2009; Li et al., 2021a; 456 Ghude et al., 2020; Herman et al., 2019; Biswas and Mahajan, 2021). In all groups and time zones, 457 tropospheric NO<sub>2</sub> VCDs grow from noon to the afternoon.

458 The NO<sub>2</sub> diurnal variations are related to multiple driving factors. Different sources with distinctive 459 diurnal patterns dominate the NO<sub>x</sub> emissions over different regions. Lightning and biogenic activities are 460 the major emission sources over low NO<sub>2</sub> land areas, and they tend to intensify with temperature and 461 radiation in the daytime. Anthropogenic emissions are dominant over polluted cities and suburban areas, 462 where the traffic emissions tend to peak in the mid-morning and late afternoon (Jing et al., 2016; Liu et 463 al., 2018b; Naiudomthum et al., 2022). In addition, the photochemistry plays an important role.  $NO_2$  is 464 in chemical balance with NO, and the ratio of NO<sub>2</sub> and NO depends on radiation, ozone and peroxyl 465 radicals. NO<sub>x</sub> is oxidized to nitric acid and organic nitrates by radicals in the daytime, the level of which 466 depends on radiation, ozone and volatile organic compounds. Thus the lifetime of NO<sub>2</sub> reaches the 467 minimum value around noon, i.e., a few hours in summer. Furthermore, atmospheric transport also affects 468 the diurnal variation of NO<sub>2</sub> at high-value places (e.g., cities) and their surroundings. Further studies are 469 needed to determine the exact causes of NO2 diurnal variations at individual places.

18

![](_page_18_Figure_0.jpeg)

470

471Figure 6. POMINO-GEMS NO2 diurnal variations for six region groups classified based on mean472POMINO-GEMS tropospheric NO2 VCDs at 12:00 LST in JJA 2021 (VCD12:00 LST). (a) VCD12:00 LST less than473 $1 \times 10^{15}$  molec. cm<sup>-2</sup>; (b) VCD12:00 LST in  $1 - 2 \times 10^{15}$  molec. cm<sup>-2</sup>; (c) VCD12:00 LST in  $2 - 4 \times 10^{15}$  molec. cm<sup>-2</sup>;474(d) VCD12:00 LST in  $4 - 6 \times 10^{15}$  molec. cm<sup>-2</sup>; (e) VCD12:00 LST in  $6 - 8 \times 10^{15}$  molec. cm<sup>-2</sup> and (f) VCD12:00 LST475larger than  $8 \times 10^{15}$  molec. cm<sup>-2</sup>. In each panel, different colors denote the NO2 diurnal variation in different476time zones. N denotes the total number of valid  $0.05^{\circ} \times 0.05^{\circ}$  grid cells in each region. The error bars denote477the standard deviation of tropospheric NO2 VCDs at each hour in each time zone.

# 478 3.2 Comparison with POMINO-TROPOMI v1.2.2, OMNO2 v4 and GOME-2 GDP 4.8 NO2 VCD 479 products

Figure 7a and b show the POMINO-GEMS and POMINO-TROPOMI v1.2.2 tropospheric NO<sub>2</sub> VCDs, respectively, on a 0.05° × 0.05 ° grid averaged over JJA 2021. Cloud screening is implemented based on the CRFs from each product. To ensure temporal compatibility, matching between hourly GEMS observations and the TROPOMI data at the closest observation time is done for each day. Overall, POMINO-GEMS agrees well with POMINO-TROPOMI with a spatial correlation coefficient of 0.98, a linear regression slope of 1.18 and a small positive NMB of 4.9% (Figure 7c). Regionally, POMINO-

- 486 GEMS VCDs are higher than those of POMINO-TROPOMI v1.2.2 over eastern China, most India and
- 487 northwestern GEMS FOV, but smaller over western China and the oceans (Figure 7a, b; see Figure S9c
- 488 and d for differences plots). These differences are related to tropospheric NO<sub>2</sub> AMFs and SCDs. Detailed
- 489 discussion is given in Section 3 of the SI.

490

![](_page_19_Figure_4.jpeg)

Figure 7. Comparison between POMINO-GEMS and other products for tropospheric NO<sub>2</sub> VCDs in JJA
2021. (a-b) Between POMINO-GEMS and POMINO-TROPOMI v1.2.2 on a 0.05° × 0.05° grid, (d-e)
between POMINO-GEMS and OMNO2 v4 on a 0.25° × 0.25° grid, and (g-h) between POMINO-GEMS and
GOME-2 GDP 4.8 on a 0.5° × 0.5° grid. (c), (f) and (i) are respective scatterplots, in which the colors
represent data density. The regions in grey mean there are no valid observations.

496 Figure 7d-f and g-i show the comparison results of POMINO-GEMS tropospheric NO<sub>2</sub> VCDs with OMNO2 v4 on a  $0.25^{\circ} \times 0.25^{\circ}$  grid and GOME-2 GDP 4.8 on a  $0.5^{\circ} \times 0.5^{\circ}$  grid averaged over JJA 2021, 497 498 respectively. POMINO-GEMS NO2 VCDs exhibit good spatial consistency with the two independent 499 products (R = 0.87 and 0.83), although with slightly lower values than OMNO2 v4 (by 16.8%) and 500 GOME-2 GDP 4.8 (by 1.5%). These VCD differences are expected, considering the differences in the 501 retrieval algorithm. For example, the POMINO-GEMS algorithm implements explicit aerosol 502 corrections in the radiative transfer calculation, while OMNO2 v4 and GOME-2 GDP 4.8 treat aerosols 503 as "effective clouds". POMINO-GEMS accounts for the anisotropy of surface reflectance by adopting

- 504 MODIS BRDF coefficients, whereas OMNO2 v4 and GOME-2 GDP 4.8 use geometry-dependent and
- 505 regular LER, respectively. The horizontal resolution of a priori NO<sub>2</sub> profiles in POMINO-GEMS is 25
- 506 km (and interpolated to 2.5 km), 1° × 1.25 ° in OMNO2 v4 and 1.875° × 1.875 ° in GOME-2 GDP 4.8
- 507 (Krotkov et al., 2019; Valks, 2019).(Valks, 2019; Lamsal et al., 2021).
- 508 Based on comparisons with POMINO-TROPOMI v1.2.2, OMNO2 v4 and GOME-2 GDP 4.8 NO<sub>2</sub>
- 509 VCDs, we conclude that POMINO-GEMS NO<sub>2</sub> columns show good agreement with LEO satellite data,
- 510 with lower values by 20% at most.

#### 511 3.3 Validation with MAX-DOAS NO<sub>2</sub> VCD measurements

The scatterplot in Figure 8a compares POMINO-GEMS tropospheric NO<sub>2</sub> VCDs in JJA 2021 at all GEMS observation hours with matched ground based MAX-DOAS measurements at nine sites. POMINO-GEMS correlates with MAX-DOAS (R = 0.66) with a small negative bias (NMB = -11.1%). The linear regression shows a slope of 0.51 and intercept of  $3.34 \times 10^{15}$  molec. cm<sup>-2</sup>, reflecting underestimation of POMINO-GEMS tropospheric NO<sub>2</sub> VCDs on high-NO<sub>2</sub> days.

![](_page_20_Figure_9.jpeg)

![](_page_21_Figure_0.jpeg)

519 Figure 8. Evaluation of satellite NO<sub>2</sub> VCD data using ground-based MAX-DOAS measurements. (a) Scatterplot for tropospheric NO<sub>2</sub> VCDs (× 10<sup>15</sup> molec. cm<sup>-2</sup>) between MAX-DOAS and POMINO-GEMS at 520 521 all GEMS observation hours in JJA 2021. Each data pair denotes an hour. (b-c) Scatterplots for 522 tropospheric NO<sub>2</sub> VCDs (× 10<sup>15</sup> molec. cm<sup>-2</sup>) in JJA 2021 (b) between MAX-DOAS and POMINO-GEMS at 523 13:45 - 14:15 LST and (c) between MAX-DOAS and POMINO-TROPOMI v1.2.2. Each data pair denotes a 524 day. Each MAX-DOAS station is color-coded. (d) Diurnal variations of spatiotemporal correlation 525 coefficients and NMBs of POMINO-GEMS tropospheric NO2 VCDs relative to ground-based MAX-DOAS 526 data.

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527
             Figure 8b-c further use MAX-DOAS measurements to evaluate POMINO-GEMS and POMINO-
        TROPOMI v1.2.2 tropospheric NO<sub>2</sub> VCDs at the overpass time of TROPOMI. In Figure 8b, POMINO-
528
529
        GEMS data at 13:45 – 14:15 LST are used to match the overpass time of TROPOMI. The POMINO-
530
        TROPOMI product is evaluated in the context of understanding the relative performance of POMINO-
531
        GEMS. Each data point represents a day. Figure 8b-c show that the day-to-day variability of MAX-
        DOAS measurements is well captured by POMINO-TROPOMI v1.2.2 (R = 0.83), but less so by
532
533
        POMINO-GEMS (R = 0.65). Linear regression results show an underestimate of tropospheric NO<sub>2</sub> VCDs
534
        in POMINO-TROPOMI v1.2.2 (NMB = -18.1\%), as also found in previous studies (Liu et al., 2020).
535
        POMINO-GEMS exhibits a small bias (NMB = -9.0\%), but station-dependent performance is apparent.
536
        At the two remote sites of Fukue and Cape Hedo with low NO<sub>2</sub>, POMINO-GEMS NO<sub>2</sub> columns are
537
        higher than those of MAX-DOAS measurements. At the other sites, the data pairs are more scattered and
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538 located both above and below the 1:1 line, resulting in a small NMB.

539 Figure 8d shows the NMBs and correlation coefficients of POMINO-GEMS NO<sub>2</sub> VCDs relative to 540 ground-based MAX-DOAS data at each hour. The NMBs are negative at most hours except 23:00 UTC 541 (07:00 BJT). The negative NMBs reach a maximum of about 20% at  $\frac{02:00 \text{ UTC}}{(10:00 \text{ BJT})_{72}}$  and 542 decrease to less than 10% in the afternoon. The correlation coefficients are modest or high (0.45 - 0.73)543 at most hours, with the exception at the first hour which is likely due to few valid data (N = 17).all hours. 544 Figure 9 compares the diurnal variation of tropospheric NO<sub>2</sub> VCDs between POMINO-GEMS and 545 MAX-DOAS at eight stations. At each site, NO<sub>2</sub> values are averaged in JJA 2021 at each hour for 546 comparison, and the number of valid days for each hour is also shown. The Cape Hedo site is not included 547 because there are few valid MAX-DOAS data points at each hour. Figure 10a-f show that at the urban 548 and suburban sites, MAX-DOAS NO<sub>2</sub> (black lines) peaks in the mid-to-late morning, declines towards 549 the minimum values at noon around 13:00 LST, and then gradually increases in the afternoon. Strong 550 correlation of NO<sub>2</sub> diurnal variation between POMINO-GEMS (red solid lines) and MAX-DOAS is 551 found at Xuzhou (R = 0.82), Hefei (R = 0.96), Fudan University (R = 0.84), Nanhui (R = 0.79) and 552 Xianghe (R = 0.94). At the Dianshan Lake site, POMINO-GEMS NO<sub>2</sub> columns increase but MAX-553 DOAS data decrease from 08:00 to 09:00 LST, resulting in a lower correlation coefficient (R = 0.60). At 554 Chongming and Fukue sites, MAX-DOAS NO2 shows a peak in the morning without evident increase in 555 the early afternoon, but this diurnal pattern is not fully captured by POMINO-GEMS. At Fukue, 556 POMINO-GEMS NO<sub>2</sub> exhibit abrupt changes at 12:00 and 13:00 LST due to few valid data. In addition, comparison of POMINO-GEMS diurnal variation with NO2 data from GOME-2 in the 557

558 morning and OMI and TROPOMI in the early afternoon shows good agreement at Hefei, Nanhui, 559 Dianshan Lake, Chongming and Fukue sites. The differences between POMINO-GEMS to MAX-DOAS 560 NO<sub>2</sub> VCDs are comparable or smaller than those between LEO satellite and MAX-DOAS NO<sub>2</sub> VCDs.

![](_page_23_Figure_0.jpeg)

561

Figure 9. Diurnal variation of hourly tropospheric NO<sub>2</sub> VCDs (× 10<sup>15</sup> molec. cm<sup>-2</sup>) of MAX-DOAS (black 562 563 lines), and POMINO-GEMS with TROPOMI correction (red solid lines). and re-calculated POMINO-564 GEMS without TROPOMI correction (red dashed lines) at eight sites in JJA 2021. The error bars denote 565 the standard deviation of MAX-DOAS and POMINO-GEMS NO2 at each hour, respectively. Diurnal 566 correlation and all-hour-mean NMB of POMINO-GEMS against MAX-DOAS data are shown. The number 567 of valid days for each hour is also presented. The black squares with an error bar represent the mean value 568 and standard deviation of MAX-DOAS tropospheric NO2 VCDs matched with POMINO-TROPOMI v1.2.2 569 (blue squares), OMNO2 v4 (orange squares) and GOME-2 GDP 4.8 (green squares), respectively.

570 As we use TROPOMI total NO<sub>2</sub> SCDs to correct those of GEMS, this may influence the NO<sub>2</sub> diurnal 571 variation of original GEMS observations. Thus we also compare MAX-DOAS data with re-calculated 572 POMINO-GEMS tropospheric NO<sub>2</sub> VCDs without correction in total SCDs (red dashed lines in Figure 573 9). Compared to our default POMINO-GEMS data (with correction), excluding the correction leads to 574 lower diurnal correlation coefficients at Xuzhou, Hefei, Fudan University, Nanhui and Dianshan Lake, 575 but higher correlation coefficients at Xianghe, Chongming and Fukue. Excluding the correction increases 576 the NMB at three sites but decreases the NMB at five sites. We conclude that at these eight sites (in the 577 eastern areas), no significant influence on the diurnal variation of POMINO-GEMS tropospheric NO2 578 VCDs is brought in through TROPOMI-based correction for total NO<sub>2</sub> SCDs. 579 Figure 10 compares the diurnal variations between POMINO-GEMS and mobile-car MAX-DOAS

580 tropospheric NO<sub>2</sub> VCD data in the Three Rivers' Source region on the Tibetan Plateau. Results of

581 POMINO-GEMS with and without total SCD correction are shown in the red solid and dashed lines, 582 respectively. Mobile-car MAX-DOAS data show an evident decrease of tropospheric NO<sub>2</sub> VCDs from 583 the morning to noon with little change thereafter. Such NO2 diurnal patterns reflect the spatial and 584 temporal variations of tropospheric NO<sub>2</sub> along the driving route. The high NO<sub>2</sub> values with large standard 585 deviation at 09:00 BJT is due to enhanced pollution and variability in the morning when the car is in or 586 near the Xining city. The NO2 diurnal variations of POMINO-GEMS with correction correlate well with 587 those of mobile-car MAX-DOAS data (R = 0.81). In contrast, POMINO-GEMS without total SCD 588 correction exhibits much poorer correlation with mobile-car MAX-DOAS data, due to the erroneous 589 increase in the afternoon.

590 Overall, the validation results with independent ground-based and mobile-car MAX-DOAS 591 measurements provide confidence on the general characteristics of POMINO-GEMS NO<sub>2</sub> diurnal 592 variations.

![](_page_24_Figure_2.jpeg)

![](_page_24_Figure_3.jpeg)

594 Figure 10. Diurnal variation of hourly mean tropospheric NO<sub>2</sub> VCDs (× 10<sup>15</sup> molec. cm<sup>-2</sup>) of mobile-car 595 MAX-DOAS and POMINO-GEMS in the Three Rivers' Source region. The black solid lines denote MAX-596 DOAS data that spatiotemporally match with POMINO-GEMS with total SCD correction (red solid lines). 597 The black dashed lines denote MAX-DOAS data that spatiotemporally match with POMINO-GEMS 598 without correction (red dashed lines). The error bars denote the standard deviation of MAX-DOAS and 599 POMINO-GEMS NO2 at each hour during the field campaign, respectively. Values for diurnal correlation 600 and mean NMB of POMINO-GEMS relative to MAX-DOAS are shown. The number of days with valid 601 data for each hour is also presented.

602 **3.4 Validation with surface NO<sub>2</sub> concentration measurements from MEE** 

The scatterplot in Figure 11a compares surface NO<sub>2</sub> concentrations derived from POMINO-GEMS with MEE measurements at all hours. POMINO-GEMS derived surface NO<sub>2</sub> concentrations show good agreement with MEE measurements in terms of spatiotemporal correlation (R = 0.78) and bias (NMB = -26.3%), but are higher than those of MEE at some high-value situations, which mainly occur over the YRD region (Figure S14). These differences reflect errors in POMINO-GEMS NO<sub>2</sub> VCDs, in the conversion from tropospheric VCDs to surface concentrations, and in MEE data (due to potential contamination by nitric acid and organic nitrates (Liu et al., 2018a)).

![](_page_25_Figure_2.jpeg)

![](_page_26_Figure_0.jpeg)

Figure 11. Evaluation of satellite-derived surface NO<sub>2</sub> concentrations (μg m<sup>-3</sup>) using MEE measurements in
JJA 2021. (a) Scatterplot for MEE and POMINO-GEMS at all GEMS observation hours averaged over all
days in JJA 2021. (b) Scatterplot for MEE and POMINO-GEMS at 13:45 – 14:15 LST. (c) Scatterplot for
MEE and POMINO-TROPOMI v1.2.2. The color bar represents the data density. (d) Diurnal variations of
spatiotemporal correlation coefficients and NMBs of POMINO-GEMS derived surface NO<sub>2</sub> concentrations
relative to MEE measurements.

611

618 Figure 11b-c show validation results for satellite-derived surface NO2 concentrations with MEE 619 measurements at the overpass time of TROPOMI (i.e., early afternoon). Here, each data pair denotes a 620 MEE site. POMINO-GEMS results at 13:45 - 14:15 LST are used to match the overpass time of 621 TROPOMI data. Overall, both satellite-based datasets show good spatial correlation with MEE 622 measurements (R = 0.63 and 0.61). POMINO-GEMS exhibits higher linear regression slope (0.50) with 623 smaller NMB (-48.0%). The values of satellite data are lower than those from MEE, especially in the 624 afternoon (Figure 11d). This is in part because of the aforementioned contamination issues in MEE data, 625 which becomes severer in the afternoon as the air gets more aged throughout the daytime.

Figure 12a examines the diurnal variation of surface  $NO_2$  concentrations averaged over JJA 2021 at all sites. The MEE data show a smooth and monotonic decline from the early morning to the early afternoon, with a slight increase beginning at 15:00 LST. This diurnal pattern differs from those seen in ground-based MAX-DOAS VCD data (Figure 9), due to the difference in sampling size between MEE and MAX-DOAS, the diurnal variation of  $NO_2$  vertical distribution that affects the relationship between surface and columnar  $NO_2$ , as well as the insensitivity of  $NO_2$  columns to changes in PBL heights. 632 POMINO-GEMS derived surface NO<sub>2</sub> concentrations show similar diurnal variations to those of MEE (R = 0.97), although with a peak at 10:00 LST and a gradual increase beginning at 14:00 LST. The 633 634 discrepancies between POMINO-GEMS and MEE surface NO<sub>2</sub> concentrations at different hours are 635 likely caused by the assumed constant correction factor of 2 to account for the vertical gradient of  $NO_2$ 636 from the height of ground instrument to the center of the first model layer (Section 2.2). In the morning 637 when the PBL is low, most NO<sub>2</sub> molecules are near the ground and the vertical gradient of NO<sub>2</sub> over 638 polluted regions is the largest in the daytime, so the factor of 2 may lead to underestimation of derived 639 surface NO<sub>2</sub> concentrations. In contrast, in the afternoon, the PBL mixing is much stronger and the 640 vertical gradient of  $NO_2$  is much smaller, thus the factor of 2 may lead to overestimated surface  $NO_2$ 641 concentrations. Note that the consistency between POMINO-GEMS and MEE data does not depend on 642 the total SCD correction (Table S4).

To quantify the influences of the diurnal variation of hourly column-to-surface ratio from GEOS-Chem simulations, we compare the MEE measurements with POMINO-GEMS derived surface  $NO_2$ concentrations using daily column-to-surface ratio (Figure S15). As expected, POMINO-GEMS derived NO<sub>2</sub> concentrations show a similar diurnal variation as the tropospheric  $NO_2$  VCDs do, with two peaks in the mid-morning and afternoon, and a minimum at noon. The temporal correlation coefficient with MEE is only about 0.23. Thus it is more reasonable to use hourly ratio for comparison with MEE measurements, as done in our study.

To further test the reliability of our VCD-to-surface-concentration conversion method (Eq. (9)), we apply the same method to MAX-DOAS NO<sub>2</sub> VCDs and compare the resulting surface NO<sub>2</sub> concentrations with MEE data. As shown in Figure S16, the diurnal variation of MAX-DOAS derived surface NO<sub>2</sub> concentrations correlates well with that of MEE measurements (R = 0.96), in support of our conversion method.

![](_page_28_Figure_0.jpeg)

Figure 12. Diurnal variation of hourly surface NO<sub>2</sub> concentrations (μg m<sup>-3</sup>) of MEE (back lines) and
POMINO-GEMS (red lines) in JJA 2021. (a) At all MEE sites, (b) at urban sites, (c) at suburban sites and
(d) at rural sites. The error bars denote the standard deviation of MEE and POMINO-GEMS derived
surface NO<sub>2</sub> concentrations at each hour in JJA 2021, respectively. Diurnal correlation and mean NMB of
POMINO-GEMS relative to MEE are also listed. The black squares with an error bar represent the mean
value and standard deviation of MEE data matched with POMINO-TROPOMI v1.2.2 (blue squares),
OMNO2 v4 (orange squares) and GOME-2 GDP 4.8 (green squares), respectively.

663 Figure 12b-d show the comparison of NO<sub>2</sub> diurnal variations for different groups of MEE sites. The 664 diurnal variations of POMINO-GEMS derived surface NO2 concentrations show similar characteristics 665 over urban, suburban and rural regions, and all correlate well with those of MEE data. Meanwhile, surface NO<sub>2</sub> concentrations derived from LEO satellite observations also agree well with those of 666 667 POMINO-GEMS, except that POMINO-GEMS derived surface NO<sub>2</sub> concentrations are higher than 668 those of GOME-2 GDP 4.8 by about 40% - 60%. We conclude that validation with extensive MEE 669 measurements presents promising performance of POMINO-GEMS retrievals, especially the great 670 agreement of POMINO-GEMS NO2 diurnal variation with MEE data over urban, suburban and rural 671 regions.

### 672 **3.5 Error estimates for POMINO-GEMS tropospheric NO<sub>2</sub> VCDs**

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Total retrieval errors for POMINO-GEMS tropospheric NO<sub>2</sub> VCDs are derived from the calculations of total SCDs, stratospheric SCDs, and tropospheric AMFs. Spatial and temporal averaging across GEMS pixels can greatly reduce the random errors, but will not affect the systematic errors. Here,
we provide a preliminary estimate of POMINO-GEMS errors for the summertime retrieval discussed
above.

678 As described in Section 2, we calculate hourly total SCDs based on the original GEMS SCD data 679 and daily TROPOMI-guided corrections. According to the GEMS ATBD of NO2 retrieval algorithm, the SCD errors from the DOAS method are < 5.65% at high-NO<sub>2</sub> conditions (NO<sub>2</sub> VCD  $> 1 \times 10^{15}$  molec. 680 cm<sup>-2</sup>) (Lee et al., 2020). The NO<sub>2</sub> SCD errors of TROPOMI are reported to be  $0.5 - 0.6 \times 10^{15}$  molec. 681 682 cm<sup>-2</sup> (10% in a relative sense) (Van Geffen et al., 2022a). Given the assumption we made in adjusting 683 GEMS total SCDs to match TROPOMI values, we tentatively estimate the error in our corrected total SCD data to be  $0.5 - 0.7 \times 10^{15}$  molec. cm<sup>-2</sup> (10% in a relative sense) for most regions and  $0.9 \times 10^{15}$ 684 molec.  $\text{cm}^{-2}$  (20% – 30%) at the edge of the northwestern GEMS FOV. 685

686 In constructing the stratospheric NO<sub>2</sub> SCDs, the stratospheric VCDs are taken from TROPOMI PAL 687 v2.3.1, scaled based on GEOS-CF v1 stratospheric NO2 to account for diurnal variation, and then applied with geometric AMFs. We assign a constant error of  $0.2 \times 10^{15}$  molec. cm<sup>-2</sup> (5% – 10%) to our hourly 688 689 stratospheric SCDs, the same as the value for TROPOMI (Van Geffen et al., 2022a). Few studies have 690 assessed the accuracy of stratospheric NO<sub>2</sub> and its diurnal variation from GEOS-CF data (Knowland et 691 al., 2022b), but our comparison between GEOS-CF and TROPOMI shows great consistency (Section 692 2.1.5). As most of the errors in total SCDs are absorbed in the stratosphere-troposphere separation step 693 (Van Geffen et al., 2015), the errors in tropospheric SCDs should be 10% - 30% depending on different 694 cases, with higher relative biases in cleaner situations.

695 Tropospheric AMF calculations are the dominant error source for retrieved tropospheric NO2 VCDs 696 over polluted regions. According to Liu et al. (2020), the AMF errors caused by uncertainty in surface 697 reflectance are about 10%, and errors induced by uncertainties in aerosol parameters are about 10% in 698 clean regions and 20% for heavily polluted situations. We further assume that the  $O_2$ - $O_2$  cloud retrieval 699 algorithm introduces another error at the 10% level to the NO<sub>2</sub> AMFs. The uncertainty in a priori NO<sub>2</sub> 700 vertical profiles is estimated to cause an AMF error by 10% (Liu et al., 2020). Yang et al. (2023) 701 suggested that the NO<sub>2</sub> profiles from GEOS-Chem (version 13.3.4) might contain incorrect timing of 702 PBL mixing growth in the morning and thus introduce a relative root-mean-square error of 7.6% and 703 NMB of 2.7% in AMF; however, this error could be greatly dampened by averaging over a long time period. The free tropospheric NO<sub>2</sub> bias in GEOS-Chem NO<sub>2</sub> profiles might also contribute to the retrieval errors especially over remote regions. Adding these errors in quadrature leads to the overall AMF errors for POMINO-GEMS at 20% - 40%.

The overall uncertainty in POMINO-GEMS tropospheric  $NO_2$  VCDs is estimated by adding in quadrature the errors in tropospheric  $NO_2$  SCDs and AMFs, when these errors are expressed in the relative sense. For remote regions with low tropospheric  $NO_2$  abundances, the overall retrieval uncertainties can reach 30% - 50% and are dominated by errors in tropospheric SCDs. For regions with abundant tropospheric  $NO_2$ , the uncertainties of retrieved tropospheric VCDs are dominated by the AMF errors and are estimated to be about 20% - 30%.

As shown in Figure 8d and Figure 11d, the maximum negative NMB of POMINO-GEMS tropospheric NO<sub>2</sub> VCDs relative to ground-based MAX-DOAS data is about 20% in the mid-morning, and the NMB of POMINO-GEMS derived surface NO<sub>2</sub> concentrations to MEE measurements is -30%on average. Thus our estimated error magnitude is supported by the independent ground-based MAX-DOAS and MEE data.

#### 718 **4. Conclusions**

719 The GEMS instrument provides an unprecedented opportunity for air quality monitoring at a high 720 spatiotemporal resolution. Our POMINO-GEMS algorithm retrieves tropospheric NO<sub>2</sub> VCDs as a 721 research product. The algorithm first calculates hourly tropospheric NO<sub>2</sub> SCDs through fusion of total 722 NO<sub>2</sub> SCDs from the GEMS v1.0 L2 NO<sub>2</sub> product, total and stratospheric NO<sub>2</sub> columns from the 723 TROPOMI PAL v2.3.1 L2 NO2 product, and stratospheric NO2 diurnal variations from the GEOS-CF v1 724 dataset. The fusion approach reduces the high bias in total SCDs and removes the stripe-like patterns in 725 the official GEMS v1.0 product. Our algorithm then calculates tropospheric NO<sub>2</sub> AMFs to convert SCDs 726 to VCDs. A preliminary estimate of retrieval errors is also given.

Our initial POMINO-GEMS data for JJA 2021 shows high values of tropospheric NO<sub>2</sub> VCDs with clear hotspots (>  $10 \times 10^{15}$  molec. cm<sup>-2</sup>) over regions where anthropogenic emissions of NO<sub>x</sub> are abundant. The spatial gradients of tropospheric NO<sub>2</sub> VCDs from urban centers to surrounding areas are substantial in the morning due to traffic emissions, but the gradients are much reduced at noon and in the afternoon. A gradual increase of tropospheric NO<sub>2</sub> VCDs from the morning to noon is observed over clean regions of western China, likely as a result of enhanced biogenic emissions. Over high NO<sub>2</sub> regions where anthropogenic activities dominate the NO<sub>x</sub> emissions, NO<sub>2</sub> columns increase until a peak at 09:00 - 10:00LST, decrease to the minimum at noon and then increase in the afternoon again. Such characteristics of NO<sub>2</sub> diurnal variations are associated with the changes in natural and anthropogenic NO<sub>x</sub> emissions, photochemistry and atmospheric transport.

POMINO-GEMS tropospheric NO<sub>2</sub> VCDs agree well with POMINO-TROPOMI v1.2.2 in terms of spatial correlation (0.98) and NMB (4.9%). POMINO-GEMS data are also consistent with the OMNO2 v4 tropospheric NO<sub>2</sub> VCD product in the early afternoon and GOME-2 GDP 4.8 tropospheric NO<sub>2</sub> VCD product in the morning, with *R* of 0.87 and 0.83, and NMB of -16.8% and -1.5%, respectively.

741 POMINO-GEMS tropospheric NO2 VCDs are comparable with ground-based MAX-DOAS 742 measurements at nine ground-based sites with a small NMB (-11.1%), although the correlation is modest (R = 0.66). Both the bias and correlation values are smaller than POMINO-TROPOMI v1.2.2 (NMB = 743 -18.1%, R = 0.83). More importantly, POMINO-GEMS well captures the diurnal variation of MAX-744 745 DOAS NO<sub>2</sub> VCDs at Xuzhou (R = 0.82), Hefei (R = 0.96), Fudan University (R = 0.84), Nanhui (R = 0.84), N 746 0.79), Xianghe (R = 0.94) and Dianshan Lake (R = 0.60) sites, although the correlations are relatively 747 poor at Chongming and Fukue sites. Comparison with mobile-car MAX-DOAS measurements in the 748 Three Rivers' Source region on the Tibetan Plateau also shows good correlation in NO<sub>2</sub> diurnal variation 749 (R = 0.81).

We also compare surface NO<sub>2</sub> concentrations derived from tropospheric NO<sub>2</sub> VCDs in POMINO-GEMS and POMINO-TROPOMI v1.2.2 against MEE data, taking advantage of the large number of MEE sites. POMINO-GEMS derived surface NO<sub>2</sub> concentration data exhibit a small NMB (-26.3%). For these sites at TROPOMI overpass times, POMINO-GEMS derived surface NO<sub>2</sub> concentrations show a smaller magnitude of NMB (-48.0%) than POMINO-TROPOMI v1.2.2 (-55.8%). Excellent agreement in diurnal variation between POMINO-GEMS derived and MEE NO<sub>2</sub> is exhibited over all (*R* = 0.97), urban (*R* = 0.97), suburban (*R* = 0.97) and rural (*R* = 0.96) sites.

Overall, our comprehensive validation process highlights the good performance of POMINO-GEMS tropospheric NO<sub>2</sub> VCD product, both in magnitude and spatiotemporal variation. However, there are still several limitations in our study. To address the systematic overestimation and stripes problems in the original GEMS data, we correct GEMS total NO<sub>2</sub> SCDs by using TROPOMI data as a temporary solution. For example, we implement a simple geometric correction to combine GEMS and TROPOMI

762 total NO<sub>2</sub> SCDs, but their differences in scattering geometry are only partly accounted for. Thus this correction works well in most regions, but may introduce SCD uncertainties up to  $0.9 \times 10^{15}$  molec. cm<sup>-</sup> 763 764  $^{2}$  (20% – 30%) at the edge of the northwestern GEMS FOV. Currently, the Environmental Satellite Center 765 of South Korea is updating the NO<sub>2</sub> SCD data to v2.0. We will update our POMINO-GEMS algorithm 766 accordingly, once the updated official NO<sub>2</sub> product becomes available to provide necessary inputs for 767 our research product. In addition, in the conversion from NO2 VCDs to surface concentrations, we use a constant correction factor of 2 to account for the strong NO<sub>2</sub> vertical gradient near the surface. This 768 769 simple treatment does not account for the diurnal variation of the correction factor, and thus may 770 introduce errors in the derived surface NO<sub>2</sub> concentrations. Nevertheless, the current POMINO-GEMS 771 data serve as our initial attempt to derive the diurnal variations of tropospheric  $NO_2$  at a high 772 spatiotemporal resolution from GEMS, and they are expected to offer a useful source of information for 773 various applications such as air quality analysis and emission constraint.

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775 Data availability. The POMINO-GEMS NO<sub>2</sub> data will be freely available soon at the ACM group 776 product website (http://www.pku-atmos-acm.org/acmProduct.php/). The TROPOMI PAL v2.3.1 L2 777 product can be downloaded from https://data-portal.s5p-pal.com. The OMNO2 v4 L2 product can be 778 downloaded from https://aura.gesdisc.eosdis.nasa.gov/data/Aura OMI Level2/OMNO2.003/. The GOME-2 GDP 4.8 L2 product can be downloaded from http://acsaf.org/ after registration. The GEOS-779 780 CF v1.0 dataset can be downloaded from https://gmao.gsfc.nasa.gov/weather prediction/GEOS-781 CF/data access/. The MEE surface NO<sub>2</sub> measurements can be downloaded from https://quotsoft.net/air/. 782 The ground-based and mobile-car MAX-DOAS measurements can be provided upon requests to the 783 corresponding owners.

784

*Author contributions*. JL conceived this research. YZ and JL designed the algorithm and validation
process. YZ performed all calculations with additional code support from HK. YZ and JL wrote the paper.
RS provided LIDORT. JK, HL, JP and HH provided GEMS data. MVR, FH, TiW, PW, QH, KQ, YC,
YK, JX, PX, XT, SZ and SW provided the ground-based MAX-DOAS measurements. SC, XC, JM and
ThW provided the mobile-car MAX-DOAS measurements. HK helped process MEE measurements. LC

and ML helped analyze the validation results. All authors commented on the paper.

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

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*Financial support.* This research has been supported by the National Natural Science Foundation of
 China (grant no. 42075175) and the Second Tibetan Plateau Scientific Expedition and Research Program
 (grant no. 2019QZKK0604).

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