Comprehensive evaluations of diurnal NO\textsubscript{2} measurements during DISCOVER-AQ 2011: Effects of resolution dependent representation of NO\textsubscript{x} emissions

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Abstract

Nitrogen oxides (NO\textsubscript{x} = NO + NO\textsubscript{2}) play a crucial role in the formation of ozone and secondary inorganic and organic aerosols, thus affecting human health, global radiation budget, and climate. The diurnal and spatial variations of NO\textsubscript{2} are functions of emissions, advection, deposition, vertical mixing, and chemistry. Their observations, therefore, provide useful constraints in our understanding of these factors. We employ a Regional chEmical and trAnsport model (REAM) to analyze the observed temporal (diurnal cycles) and spatial distributions of NO\textsubscript{2} concentrations and tropospheric vertical column densities (TVCDs) using aircraft in situ measurements, surface EPA Air Quality System (AQS) observations, as well as the measurements of TVCDs by satellite instruments (OMI: the Ozone Monitoring Instrument; and GOME-2A: Global Ozone Monitoring Experiment – 2A), ground-based Pandora, and the Airborne Compact Atmospheric Mapper (ACAM) instrument, in July 2011 during the DISCOVER-AQ campaign over the Baltimore-Washington region. The model simulations at 36- and 4-km resolutions are in reasonably good agreement with the regional mean temporospatial NO\textsubscript{2} observations in the daytime. However, we find significant overestimations (underestimations) of model simulated NO\textsubscript{2} (O\textsubscript{3}) surface concentrations during nighttime, which can be mitigated by enhancing nocturnal vertical mixing in the model. Another discrepancy is that Pandora measured NO\textsubscript{2} TVCDs show much less variation in the late afternoon than simulated in the model. The higher resolution 4-km simulations tend to show larger biases compared to the observations due largely to the larger spatial variations of NO\textsubscript{x} emissions in the model when the model spatial resolution is increased from 36 to 4 km. OMI, GOME-2A, and the high-resolution aircraft ACAM observations show a more dispersed distribution of NO\textsubscript{2} vertical column densities (VCDs) and lower VCDs in urban regions than corresponding 36- and 4-km model simulations, reflecting likely the spatial distribution bias of NO\textsubscript{x} emissions in the National Emissions Inventory (NEI) 2011.
1 Introduction

Nitrogen oxides (NO$_x$ = NO + NO$_2$) are among the most important trace gases in the atmosphere due to their crucial role in the formation of ozone (O$_3$), secondary aerosols, and their role in the chemical transformation of other atmospheric species, such as carbon monoxide (CO) and volatile organic compounds (VOCs) (Cheng et al., 2017; Cheng et al., 2018; Fisher et al., 2016; Li et al., 2019; Liu et al., 2012; Ng et al., 2017; Peng et al., 2016; Zhang and Wang, 2016). NO$_x$ is emitted by both anthropogenic activities and natural sources. Anthropogenic sources account for about 77% of the global NO$_x$ emissions, and fossil fuel combustion and industrial processes are the primary anthropogenic sources, which contribute to about 75% of the anthropogenic emissions (Seinfeld and Pandis, 2016). Other important anthropogenic sources include agriculture and biomass and biofuel burning. Soils and lightning are two major natural sources. Most NO$_x$ is emitted as NO, which is then oxidized to NO$_2$ by oxidants, such as O$_3$, the hydroperoxyl radical (HO$_2$), and organic peroxy radicals (RO$_2$).

The diurnal variations of NO$_2$ controlled by physical and chemical processes reflect the temporal patterns of these underlying controlling factors, such as NO$_x$ emissions, chemistry, deposition, advection, diffusion, and convection. Therefore, the observations of NO$_2$ diurnal cycles can be used to evaluate our understanding of NO$_x$ related emission, chemistry, and physical processes (Frey et al., 2013; Jones et al., 2000; Judd et al., 2018). For example, Brown et al. (2004) analyzed the diurnal patterns of surface NO, NO$_2$, NO$_3$, N$_2$O$_5$, HNO$_3$, OH, and O$_3$ concentrations along the East Coast of the United States (U.S.) during the New England Air Quality Study (NEAQS) campaign in the summer of 2002 and found that the predominant nighttime sink of NO$_x$ through the hydrolysis of N$_2$O$_5$ had an efficiency on par with daytime photochemical loss over the ocean surface off the New England coast. Van Stratum et al. (2012) investigated the contribution of boundary layer dynamics to chemistry evolution during the DOMINO (Diel Oxidant Mechanisms in relation to Nitrogen Oxides) campaign in 2008 in Spain and found that entrainment and boundary layer growth in daytime influenced mixed-layer NO and NO$_2$. 
diurnal cycles on the same order of chemical transformations. David and Nair (2011) found that the diurnal patterns of surface NO, NO₂, and O₃ concentrations at a tropical coastal station in India from November 2007 to May 2009 were closely associated with sea breeze and land breeze which affected the availability of NOₓ through transport. They also thought that monsoon-associated synoptic wind patterns could strongly influence the magnitudes of NO, NO₂, and O₃ diurnal cycles. The monsoon effect on surface NO, NO₂, and O₃ diurnal cycles was also observed in China by Tu et al. (2007) on the basis of continuous measurements of NO, NO₂, and O₃ at an urban site in Nanjing from January 2000 – February 2003.

In addition to surface NO₂ diurnal cycles, the daily variations of NO₂ vertical column densities (VCDs) were also investigated in previous studies. For example, Boersma et al. (2008) compared NO₂ tropospheric VCDs (TVCDs) retrieved from OMI (the Ozone Monitoring Instrument) and SCIAMACHY (SCanning Imaging Absorption SpectroMeter for Atmospheric CHartography) in August 2006 around the world. They found that the diurnal patterns of different types of NOₓ emissions could strongly affect the NO₂ TVCD variations between OMI and SCIAMACHY and that intense afternoon fire activity resulted in an increase of NO₂ TVCDs from 10:00 LT (local time) to 13:30 LT over tropical biomass burning regions. Boersma et al. (2009) further investigated the NO₂ TVCD change from SCIAMACHY to OMI in different seasons of 2006 in Israeli cities and found that there was a slight increase of NO₂ TVCDs from SCIAMACHY to OMI in winter due to increased NOₓ emissions from 10:00 LT to 13:30 LT and a sufficiently weak photochemical sink and that the TVCDs from OMI were lower than SCIAMACHY in summer due to a strong photochemical sink of NOₓ.

All these above researches, however, exploited only NO₂ surface or satellite VCD measurements. Due to the availability of ground-based NO₂ VCD observations, some recent studies tried to investigate the diurnal relationships between NO₂ surface concentrations and NO₂ VCDs (Kollonige et al., 2018; Thompson et al., 2019). For example, Zhao et al. (2019) converted Pandora direct-sun and zenith-sky NO₂ VCDs to NO₂ surface
concentrations using concentration-to-partial-column ratios and found that the derived concentrations well captured the observed NO$_2$ surface diurnal and seasonal variations. Knepp et al. (2015) related the daytime variations of NO$_2$ TVCD measurements by ground-based Pandora instruments to the variations of coincident NO$_2$ surface concentrations using a planetary boundary layer height (PBLH) factor over the periods July 2011 – October 2011 at the NASA Langley Research Center in Hampton, Virginia and July 2011 at Padonia and Edgewood sites in Maryland for the DISCOVER-AQ experiment, showing the importance of boundary-layer vertical mixing on NO$_2$ vertical distributions and the ability of NO$_2$ VCD measurements to infer hourly boundary-layer NO$_2$ variations. DISCOVER-AQ, the Deriving Information on Surface conditions from Column and Vertically Resolved Observations Relevant to Air Quality experiment (https://discover-aq.larc.nasa.gov/, last access: April 6, 2019), was designed to better understand the relationship between boundary-layer pollutants and satellite observations (Flynn et al., 2014; Reed et al., 2015). Figure 1 shows the sampling locations of the summer DISCOVER-AQ 2011 campaign in the Baltimore-Washington metropolitan region. In this campaign, the NASA P-3B aircraft flew spirals over six air quality monitoring sites (Aldino - rural/suburban, Edgewood - coastal/urban, Beltsville - suburban, Essex - coastal/urban, Fairhill - rural, and Padonia - suburban) (Table S1) and the Chesapeake Bay (Cheng et al., 2017; Lamsal et al., 2014), and measured 245 NO$_2$ profiles in 14 flight days in July (Zhang et al., 2016). During the same period, the NASA UC-12 aircraft flew across the Baltimore-Washington region at an altitude about 8 km above sea level (ASL), using the Airborne Compact Atmospheric Mapper (ACAM) to map the distributions of NO$_2$ VCDs below the aircraft (Lamsal et al., 2017). Furthermore, ground-based instruments were deployed to measure NO$_2$ surface concentrations, NO$_2$ VCDs, and other physical properties of the atmosphere (Anderson et al., 2014; Reed et al., 2015; Sawamura et al., 2014). Satellite OMI and GOME-2A (Global Ozone Monitoring Experiment – 2A) instruments provided NO$_2$ TVCD measurements over the campaign region at 13:30 and 9:30 LT, respectively. These concurrent measurements of NO$_2$ VCDs, surface NO$_2$, and vertically resolved distributions of NO$_2$ during the DISCOVER-AQ 2011 campaign, therefore, provide
a comprehensive dataset to evaluate NO$_2$ diurnal and spatial variabilities and processes affecting NO$_2$
concentrations.

Section 2 describes the measurement datasets in detail. The Regional chEmistry and trAnsport Model (REAM),
also described in section 2, is applied to simulate the NO$_2$ observations during the DISCOVER-AQ campaign in July 2011. The evaluations of the simulated diurnal cycles of surface NO$_2$ concentrations, NO$_2$
vertical profiles, and NO$_2$ TVCDs are discussed in section 3 through comparisons with observations. In section 3,
we also investigate the differences between NO$_2$ diurnal cycles on weekdays and weekends and their implications
for NO$_x$ emission characteristics. To corroborate our evaluation of NO$_x$ emissions based on NO$_2$ diurnal cycles,
we further compare observed NO$_x$ (reactive nitrogen compounds) concentrations with REAM simulation results
in section 3. Moreover, we assess the resolution dependence of REAM simulation results in light of the
observations and discuss the potential distribution biases of NO$_x$ emissions by comparing the 36- and 4-km
REAM simulation results with OMI, GOME-2A, and high-resolution ACAM NO$_2$ VCDs. Finally, we summarize
the study in section 4.

2 Datasets and model description

2.1 REAM

REAM has been widely applied in many studies (Cheng et al., 2017; Choi et al., 2008; Li et al., 2019; Zhang
et al., 2018; Zhang et al., 2016; Zhao et al., 2009). The model has a horizontal resolution of 36 km and 30 vertical
layers in the troposphere. Meteorology fields are from a Weather Research and Forecasting (WRF, version 3.6)
model simulation with a horizontal resolution of 36 km. We summarize the physics parameterization schemes of
the WRF simulation in Table S2. The WRF simulation is initialized and constrained by the NCEP coupled
forecast system model version 2 (CFSv2) products (http://rda.ucar.edu/datasets/ds094.0/, last access: March 10,
The chemistry mechanism in REAM is based on GEOS-Chem v11.01 with updated aerosol uptake of isoprene nitrates (Fisher et al., 2016) and revised treatment of wet scavenging processes (Luo et al., 2019). A 2° × 2.5° GEOS-Chem simulation provides the chemical boundary and initial conditions.

Biogenic VOC emissions in REAM are from MEGAN v2.10 (Guenther et al., 2012). Anthropogenic emissions on weekdays are from the National Emission Inventory 2011 (NEI2011) (EPA, 2014) from the Pacific Northwest National Laboratory (PNNL), which has an initial resolution of 4 km and is re-gridded to REAM 36-km grid cells (Figure 2). Weekday emission diurnal profiles are from NEI2011. The weekday to weekend emission ratios and weekend emission diurnal profiles are based on previous studies (Beirle et al., 2003; Boersma et al., 2009; Choi et al., 2012; de Foy, 2018; DenBleyker et al., 2012; Herman et al., 2009; Judd et al., 2018; Kaynak et al., 2009; Kim et al., 2016). These studies suggested that weekend NoX emissions were 20% - 50% lower than weekday emissions, and the weekend NOX emission diurnal cycles were different from weekdays; therefore, we specify a weekend to weekday NOX emission ratio of 2/3 in this study. The resulting diurnal variations of weekday and weekend NOX emissions over the DISCOVER-AQ 2011 region are shown in Figure 3. The diurnal emission variation is lower on weekends than on weekdays.

To understand the effects of model resolutions on the temporospatial distributions of NO2, we also conduct a REAM simulation with a horizontal resolution of 4 km during the DISCOVER-AQ campaign. A 36-km REAM simulation (discussed in section 3.2) provides the chemical initial and hourly boundary conditions. Meteorology fields are from a nested WRF simulation (36 km, 12 km, 4 km) with cumulus parameterization turned off in the 4-km domain (Table S2). Figure 1 shows a comparison of the 4-km and 36-km REAM grid cells with DISCOVER-AQ observations, and Figure 2 shows a comparison of NOX emission distributions between the 4-km and 36-km REAM simulations. The comparison of NOX emission diurnal variations over the DISCOVER-AQ 2011 region between the 4-km and 36-km REAM is shown in Figure 3.
2.2 NO$_2$ TVCD measurements by OMI and GOME-2A

The OMI instrument onboard the sun-synchronous NASA EOS Aura satellite with an equator-crossing time of around 13:30 LT was developed by the Finnish Meteorological Institute and the Netherlands Agency for Aerospace Programs to measure solar backscattering radiation in the visible and ultraviolet bands (Levelt et al., 2006; Russell et al., 2012). The radiance measurements are used to derive trace gas concentrations in the atmosphere, such as O$_3$, NO$_2$, HCHO, and SO$_2$ (Levelt et al., 2006). OMI has a nadir resolution of 13 km × 24 km and provides daily global coverage (Levelt et al., 2006).

Two widely-used archives of OMI NO$_2$ VCD products are available, NASA OMNO2 (v4.0) (https://disc.gsfc.nasa.gov/datasets/OMNO2_003/summary, last access: September 26, 2020) and KNMI DOMINO (v2.0) (http://www.temis.nl/airpollution/no2.html, last access: January 14, 2015). Although both use Differential Optical Absorption Spectroscopy (DOAS) algorithms to derive NO$_2$ slant column densities, they have differences in spectral fitting, stratospheric and tropospheric NO$_2$ slant column density (SCD) separation, a priori NO$_2$ vertical profiles, and air mass factor (AMF) calculation, etc. (Boersma et al., 2011; Bucsela et al., 2013; Chance, 2002; Krotkov et al., 2017; Lamsal et al., 2021; Marchenko et al., 2015; Oetjen et al., 2013; van der A et al., 2010; Van Geffen et al., 2015). Both OMNO2 and DOMINO have been extensively evaluated with field measurements and models (Boersma et al., 2009; Boersma et al., 2011; Choi et al., 2020; Hains et al., 2010; Huijnen et al., 2010; Ionov et al., 2008; Irie et al., 2008; Lamsal et al., 2014; Lamsal et al., 2021; Oetjen et al., 2013). The estimated uncertainty of DOMINO TVCD product includes an absolute component of $1.0 \times 10^{15}$ molecules cm$^{-2}$ and a relative AMF component of 25% (Boersma et al., 2011), while the uncertainty of OMNO2 TVCD product ranges from ~30% under clear-sky conditions to ~60% under cloudy conditions (Lamsal et al., 2014; Oetjen et al., 2013; Tong et al., 2015). In order to reduce uncertainties in this study, we only use TVCD data with effective cloud fractions < 0.2, solar zenith angle (SZA) < 80°, and albedo ≤ 0.3. Both positive and
negative TVCDs are considered in the calculation. The data affected by row anomaly are excluded (Boersma et al., 2018; Zhang et al., 2018).

For AMF calculation, DOMINO used daily TM4 model results with a resolution of $3^\circ \times 2^\circ$ as a priori NO$_2$ vertical profiles (Boersma et al., 2007; Boersma et al., 2011), while OMNO2 v4.0 used monthly mean values from the Global Modeling Initiative (GMI) model with a resolution of $1^\circ \times 1.25^\circ$. The relatively coarse horizontal resolution of the a priori NO$_2$ profiles in the retrievals can introduce uncertainties in the spatial and temporal characteristics of NO$_2$ TVCDs at satellite pixel scales. For comparison purposes, we also use 36-km REAM simulation results as the a priori NO$_2$ profiles to compute the AMFs and NO$_2$ TVCDs with the DOMINO algorithm. The 36-km REAM NO$_2$ data are first regridded to OMI pixels to calculate the corresponding tropospheric AMFs, which are then applied to compute OMI NO$_2$ TVCDs by dividing the tropospheric SCDs from the DOMINO product by our updated AMFs.

The GOME-2 instrument onboard the polar-orbiting MetOp-A satellite (now referred to as GOME-2A) is an improved version of GOME-1 launched in 1995 and has an overpass time of 9:30 LT and a spatial resolution of $80 \times 40$ km$^2$ (Munro et al., 2006; Peters et al., 2012). GOME-2A measures backscattered solar radiation in the range from 240 nm to 790 nm, which is used for VCD retrievals of trace gases, such as O$_3$, NO$_2$, BrO, and SO$_2$ (Munro et al., 2006). We use the KNMI TM4NO2A v2.3 GOME-2A NO$_2$ VCD product archived on [http://www.temis.nl/airpollution/no2col/no2colgome2_v2.php](http://www.temis.nl/airpollution/no2col/no2colgome2_v2.php) (last access: January 22, 2015) (Boersma et al., 2007; Boersma et al., 2011). GOME-2A derived NO$_2$ VCDs have been validated with SCIAMACHY and MAX-DOAS measurements (Irie et al., 2012; Peters et al., 2012; Richter et al., 2011). As in the case of OMI, we use the same criteria to filter the NO$_2$ TVCD data and recalculate the tropospheric AMF values and GOME-2A TVCDs using the daily 36-km REAM NO$_2$ profiles (9:00 LT – 10:00 LT).
2.3 Pandora ground-based NO$_2$ VCD measurements

Pandora is a small direct sun spectrometer, which measures sun and sky radiance from 270 to 530 nm with a 0.5 nm resolution and a 1.6° field of view (FOV) for the retrieval of the total VCDs of NO$_2$ with a precision of about $5.4 \times 10^{14}$ molecules/cm$^2$ ($2.7 \times 10^{14}$ molecules/cm$^2$ for NO$_2$ SCD) and a nominal accuracy of $2.7 \times 10^{15}$ molecules cm$^{-2}$ under clear-sky conditions (Herman et al., 2009; Lamsal et al., 2014; Zhao et al., 2020). There were 12 Pandora sites operating in the DISCOVER-AQ campaign (Figure 1). Six of them are the same as the P-3B aircraft spiral locations (Aldino, Edgewood, Beltsville, Essex, Fairhill, and Padonia) (Table S1 and Figure 1). The other six sites are Naval Academy (Annapolis Maryland) (USNA – ocean), University of Maryland College Park (UMCP – urban), University of Maryland Baltimore County (UMBC – urban), Smithsonian Environmental Research Center (SERC – rural/coastal), Oldtown in Baltimore (Oldtown – urban), and Goddard Space Flight Center (GSFC – urban/suburban) (Table S1 and Figure 1). In this study, we exclude the USNA site as its measurements were conducted on a ship (“Pandora(w)” in Figure 1), and there were no other surface observations in the corresponding REAM grid cell. Including the data from the USNA site has a negligible effect on the comparisons of observed and simulated NO$_2$ TVCDs. In our analysis, we ignore Pandora measurements with SZA > 80° (Figure S1) and exclude the data when fewer than three valid measurements are available within an hour to reduce the uncertainties of the hourly averages due to the significant variations of Pandora observations (Figure S2).

Since Pandora measures total NO$_2$ VCDs, we need to subtract stratosphere NO$_2$ VCDs from the total VCDs to compute TVCDs. As shown in Figure S3, stratosphere NO$_2$ VCDs show a clear diurnal cycle with an increase during daytime due in part to the photolysis of reactive nitrogen reservoirs such as N$_2$O$_5$ and HNO$_3$ (Brohede et al., 2007; Dirksen et al., 2011; Peters et al., 2012; Sen et al., 1998; Spinei et al., 2014), which is consistent with the significant increase of stratospheric NO$_2$ VCDs from GOME-2A to OMI. In this study, we use the GMI model simulated stratospheric NO$_2$ VCDs in Figure S3 to calculate the Pandora NO$_2$ TVCDs. The small
discrepancies between the GMI stratospheric NO\textsubscript{2} VCDs and satellite products do not change the pattern of Pandora NO\textsubscript{2} TVCD diurnal variations or affect the conclusions in this study.

2.4 ACAM NO\textsubscript{2} VCD measurements

The ACAM instrument onboard the UC-12 aircraft consists of two thermally spectrometers in the ultraviolet/visible/near-infrared range. The spectrometer in the ultraviolet/visible band (304 nm – 520 nm) with a resolution of 0.8 nm and a sampling of 0.105 nm can be used to detect NO\textsubscript{2} in the atmosphere. The native ground resolution of UC-12 ACAM NO\textsubscript{2} measurements is 0.5 km × 0.75 km at a flight altitude of about 8 km ASL and a nominal ground speed of 100 m s\textsuperscript{-1} during the DISCOVER-AQ 2011 campaign (Lamsal et al., 2017), thus providing high-resolution NO\textsubscript{2} VCDs below the aircraft.

In this study, we mainly use the ACAM NO\textsubscript{2} VCD product described by Lamsal et al. (2017), which applied a pair-average co-adding scheme to produce NO\textsubscript{2} VCDs at a ground resolution of about 1.5 km (cross-track) × 1.1 km (along-track) to reduce noise impacts. In their retrieval of ACAM NO\textsubscript{2} VCDs, they first used the DOAS fitting method to generate differential NO\textsubscript{2} SCDs relative to the SCDs at an unpolluted reference location. Then they computed above/below-aircraft AMFs at both sampling and reference locations based on the vector linearized discrete ordinate radiative transfer code (VLIDORT) (Spurr, 2008). In the computation of AMFs, the a priori NO\textsubscript{2} vertical profiles were from a combination of a high-resolution (4-km) CMAQ (the Community Multiscale Air Quality Modeling System) model outputs in the boundary layer and a GMI simulation (2° × 2.5°) results elsewhere in the atmosphere. Finally, the below-aircraft NO\textsubscript{2} VCDs at the sampling locations were generated by dividing below-aircraft NO\textsubscript{2} SCDs at the sampling locations by the corresponding below-aircraft AMFs. The below-aircraft NO\textsubscript{2} SCDs were the differences between the total and above-aircraft NO\textsubscript{2} SCDs. The total NO\textsubscript{2} SCDs were the sum of DOAS fitting generated differential NO\textsubscript{2} SCDs and NO\textsubscript{2} SCDs at the reference location, and the above-aircraft NO\textsubscript{2} SCDs were derived based on above-aircraft AMFs, GMI NO\textsubscript{2} profiles, and
OMNO2 stratospheric NO\textsubscript{2} VCDs (Lamsal et al., 2017). The ACAM NO\textsubscript{2} VCD product had been evaluated via comparisons with other independent observations during the DISCOVER-AQ 2011 campaign, such as P-3B aircraft, Pandora, and OMNO2, and the uncertainty of individual below-aircraft NO\textsubscript{2} VCD is about 30% (Lamsal et al., 2017). To keep the consistency of ACAM NO\textsubscript{2} VCDs, we exclude NO\textsubscript{2} VCDs measured at altitudes < 8 km ASL, which accounts for about 6.8% of the total available ACAM NO\textsubscript{2} VCD data. We regrid the 1.5 km × 1.1 km ACAM NO\textsubscript{2} VCDs to the 4-km REAM grid cells (Figure 1), which are then used to evaluate the distribution of NO\textsubscript{2} VCDs in the 4-km REAM simulation. As a supplement in section 3.7, we also assess the 4-km REAM simulation by using the UC-12 ACAM NO\textsubscript{2} VCDs produced by the Smithsonian Astrophysical Observatory (SAO) algorithms, archived on https://www-air.larc.nasa.gov/cgi-bin/ArcView/discover-aq.dc-2011?UC12=1#LIU.XIONG/ (last access: December 31, 2019) (Liu et al., 2015a; Liu et al., 2015b). This product is an early version of the SAO algorithm used to produce the Geostationary Trace gas and Aerosol Sensor Optimization (GeoTASO) and the GEOstationary Coastal and Air Pollution Events (GEO-CAPE) Airborne Simulator (GCAS) airborne observations in later airborne campaigns (Nowlan et al., 2016; Nowlan et al., 2018).

2.5 Surface NO\textsubscript{2} and O\textsubscript{3} measurements

The measurement of NO\textsubscript{x} is based on the chemiluminescence of electronically excited NO\textsubscript{2}\textsuperscript{\,*}, produced from the reaction of NO with O\textsubscript{3}, and the strength of the chemiluminescence from the decay of NO\textsubscript{2}\textsuperscript{\,*} to NO\textsubscript{2} is proportional to the number of NO molecules present (Reed et al., 2016). NO\textsubscript{2} concentrations can be measured with this method by converting NO\textsubscript{2} to NO first through catalytic reactions (typically on the surface of heated molybdenum oxide (MoO\textsubscript{x}) substrate) or photolytic processes (Lamsal et al., 2015; Reed et al., 2016). However, for the catalytic method, reactive nitrogen compounds other than NO\textsubscript{x} (NO\textsubscript{z}), such as HNO\textsubscript{3}, peroxyacetyl nitrate (PAN), and other organic nitrates, can also be reduced to NO on the heated surface, thus causing an overestimation of NO\textsubscript{2}. The magnitude of the overestimation depends on the concentrations and the reduction
efficiencies of interference species, both of which are uncertain. The photolytic approach, which employs broadband photolysis of ambient NO$_2$, offers more accurate NO$_2$ measurements (Lamsal et al., 2015).

There were 11 NO$_x$ monitoring sites operating in the DISCOVER-AQ region during the campaign (Figure 1), including those from the EPA Air Quality System (AQS) monitoring network and those deployed for the DISCOVER-AQ campaign. Nine of them measured NO$_2$ concentrations by a catalytic converter. The other two sites (Edgewood and Padonia) had NO$_2$ measurements from both catalytic and photolytic methods. Different stationary catalytic instruments were used during the campaign: Thermo Electron 42C-Y NO$_y$ analyzer, Thermo Model 42C NO$_x$ analyzer, Thermo Model 42I-Y NO$_y$ analyzer, and Ecotech Model 9843/9841 T-NO$_y$ analyzers. In addition, a mobile platform — NATIVE (Nittany Atmospheric Trailer and Integrated Validation Experiment) with a Thermo Electron 42C-Y NO$_y$ analyzer installed, was also deployed in the Edgewood site. The photolytic measurements of NO$_2$ in Edgewood and Padonia were from Teledyne API model 200eup photolytic NO$_x$ analyzers. We scale catalytic NO$_2$ measurements using the diurnal ratios of NO$_2$ photolytic measurements to NO$_2$ from the corresponding catalytic analyzers (Figure 4). Figure 4 shows the lowest photolytic/catalytic ratios in the afternoon, which reflects the production of nitrates and other reactive nitrogen compounds from NO$_x$ in the daytime. When photolytic measurements are available, we only use the photolytic observations in this study; otherwise, we use the scaled catalytic measurements.

Nineteen surface O$_3$ monitoring sites were operating in the DISCOVER-AQ region during the campaign (Figure 1). They measured O$_3$ concentrations by using a Federal Equivalent Method (FEM) based on the UV absorption of O$_3$ (https://www.arb.ca.gov/aaqm/qa/qa-manual/vol4/chapter603.pdf, last access: April 6, 2019) with an uncertainty of 5 ppb.
2.6 Aircraft measurements of NO\textsubscript{2} vertical profiles

In this study, we mainly use the NO\textsubscript{2} concentrations measured by the National Center for Atmospheric Research (NCAR) 4-channel chemiluminescence instrument (P-CL) onboard the P-3B aircraft for the evaluation of REAM simulated NO\textsubscript{2} vertical profiles. The instrument has a NO\textsubscript{2} measurement uncertainty of 10% – 15% and a 1-second, 1-sigma detection limit of 30 pptv.

NO\textsubscript{2} measurements from aircraft spirals provide us with NO\textsubscript{2} vertical profiles. Figure 1 shows the locations of the aircraft spirals during the DISCOVER-AQ campaign, except for the Chesapeake Bay spirals over the ocean. There were only six spirals available over the Chesapeake Bay, which have ignorable impacts on the following analyses. Therefore, we do not use them in this study. The rest 239 spirals in the daytime for July 2011 are used to compute the average profiles of NO\textsubscript{2} for the six inland sites (Figure 1).

The aircraft measurements were generally sampled from about a height of 300 m AGL in the boundary layer to 3.63 km AGL in the free troposphere. We bin these measurements to REAM vertical levels. In order to make up the missing observations between the surface and 300 m, we apply quadratic polynomial regressions by using aircraft data below 1 km and coincident NO\textsubscript{2} surface measurements.

In addition to using NO\textsubscript{2} concentrations from the NCAR 4-channel instrument to evaluate REAM simulated NO\textsubscript{2} vertical profiles, we also use P-3B NO, NO\textsubscript{2}, and NO\textsubscript{y} concentrations measured by the NCAR 4-channel instrument and NO\textsubscript{2}, total peroxyacyl nitrates (∑PNs), total alkyl nitrates (∑ANs) (include alkyl nitrates and hydroxyalkyl nitrates), and HNO\textsubscript{3} concentrations measured by the thermal dissociation-laser induced fluorescence (TD-LIF) technique (Day et al., 2002; Thornton et al., 2000; Wooldridge et al., 2010) to evaluate the concentrations of NO\textsubscript{y} from REAM (Table 1). All these P-3B measurements are vertically binned to REAM grid cells for comparisons with REAM results. In addition, below the P-3B spirals, four NO\textsubscript{y} observation sites at
Padonia, Edgewood, Beltsville, and Aldino were operating to provide continuous hourly NO\textsubscript{y} surface concentrations during the campaign, which we also use to evaluate REAM simulated NO\textsubscript{y} surface concentrations in this study. We summarize the information of available observations at the 11 inland Pandora sites in Table S1.

3 Results and discussion

3.1 Evaluation of WRF simulated meteorological fields

We evaluate the performances of the 36-km and nested 4-km WRF simulations using temperature, potential temperature, relative humidity (RH), and wind measurements from the P-3B spirals (Figure 1) and precipitation data from the NCEP (National Centers for Environmental Prediction) Stage IV precipitation dataset. Generally, P-3B spirals range from ~300 m to ~3.63 km in height above the ground level (AGL). As shown in Figure S4, both the 36-km and nested 4-km WRF simulations simulate temperature well with R\textsuperscript{2} = 0.98. Both WRF simulations show good agreement with P-3B measurements in U-wind (36-km: R\textsuperscript{2} = 0.77; 4-km: R\textsuperscript{2} = 0.76), V-wind (36-km: R\textsuperscript{2} = 0.79; 4-km: R\textsuperscript{2} = 0.78), wind speed (36-km: R\textsuperscript{2} = 0.67; 4-km: R\textsuperscript{2} = 0.67), and wind direction (Figures S4 and S5). We further compare the temporal evolutions of vertical profiles for temperature, potential temperature, RH, U-wind, and V-wind below 3 km from the P-3B observations with those from the 36-km and nested 4-km WRF simulations in Figure S6. Both WRF simulations well capture the temporospatial variations of P-3B observed vertical profiles except that RH below 1.5 km is significantly underestimated during 9:00 – 17:00 LT in both WRF simulations. The evaluations above suggest that WRF simulated wind fields are good and comparable at 4-km and 36-km resolutions, but potential dry biases exist in both WRF simulations.

The NCEP Stage IV precipitation dataset provides hourly precipitation across the contiguous United States (CONUS) with a resolution of ~4 km based on the merging of rain gauge data and radar observations (Lin and Mitchell, 2005; Nelson et al., 2016). The Stage IV dataset is useful for evaluating model simulations, satellite
precipitation estimates, and radar precipitation estimates (Davis et al., 2006; Gourley et al., 2011; Kalinga and Gan, 2010; Lopez, 2011; Yuan et al., 2008). We obtain the Stage IV precipitation data for July 2011 from the NCAR/UCAR Research Data Archive (https://rda.ucar.edu/datasets/ds507.5/, last access: December 28, 2019).

As shown in Figures S7 and S8, generally, both the 36-km and nested 4-km WRF simulations generally predict much less precipitation (in precipitation amount and duration) compared to the Stage-IV data in July 2011 around the DISCOVER-AQ campaign region, especially for the nested 4-km WRF simulation, consistent with the aforementioned underestimated RH and dry bias in WRF simulations. The precipitation biases in the WRF model will affect REAM simulations of trace gases, leading to high biases of soluble species due to underestimated wet scavenging. Clouds interfere with satellite observations. Therefore, the precipitation bias does not affect model evaluations with satellite measurements of NO₂. Aircraft measurements were also taken in non-precipitating days.

3.2 Effect of boundary layer vertical mixing on the diurnal variations of surface NO₂ concentrations

3.2.1 36-km model simulation in comparison to the surface observations

Figures 5a and 5b show the observed and 36-km REAM simulated diurnal cycles of surface NO₂ and O₃ concentrations on weekdays in July 2011 in the DISCOVER-AQ region. REAM with WRF-YSU simulated vertical diffusion coefficient ($k_{zz}$) values significantly overestimates NO₂ concentrations and underestimates O₃ concentrations at night, although it captures the patterns of the diurnal cycles of surface NO₂ and O₃: an O₃ peak and a NO₂ minimum around noontime. Here, YSU denotes the Yonsei University planetary boundary layer (PBL) scheme (Shin and Hong, 2011) used by our WRF simulations (Table S2). At night, the reaction of O₃ + NO → O₂ + NO₂ produces NO₂ but removes O₃. Since most NOₓ emissions are in the form of NO, the model biases of low O₃ and high NO₂ occur at the same time. Since there are no significant chemical sources of O₃ at night, mixing of O₃ rich air above the surface is the main source of O₃ supply near the surface. Therefore, the nighttime model
biases with WRF-YSU simulated $k_{zz}$ data in Figure 5 indicate that vertical mixing may be underestimated at night.

During the DISCOVER-AQ campaign, WRF simulated vertical wind velocities are very low at night and have little impact on vertical mixing (Figure S9a). The nighttime vertical mixing is mainly attributed to turbulent mixing. However, Hu et al. (2012) found that the YSU scheme underestimated nighttime PBL vertical turbulent mixing in WRF, which is consistent with Figure 6 showing that WRF-YSU $k_{zz}$-determined mixed-layer heights (MLHs) are significantly lower than lidar observations in the late afternoon and at night at the UMBC site during the DISCOVER-AQ campaign (Knepp et al., 2017). Here, the $k_{zz}$-determined MLH refers to the mixing height derived by comparing $k_{zz}$ to its background values (Hong et al., 2006) but not the PBLH outputs from WRF.

UMBC is an urban site (Table S1), surrounded by a mixture of constructed materials and vegetation. The UMBC lidar MLH data were derived from the Elastic Lidar Facility (ELF) attenuated backscatter signals by using the covariance wavelet transform (CWT) method and had been validated against radiosonde measurements (N (Number of data points) = 24; $R^2 = 0.89$; bias (ELF – radiosonde) = 0.03 ± 0.23 km), Radar wind profiler observations (N = 659; $R^2 = 0.78$; bias = -0.21 ± 0.36 km), and Sigma Space mini-micropulse lidar data (N = 8122; $R^2 = 0.85$; bias = 0.02 ± 0.22 km) from the Howard University Beltsville Research Campus (HUBRC) in Beltsville, Maryland (38.058° N, 76.888° W) in the daytime during the DISCOVER-AQ campaign (Compton et al., 2013). It is noteworthy that although CWT is not designed to detect the nocturnal boundary layer (NBL), it does consider the residue layer (RL) and distinguish it from MLH in the early morning after sunrise, which is similar to nighttime conditions. Therefore, CWT can detect nighttime MLHs, although with large uncertainties due to the hard-coded assumption of RL = 1 km in the algorithm and insufficient vertical resolution of the technique. In addition, the sunrise and sunset time in July 2011 is about 5:00 LT and 19:30 LT (https://gml.noaa.gov/grad/solcalc/sunrise.html, last access: May 27, 2021), respectively. Figure 6 shows that WRF-YSU $k_{zz}$-determined MLHs are significantly lower than ELF observations after sunrise at 5:00 – 8:00 LT.
and before sunset at 18:00 – 20:00 LT. Even if we do not consider MLHs at night (19:30 – 5:00 LT), we can still conclude that WRF-YSU underestimates vertical mixing in the early morning after sunrise and the late afternoon before sunset, enabling a reasonable assumption that WRF-YSU also underestimates nighttime vertical mixing. Moreover, the nighttime MLHs in Figure 6 are comparable to those measured by the Vaisala CL51 ceilometer at the Chemistry And Physics of the Atmospheric Boundary Layer Experiment (CAPABLE) site in Hampton, Virginia (Knepp et al., 2017). Finally, we want to emphasize that different definitions of NBL can result in significantly different NBL heights (Breuer et al., 2014). In this study, we follow Knepp et al. (2017) to use MLHs derived from aerosol backscatter signals as the measure of vertical pollutant mixing within the boundary layer, which is simulated by $k_{zz}$ in REAM.

To improve nighttime PBL vertical turbulent mixing in REAM, we increase $k_{zz}$ below 500 m during 18:00 – 5:00 LT to 5 m s$^{-2}$ if the WRF-YSU computed $k_{zz} < 5$ m s$^{-2}$, which significantly increases the $k_{zz}$-determined MLHs at night (Figure 6), leading to the decreases of simulated surface NO$_2$ and the increases of surface O$_3$ concentrations at night (Figure 5). The assigned value of 5 m s$^{-2}$ is arbitrary. Changing this value to 2 or 10 m s$^{-2}$ can also alleviate the biases of model simulated nighttime surface NO$_2$ and O$_3$ concentrations (Figure S10). Considering the potential uncertainties of nighttime NO$_x$ emissions, an alternative solution to correct the model nighttime simulation biases is to reduce NO$_x$ emissions, which can decrease the consumption of O$_3$ through the process of NO$_x$ titration mentioned above ($O_3 + NO \rightarrow O_2 + NO_2$). Our sensitivity tests (not shown) indicate that it is necessary to reduce NO$_x$ emissions by 50-67% to eliminate the model nighttime simulation biases, but we cannot find good reasons to justify this level of NO$_x$ emission reduction only at night.

The updated REAM simulation of surface NO$_2$ diurnal pattern in Figure 5a is in good agreement with previous studies (Anderson et al., 2014; David and Nair, 2011; Gaur et al., 2014; Reddy et al., 2012; Zhao et al., 2019). Daytime surface NO$_2$ concentrations are much lower compared to nighttime, and NO$_2$ concentrations
reach a minimum around noontime. As shown in Figure S11, under the influence of vertical turbulent mixing, the surface-layer NO\textsubscript{x} emission diurnal pattern is similar to the surface NO\textsubscript{2} diurnal cycle in Figure 5a, emphasizing the importance of turbulent mixing on modulating surface NO\textsubscript{2} diurnal variations. The highest boundary layer (Figure 6) due to solar radiation leads to the lowest surface-layer NO\textsubscript{x} emissions (Figure S11) and, therefore, the smallest surface NO\textsubscript{2} concentrations occur around noontime (Figure 5a). Transport, which is mainly attributed to advection and turbulent mixing, is another critical factor affecting surface NO\textsubscript{2} diurnal variations (Figure S11).

The magnitudes of transport fluxes (Figure S11) are proportional to horizontal and vertical gradients of NO\textsubscript{x} concentrations and are therefore generally positively correlated to surface NO\textsubscript{2} concentrations. However, some exceptions exist, reflecting different strengths of advection (U, V, and W) and turbulent mixing (k\textsubscript{zz}) at different times. For example, in the early morning, NO\textsubscript{2} surface concentrations peak at 5:00 – 6:00 LT (Figure 5a), while transport fluxes peak at 7:00 – 8:00 LT (Figure S11). The delay of the peak is mainly due to lower turbulent mixing at 5:00 – 6:00 LT than other daytime hours in the model (Figure 6). Chemistry also contributes to surface NO\textsubscript{2} diurnal variations mainly through photochemical sinks in the daytime and N\textsubscript{2}O\textsubscript{5} hydrolysis at nighttime.

Chemistry fluxes in Figure S11 are not only correlated to the strength of photochemical reactions and N\textsubscript{2}O\textsubscript{5} hydrolysis (chemistry fluxes per unit NO\textsubscript{x}) but are also proportional to NO\textsubscript{x} surface concentrations. Therefore, chemistry fluxes in Figure S11 cannot directly reflect the impact of solar radiation on photochemical reactions. It can, however, still be identified by comparing afternoon chemistry contributions: from 13:00 to 15:00 LT, surface-layer NO\textsubscript{x} emissions and NO\textsubscript{2} concentrations are increasing (Figures S11 and 5a); however, chemistry losses are decreasing as a result of the reduction of photochemical sinks with weakening solar radiation. The contributions of vertical mixing and photochemical sinks to NO\textsubscript{2} concentrations can be further corroborated by daytime variations of NO\textsubscript{2} vertical profiles and TVCDs discussed in sections 3.3 and 3.4.

Figure 5c shows the diurnal variation on weekends is also simulated well in the improved 36-km model. The diurnal variation of surface NO\textsubscript{2} concentrations (REAM: 1.5 – 10.2 ppb; observations: 2.1 – 9.8 ppb) is lower
than on weekdays (REAM: 2.4 – 12.2 ppb; observations: 3.3 – 14.5 ppb), reflecting lower magnitude and variation of NO\textsubscript{x} emissions on weekends (Figure 3). Figure 5d also shows an improved simulation of surface O\textsubscript{3} concentrations at nighttime due to the improved MLH simulation (Figure 6).

3.2.2 4-km model simulation in comparison to the surface observations

The results of 4-km REAM simulations with original WRF-YSU \( k_{zz} \) (not shown) are very similar to Figure 5 since WRF simulated nocturnal vertical mixing is insensitive to the model horizontal resolution. Applying the modified nocturnal mixing in the previous section also greatly reduced the nighttime NO\textsubscript{2} overestimate and O\textsubscript{3} underestimate in the 4-km REAM simulations. All the following analyses are based on REAM simulations with improved nocturnal mixing. Figure 7 shows that mean surface NO\textsubscript{2} concentrations simulated in the 4-km model are higher than the 36-km results over Padonia, Oldtown, Essex, Edgewood, Beltsville, and Aldino (Table S1), leading to generally higher biases compared to the observations in the daytime. A major cause is that the observation sites are located in regions of high NO\textsubscript{x} emissions (Figure 2). At a higher resolution of 4 km, the high emissions around the surface sites are apparent compared to rural regions. At the coarser 36-km resolution, spatial averaging greatly reduces the emissions around the surface sites. On average, NO\textsubscript{x} emissions (molecules km\textsuperscript{-2} s\textsuperscript{-1}) around the six surface NO\textsubscript{2} observations sites are 67\% higher in the 4-km than the 36-km REAM simulations (Table S1). The resolution dependence of model results will be further discussed in the model evaluations using the other in situ and remote sensing measurements.

3.3 Diurnal variations of NO\textsubscript{2} vertical profiles

Figures 8a and 8c show the temporal variations of P-3B observed and 36-km REAM simulated NO\textsubscript{2} vertical profiles in the daytime on weekdays during the DISCOVER-AQ campaign. 36-km REAM reproduces well the observed characteristics of NO\textsubscript{2} vertical profiles in the daytime \((R^2 = 0.89)\), which are strongly affected by
vertical mixing and photochemistry (Zhang et al., 2016). When vertical mixing is weak in the early morning (6:00 – 8:00 LT), NO$_2$, released mainly from surface NO$_x$ sources, is concentrated in the surface layer, and the vertical gradient is large. As vertical mixing becomes stronger after 8:00 LT, NO$_2$ concentrations below 500 m decrease significantly, while those over 500 m increase from 6:00 – 8:00 LT to 12:00 – 14:00 LT. It is noteworthy that MLHs and NO$_x$ emissions are comparable between 12:00 – 14:00 LT and 15:00 – 17:00 LT (Figures 3 and 6); however, NO$_2$ concentrations at 15:00 – 17:00 LT are significantly higher than at 12:00 – 14:00 LT in the whole boundary layer, reflecting the impact of the decreased photochemical loss of NO$_x$ in the late afternoon. In fact, photochemical losses affect all the daytime NO$_2$ vertical profiles, which can be easily identified by NO$_2$ TVCD process diagnostics discussed in section 3.4 (Figure 9).

Figures 8b and 8d also show the observed and 36-km REAM simulated vertical profiles on weekends. Similar to Figures 5 and 7, observed and simulated concentrations of NO$_2$ are lower on weekends than on weekdays. Some of the variations from weekend profiles are due to a lower number of observations (47 spirals) on weekends. The overall agreement between the observed vertical profiles and 36-km model results is good on weekends ($R^2 = 0.87$). At 15:00 – 17:00 LT, the model simulates a larger gradient than what the combination of aircraft and surface measurements indicates. It may be related to the somewhat underestimated MLHs in the late afternoon in the model (Figure 6).

On weekdays, most simulated vertical profiles at the 4-km resolution (Figure 8e) are similar to 36-km results in part because the average NO$_x$ emissions over the six P-3B spiral sites are about the same, 4% lower in the 4-km than the 36-km REAM simulations (Table S1). A clear exception is the 4-km REAM simulated vertical profile at 15:00 – 17:00 LT when the model greatly overestimates boundary layer NO$_x$ mixing and concentrations. The main reason is that WRF simulated vertical velocities ($w$) in the late afternoon are much larger in the 4-km simulation than the 36-km simulation (Figure S9), which can explain the simulated fully mixed
boundary layer at 15:00 – 17:00 LT. Since it is not designed to run at the 4-km resolution and it is commonly
assumed that convection can be resolved explicitly at high resolutions, the Kain-Fritsch (new Eta) convection
scheme is not used in the nested 4-km WRF simulation (Table S2); it may be related to the large vertical
velocities in the late afternoon when thermal instability is the strongest. Appropriate convection parameterization
is likely still necessary for 4-km simulations (Zheng et al., 2016), which may also help alleviate the
underestimation of precipitation in the nested 4-km WRF simulation as discussed in section 3.1.

The same rapid boundary-layer mixing due to vertical transport is present in the 4-km REAM simulated
weekend vertical profile (Figure 8f), although the mixing height is lower. Fewer spirals (47) and distinct transport
effect due to different NO₂ horizontal gradients between the 4-km and 36-km REAM simulations (discussed in
detail in Section 3.6) may cause the overestimation of weekend profiles in the 4-km REAM simulation.

3.4 Daytime variation of NO₂ TVCDs

We compare satellite, P-3B aircraft, and model-simulated TVCDs with Pandora measurements, which
provide continuous daytime observations. The locations of Pandora sites are shown in Table S1 and Figure 1.
Among the Pandora sites, four sites are located significantly above the ground level: UMCP (~20 m), UMBC
(~30 m), SERC (~40 m), and GSFC (~30 m). The other sites are 1.5 m AGL. To properly compare Pandora to
other measurements and model simulations, we calculate the missing TVCDs between the Pandora site heights
and ground surface by multiplying the Pandora TVCDs with model-simulated TVCD fractions of the
corresponding columns. The resulting correction is 2-21% \( \left( \frac{1}{1 - \text{missing TVCD percentage}} \right) \) for the four sites
significantly above the ground surface, but the effect on the averaged daytime TVCD variation of all Pandora
sites is small (Figure S12). In the following analysis, we use the updated Pandora TVCD data.
The weekday diurnal variations of NO\textsubscript{2} TVCDs from satellites, Pandora, 4- and 36-km REAM, and the P-3B aircraft are shown in Figure 10a. We calculate aircraft derived TVCDs by using equation (1):

\[
TVCD_{\text{aircraft}}(t) = \frac{\sum c_{\text{aircraft}}(t) \times \rho_{\text{REAM}}(t) \times V_{\text{REAM}}(t)}{A_{\text{REAM}}}
\]  \hspace{1cm} (1),

where \( t \) is time; \( c_{\text{aircraft}} \text{ (v/v)} \) denotes aircraft NO\textsubscript{2} concentrations (mixing ratios) at each level at time \( t \); \( \rho_{\text{REAM}} \text{ (molecules / cm}^3\text{)} \) is the density of air from 36-km REAM at the corresponding level; \( V_{\text{REAM}} \text{ (cm}^3\text{)} \) is the volume of the corresponding 36-km REAM grid cell; \( A_{\text{REAM}} \text{ (cm}^2\text{)} \) is the surface area (36 × 36 km\textsuperscript{2}). In the calculation, we only use NO\textsubscript{2} concentrations below 3.63 km AGL because few aircraft measurements were available above this height in the campaign. Missing tropospheric NO\textsubscript{2} above 3.63 km AGL in the aircraft TVCD calculation has little impact on our analyses, as 36-km REAM model simulation shows that 85\% \pm 7\% of tropospheric NO\textsubscript{2} are located below 3.63 km AGL during 6:00 – 17:00 LT in the DISCOVER-AQ region, which is roughly consistent with the GMI model results with 85\% - 90\% tropospheric NO\textsubscript{2} concentrated below 5 km (Lamsal et al., 2014). It should be noted that only six P-3B spirals are available during the campaign, less than the samplings of 11 inland Pandora sites.

The 4-km REAM simulated NO\textsubscript{2} TVCDs are mostly higher than the 36-km results and the observations in daytime on weekdays (Figure 10a). However, since the standard deviations of the data are much larger than the model difference, the 4- and 36-km model results generally show similar characteristics relative to the observations. REAM simulation results are in reasonable agreement with Pandora, P-3B aircraft, and satellite daytime NO\textsubscript{2} TVCDs, except that NASA-derived OMI (OMNO2) TVCDs are somewhat lower than other datasets, which may be partly due to biased a priori vertical profiles from the GMI model in the NASA retrieval in the campaign (Lamsal et al., 2014; Lamsal et al., 2021). TVCDs derived by using the DOMINO algorithm and 36-km REAM NO\textsubscript{2} vertical profiles are in agreement with those from KNMI, which indicates that the TM4
model from KNMI provides reasonable estimates of a priori NO$_2$ vertical profiles on weekdays in the DISCOVER-AQ region in summer.

We find evident decreases of NO$_2$ TVCDs from GOME-2A to OMI in Figure 10a, which is consistent with Pandora, REAM results, and previous studies that showed decreasing NO$_2$ TVCDs from SCIAMACHY to OMI due to photochemical losses in summer (Boersma et al., 2008; Boersma et al., 2009). P-3B aircraft TVCDs also show this decrease feature but have large variations due in part to the limited aircraft sampling data.

Pandora NO$_2$ TVCD data have different characteristics from REAM simulated and P-3B aircraft measured TVCDs at 5:00 – 7:00 LT and 14:00 – 18:00 LT (Figure 10a). At 5:00 – 7:00 LT, Pandora data show a significant increase of NO$_2$ TVCDs, but REAM and aircraft TVCDs generally decrease except for 4-km REAM TVCDs with a slight increase from 6:00 – 7:00 LT on weekdays. At 14:00 LT – 18:00 LT, Pandora TVCDs have little variations, but REAM and aircraft TVCDs increase significantly. The relatively flat Pandora TVCDs in the late afternoon compared to REAM and P-3B aircraft measurements are consistent with Lamsal et al. (2017), which found that Pandora VCDs were 26% - 30% lower than UC-12 ACAM measurements from 16:00 LT to 18:00 LT during the DISCOVER-AQ campaign. We show the simulated effects of emission, chemistry, transport, and dry deposition on NO$_x$ TVCDs in Figure 9. The simulated early morning slight decrease of NO$_2$ TVCDs is mainly due to the chemical transformation between NO$_2$ and NO favoring the accumulation of NO under low-O$_3$ and low-HO$_2$/RO$_2$ conditions, thus NO TVCDs increase significantly, but NO$_2$ TVCDs continue decreasing slowly during the period. The increase in the late afternoon is primarily due to the decrease of photochemistry-related sinks. The reasons for the discrepancies of NO$_2$ TVCDs between Pandora and REAM results during the above two periods are unclear. Large SZAs in the early morning and the late afternoon (Figure S1) lead to the higher uncertainties of Pandora measurements (Herman et al., 2009), although we have excluded Pandora measurements with SZA > 80°. In addition, Pandora is a sun-tracking instrument with a small effective FOV and is sensitive to
local conditions within a narrow spatial range which may differ significantly from the average properties of 36- and 4-km grid cells depending upon the time of the day (Figure S13) (Herman et al., 2009; Herman et al., 2018; Herman et al., 2019; Judd et al., 2018; Judd et al., 2019; Judd et al., 2020; Lamsal et al., 2017; Reed et al., 2015).

As we mentioned above, ~85% tropospheric NO$_2$ are located below 3.63 km in the DISCOVER-AQ 2011 region based on the 36-km REAM simulation results. The Pandora FOV of 1.6° is approximately equivalent to a nadir horizontal extension of only 0.1 km ($2 \times 3.63 \text{ km} \times \tan \frac{1.6}{2} = 0.1 \text{ km}$) at 3.63 km AGL and 30 m at 1.0 km AGL. Therefore, Pandora measures different air columns of NO$_2$ at different times of the day, especially in the morning and afternoon when SZA is large, as shown in Figure S13. Considering the potential spatial heterogeneity of boundary-layer NO$_2$, it is possible that the morning (east), noontime (nadir), afternoon (west) NO$_2$ VCDs are significantly different from each other. Unlike Pandora, satellites and aircraft are far from the ground surface and cover large areas; therefore, the impact of SZA on their NO$_2$ VCD measurements is insignificant compared to Pandora measurements. Another possible reason is that Pandora instruments had few observations in the early morning, and the resulting average may not be representative (Figure S2).

To further understand the daytime variation of NO$_2$ TVCDs, we examine P-3B aircraft data derived and REAM simulated NO$_2$ VCD variations for different height bins (Figure 11). NO$_2$ VCDs below 3.63 km AGL display a “U”-shaped pattern from 5:00 LT to 17:00 LT. In the morning, as vertical mixing becomes stronger after sunrise, high-NO$_x$ air in the lower layer is mixed with low-NO$_x$ air in the upper layer. The increase of NO$_x$ vertical mixing above 300 m is sufficient to counter the increase of photochemical loss in the morning. Conversely, the NO$_2$ VCDs below 300 m decrease remarkably from sunrise (about 6:00 LT) to around noontime due to both vertical mixing and the increase of photochemical strength. From 13:00 LT to 16:00 LT, NO$_2$ VCDs increase slowly, reflecting a relative balance among emissions, transport, chemistry, and dry depositions. The sharp jump of the VCDs from 16:00 LT to 17:00 LT is mainly due to dramatically reduced chemical loss. And 4-
km REAM simulated NO₂ VCDs at 0.30-3.63 km at 16:00-17:00 LT are much higher than 36-km results partly because of the rapid vertical mixing in the 4-km REAM simulation (Figures 8 and S9).

Similar to NO₂ surface concentrations and vertical profiles in Figures 7 and 8, the NO₂ TVCD variation is also smaller on weekends than on weekdays, but the day-night pattern is similar (Figure 10). Although the 4-km REAM NO₂ TVCDs are generally higher than the 36-km results and observations in the daytime, considering their large standard deviations, NO₂ TVCDs from both simulations are comparable to satellite products, Pandora, and P-3B aircraft observations most of the time on weekends. The exception is that Pandora TVCDs have different variation patterns in the early morning and late afternoon from REAM simulations, similar to those found on weekdays.

3.5 Model comparisons with NOₓ measurements

NOₓ is longer-lived than NOₓ, and NOₓ concentrations are not affected by chemistry as much as NOₓ. We obtain two types of NOₓ concentrations from the P-3B aircraft in the DISCOVER-AQ campaign: one is NOₓ concentrations directly measured by the NCAR 4-channel instrument, corresponding to the sum of NO, NO₂, ∑PNs, ∑ANs, HNO₃, N₂O₅, HNO₄, HONO, and the other reactive nitrogenic species in REAM (all the other species are described in Table 1); the other one, which we name as “derived-NOₓ”, is the sum of NO from the NCAR 4-channel instrument and NO₂ (NO₂-LIF), ∑PNs, ∑ANs, and HNO₃ measured by the TD-LIF technique, corresponding to NO, NO₂, ∑PNs, ∑ANs, and HNO₃ in REAM (Table 1). On average, P-3B derived-NOₓ concentrations (2.88 ± 2.24 ppb) are 17% higher than coincident P-3B NOₓ concentrations (2.46 ± 2.06 ppb) with R² = 0.75, generally reflecting consistency between these two types of measurements. As shown in Table 1, on weekdays, the 36-km REAM NOₓ concentrations are 45% larger than P-3B with R² = 0.33, and the 36-km REAM derived-NOₓ concentrations are 8% larger than P-3B with R² = 0.41. 4-km REAM show similar results, suggesting that REAM simulations generally reproduce the observed NOₓ and derived-NOₓ concentrations within
the uncertainties, although the average values from REAM are somewhat larger than the observations due in part to the underestimate of precipitation in the WRF model simulations resulting in underestimated wet scavenging of HNO$_3$ in REAM. The concentrations of weekday NO, NO$_2$, and $\sum$PNs from REAM simulations are also comparable to the observations. However, weekday $\sum$ANs concentrations are 68% lower in the 36-km REAM than observations, suggesting that the chemistry mechanism in REAM may need further improvement to better represent isoprene nitrates. It is noteworthy that, since $\sum$ANs only account for a small fraction (~11%) in observed derived-NO$_y$, the absolute difference between REAM simulated and P-3B observed $\sum$ANs concentrations is still small compared to HNO$_3$. Weekday HNO$_3$ concentrations are significantly higher in REAM simulations (36-km: 57%, 0.65 ppb; 4-km: 74%, 0.86 ppb) than P-3B observations, which is the main reason for the somewhat larger NO$_y$ and derived-NO$_y$ concentrations in REAM compared to P-3B observations. The higher HNO$_3$ concentrations in REAM may be related to the underestimation of precipitation in the corresponding WRF simulations, as discussed in section 3.1 (Figures S7 and S8), leading to the underestimated wet scavenging of HNO$_3$, especially for the 4-km REAM simulation.

We also examine the weekday diurnal variations of derived-NO$_y$ vertical profiles from P-3B and REAM simulations in Figure S14. Generally, both 36- and 4-km REAM simulations capture the variation characteristics of observed vertical profiles, which are similar to those for NO$_2$ in Figure 8. REAM derived-NO$_y$ concentrations are comparable to P-3B observations at most vertical levels on weekdays. Some larger derived-NO$_y$ concentrations in the model results can be partially explained by larger HNO$_3$ concentrations in REAM, such as those below 1 km at 9:00 – 11:00 LT for the 36-km REAM and those below 2.0 km at 12:00 – 17:00 LT for the 4-km REAM (Figure S15).

Figure 12 shows the comparison of the diurnal cycles of surface NO$_y$ concentrations observed at Padonia, Edgewood, Beltsville, and Aldino during the DISCOVER-AQ campaign with those from the REAM simulations.
Generally, the REAM simulations reproduce the observed surface NO\textsubscript{y} diurnal cycles except for the spikes around 17:00 – 20:00 LT due to still underestimated MLHs (Figure 6). 4-km simulation results have a higher bias than 36-km results relative to the observations in the daytime, similar to the comparisons of NO\textsubscript{2} surface concentrations and TVCDs in Figures 7 and 10 due to higher emissions around the observation sites in 4- than 36-km simulations (Table S1 and Figure 2).

3.6 Resolution dependence of NO\textsubscript{x} emission distribution

We show previously that the 4-km REAM simulated NO\textsubscript{2} and NO\textsubscript{y} surface concentrations and NO\textsubscript{2} TVCDs are higher than observations in the daytime in comparison to the corresponding 36-km REAM results (Figures 7, 10, and 12). An examination of monthly mean NO\textsubscript{2} surface concentrations and TVCDs for July 2011 also shows that 4-km simulation results are significantly higher than the 36-km results over the 11 inland Pandora sites in the daytime (Figure 13). The process-level diagnostics in Figure 9 indicate that the mean contribution of NO\textsubscript{x} emissions to NO\textsubscript{x} \Delta TVCDs in the 4-km simulation is \(1.32 \times 10^{15}\) molecules cm\(^{-2}\) h\(^{-1}\) larger than that in the 36-km simulation between 9:00 LT and 16:00 LT, while the absolute mean contributions of chemistry and transport (they are negative in Figure 9, so we use absolute values here) in the 4-km simulation are \(0.26 \times 10^{15}\) and \(0.87 \times 10^{15}\) molecules cm\(^{-2}\) h\(^{-1}\) larger than the 36-km simulation, respectively. The contributions of dry deposition to NO\textsubscript{x} \Delta TVCDs are negligible compared to other factors in both simulations (Figure 9). Therefore, the 34% higher NO\textsubscript{x} emissions over the 11 inland Pandora sites (Table S1 and Figure 3) is the main reason for the larger daytime NO\textsubscript{2} surface concentrations and TVCDs in the 4-km than the 36-km REAM simulations (Figure 13). The significantly different contribution changes between NO\textsubscript{x} emissions (\(1.32 \times 10^{15}\) molecules cm\(^{-2}\) h\(^{-1}\) or about one third) and chemistry (\(0.26 \times 10^{15}\) molecules cm\(^{-2}\) h\(^{-1}\) or about 8%) reflect potential chemical nonlinearity (Li et al., 2019; Silvern et al., 2019; Valin et al., 2011) and transport effect. Different transport contributions between the 4-km and the 36-km REAM are mainly caused by their different NO\textsubscript{x} horizontal gradients (Figures 2, 14, and 15), while the impact of wind fields is small since we do not find significant differences in horizontal wind
components between the two simulations except for some lower wind speeds below 1000 m for the 36-km WRF simulation compared to the nested 4-km WRF simulation (Figure S16). Our sensitivity tests with the WRF Single-Moment 3-class (WSM3) simple ice scheme (not shown) can improve the wind speed comparison below 1000 m between the 36-km and nested 4-km WRF simulations but still produce similar NOx simulation results as WSM6 shown here. Therefore, the somewhat lower wind speeds below 1000 m in the 36-km WRF simulation are not the reason for the difference between the 4-km and 36-km REAM simulations. The impact of transport on the two REAM simulations can be further verified by the comparison of NO2 TVCDs over the six P-3B spiral sites between the two simulations (Figure S17). Mean NOx emissions over the six P-3B spiral sites are close (relative difference < 4%) between the two simulations (Table S1 and Figure S17). From 9:00 to 12:00 LT, the contributions of NOx emissions to NOx ATVCDs are $2.50 \times 10^{15}$ and $2.49 \times 10^{15}$ molecules cm$^{-2}$ h$^{-1}$ for the 36-km and 4-km REAM simulations, respectively, and the contributions of chemistry are also close between the two simulations (36-km: $-2.62 \times 10^{15}$ molecules cm$^{-2}$ h$^{-1}$; 4-km: $-2.69 \times 10^{15}$ molecules cm$^{-2}$ h$^{-1}$). However, the contributions of transport are $-0.39 \times 10^{15}$ and $0.03 \times 10^{15}$ molecules cm$^{-2}$ h$^{-1}$ for the 36-km and 4-km REAM simulations, respectively, leading to larger NO2 TVCDs in the 4-km REAM simulation than the 36-km REAM from 9:00 – 12:00 LT (Figure S17c). Since horizontal wind fields over the six P-3B spiral sites are comparable between two simulations (Figures S4, S5, S6, and S16) and larger NOx horizontal gradients are found near the P-3B spiral sites for the 4-km REAM (Figure 2), we attribute the different transport contributions between the two simulations to a much larger NOx emission gradient around the measurement locations in 4-km than 36-km emission distributions.

We re-grid the 4-km REAM results into the grid cells of the 36-km REAM, which can significantly reduce the impact of different NOx emission distributions and associated transport on the two simulations. Compared to the original 4-km REAM results, the re-gridded surface NO2 concentrations and TVCDs over the 11 inland Pandora sites are much closer to the 36-km REAM results (Figure 13). After re-gridding the 4-km REAM results
into 36-km REAM grid cells, we also find more comparable NO\textsubscript{y} surface concentrations between the re-gridded 4-km results and the 36-km REAM results (Figure S18). The remaining discrepancies between the re-gridded results and the 36-km REAM results may be due to chemical nonlinearity and other meteorological effects, such as larger vertical wind in the 4-km REAM (Figure S9) and their different $k_{zz}$ values in the PBL. Although other factors, such as chemical nonlinearity and vertical diffusion, may affect the 36-km and 4-km REAM simulations differently, the difference between 4- and 36-km simulations of reactive nitrogen is largely due to that of NO\textsubscript{x} emissions.

The 4- and 36-km simulation difference depends on the location of the observations. In some regions, the NO\textsubscript{x} emission difference between 4- and 36-km simulations is small. The comparison of NO\textsubscript{y} measurements from P-3B spirals with coincident REAM results in Table 1 suggests that the 4-km and 36-km REAM simulations produce similar NO\textsubscript{y} (relative difference ~4\%) and derived-NO\textsubscript{y} (relative difference ~6\%) concentrations on weekdays, and both simulation results are comparable to the observations. The NO\textsubscript{y} similarity over the P-3B spiral sites between the 36-km and 4-km REAM simulations is consistent with the comparable NO\textsubscript{x} emissions over (relative difference < 4\%) the six P-3B spiral sites between the two simulations (Table S1). The differences between the 4-km model simulation results and P3-B observations are larger on weekends than on weekdays (Table 1) due to the limited weekend sampling since model simulated monthly mean values show similar differences between the 4-km and 36-km REAM simulations on weekends as on weekdays (not shown).

3.7 Evaluation of 36- and 4-km NO\textsubscript{x} distribution with OMI, GOME-2A, and ACAM measurements

The evaluation of model simulations of surface, aircraft, and satellite observations tends to point out a high bias in 4- than 36-km model simulations. We note that this comparison is based on the averages of multiple sites. NO\textsubscript{x} emissions at individual sites are not always higher in the 4-km than 36-km REAM, such as SERC, Fairhill, and Essex, with much higher 36-km NO\textsubscript{x} emissions than 4-km NO\textsubscript{x} emissions (Table S1). We conduct
individual-site comparisons of surface NO$_2$ concentrations, surface NO$_y$ concentrations, NO$_2$ vertical profiles, derived-NO$_y$ vertical profiles, and NO$_2$ TVCDs of the 36-km REAM and the 4-km REAM results relative to the corresponding observations in Figures S19 – S23. The 36-km simulation results can be larger, smaller, or comparable to the 4-km simulation results, and both simulations can produce higher, lower, or similar results as the observations for different variables at different sites. The varying model biases depending on the observation site reflect the different spatial distributions of NO$_x$ emissions between the 36- and 4-km REAM simulations (Figure 2) and suggest potential distribution biases of NO$_x$ emissions in both simulations.

Here we examine the 4-km model simulated NO$_2$ VCDs with high-resolution ACAM measurements onboard the UC-12 aircraft in Figures 14 and S24, respectively. The spatial distributions of ACAM and 4-km REAM NO$_2$ VCDs are generally consistent with R$^2 = 0.35$ on weekdays and R$^2 = 0.50$ on weekends. The domain averages of ACAM and 4-km REAM NO$_2$ VCDs are 4.7 ± 2.0 and 4.6 ± 3.2 × 10$^{15}$ molecules cm$^{-2}$ on weekdays and 3.0 ± 1.7 and 3.3 ± 2.7 × 10$^{15}$ molecules cm$^{-2}$ on weekends, respectively. The spatial distributions of ACAM and 4-km REAM NO$_2$ VCDs are highly correlated with the spatial distribution of 4-km NEI2011 NO$_x$ emissions. All three distributions capture two strong peaks around Baltimore and Washington, D.C. urban regions and another weak peak in the northeast corner of the domain (Wilmington city in Delaware) (Figures 14 and S24). However, Figures 14 and S24 clearly show that NO$_2$ VCDs from the 4-km REAM simulation are more concentrated in Baltimore and Washington, D.C. urban regions than ACAM, which are also reflected by the higher NO$_2$ VCD standard deviations of the 4-km REAM results than ACAM. Several Pandora sites are in the highest NO$_2$ VCD regions where the 4-km REAM generally produces larger NO$_2$ VCDs than ACAM, which explains why the NO$_2$ TVCDs over the 11 Pandora sites from the 4-km REAM simulation are higher than the observations (Figure 10) and the 36-km REAM results (Figure 13) around noontime. Horizontal transport cannot explain the NO$_2$ VCD distribution biases in the 4-km REAM simulation due to the following reasons. Firstly, horizontal wind fields are simulated as well by the nested 4-km WRF simulation as the 36-km WRF compared to P-3B measurements, as
discussed in section 3.1. Secondly, the prevailing northwest wind in the daytime (Figure S5) should move NO\textsubscript{x} eastward, but we find no significant eastward shift of NO\textsubscript{2} VCDs compared to NO\textsubscript{x} emissions in both ACAM and 4-km REAM distributions (Figure 14). Therefore, we attribute the distribution inconsistency between ACAM and the 4-km REAM to the distribution biases of NEI2011 NO\textsubscript{x} emissions at the 4-km resolution since the average below-aircraft NO\textsubscript{2} VCDs between ACAM and the 4-km REAM are about the same.

It is noteworthy that the number of data points used to calculate grid cell mean NO\textsubscript{2} VCDs varies significantly across the domain, as shown in Figures 14f and S24f. To mitigate potential sampling errors, we only consider the grid cells with \( \geq 10 \) data points on weekdays in Figure S25. Whether we scale NO\textsubscript{2} VCDs using the corresponding domain averages (Figure S25) or not (not shown), the 4-km REAM generally shows more concentrated NO\textsubscript{2} VCDs in Baltimore and Washington, D.C. urban regions but more dispersed NO\textsubscript{2} VCDs in rural areas than ACAM, consistent with our discussion above. In addition, about 91\% of ACAM NO\textsubscript{2} VCD data are measured from 8:00 – 16:00 LT, and only using ACAM NO\textsubscript{2} VCDs between 8:00 and 16:00 LT for the above comparison does not affect our results shown here. Moreover, to minimize the effect of overestimated afternoon vertical mixing (Figure 8) on the 4-km REAM simulation results, we also examine the comparison between ACAM NO\textsubscript{2} VCDs from 9:00 – 14:00 LT with coincident 4-km REAM results, which produces similar results as shown here. Finally, considering the NO\textsubscript{x} lifetime difference between morning and noontime, we also analyze the NO\textsubscript{2} VCD data at 11:00 – 14:00 LT, and similar results are found.

We also evaluate the NO\textsubscript{2} VCD distributions from the 4-km REAM simulation on weekdays and weekends with ACAM NO\textsubscript{2} VCDs below the U-12 aircraft obtained from https://www-air.larc.nasa.gov/cgi-bin/ArcView/discover-aq.dc-2011?UC12=1#LIU.XIONG/ in Figures S26 and S27. Although the domain mean ACAM NO\textsubscript{2} VCDs in Figures S26 and S27 are higher than coincident 4-km REAM results due to the different retrieval method from Lamsal et al. (2017), such as different above-aircraft NO\textsubscript{2} VCDs and different a priori NO\textsubscript{2}
vertical profiles, we can still find clear distribution inconsistencies between the 4-km REAM and ACAM NO$_2$ VCDs. The 4-km REAM NO$_2$ VCDs are more concentrated in the Baltimore and Washington, D.C. urban regions than this set of ACAM data, which is consistent with the conclusions derived from the ACAM dataset retrieved by Lamsal et al. (2017).

The potential distribution bias of the NEI2011 NO$_x$ emissions at 36-km resolution is analyzed by comparing the 36-km REAM simulated NO$_2$ TVCDs with those retrieved by OMI and GOME-2A, as shown in Figures 15 (OMI, 13:00 LT) and S28 (GOME-2A, 9:30 LT). Both KNMI and our retrievals based on the 36-km REAM NO$_2$ vertical profiles show that OMI and GOME-2A NO$_2$ TVCDs have lower spatial variations than the corresponding 36-km REAM simulation results. OMI and GOME-2A retrievals have lower NO$_2$ TVCDs around the Baltimore and Washington, D.C. urban regions and higher values in relatively rural regions than the 36-km REAM. The distribution bias of the 36-km REAM NO$_2$ TVCDs is also identified on weekends through their comparison with OMI and GOME-2A retrievals (not shown). The good agreement between simulated and observed wind suggests that the model horizontal transport error cannot explain such an urban-rural contrast between satellite observations and 36-km REAM simulation results. However, two caveats deserve attention. Firstly, the 36-km REAM cannot resolve urban areas as detailed as the 4-km REAM (Figure 14), and urban and rural regions may coexist in one 36-km grid cell. Secondly, the OMI and GOME-2A pixels can be much larger than 36-km REAM grid cells, possibly leading to more spatially homogenous distributions of satellite NO$_2$ TVCD data.

3.8 Implications for NO$_x$ emissions

The analysis of section 3.7 indicates that the NEI2011 NO$_x$ emission distributions at 36- and 4-km resolutions are likely biased for the Baltimore-Washington region. The distribution bias of NO$_x$ emission inventories is corroborated by the comparison of the NO$_x$ emission inventory derived from the CONsolidated Community Emissions Processor Tool, Motor Vehicle (CONCEPT MV) v2.1 with that estimated by the Sparse
Matrix Operator Kernel Emissions (SMOKE) v3.0 model with the Motor Vehicle Emissions Simulator (MOVES) v2010a (DenBleyker et al., 2012). CONCEPT with finer vehicle activity information as input produced a widespread but less-concentrated running exhaust NOx emissions compared to MOVES in the Denver urban area for July 2008 (DenBleyker et al., 2012). In addition, Canty et al. (2015) found that CMAQ 4.7.1, with on-road emissions from MOVES and off-road emissions from the National Mobile Inventory Model (NMIM), overestimated NO2 TVCD over urban regions and underestimated NO2 TVCDs over rural areas in the northeastern U.S. for July and August 2011 compared to the OMNO2 product. The urban-rural contrast was also found in Texas during the 2013 DISCOVER-AQ campaign in the studies of Souri et al. (2016) and Souri et al. (2018), implying distribution uncertainties in NOx emissions, although these studies and Canty et al. (2015) focused more on polluted regions with overestimated NOx emissions in their conclusions. The emission distribution bias may also explain why Anderson et al. (2014) have different results from our simulated concentrations in Table 1. In their study, they compared in-situ observations with a nested CMAQ simulation with a resolution of 1.33 km. It is difficult to build up a reliable emission inventory for the whole U.S. at very high resolutions with currently available datasets due to the significant inhomogeneity of NOx emissions (Marr et al., 2013), but we can still expect significant improvements in the temporal-spatial distributions of NOx emissions in the near future as GPS-based information start to be used in the NEI estimates (DenBleyker et al., 2017).

Here, we emphasize that our study is not necessarily contradictory to recent studies concerning the overestimation of NEI NOx emissions (Anderson et al., 2014; Canty et al., 2015; McDonald et al., 2018; Souri et al., 2016; Souri et al., 2018; Travis et al., 2016). Different types of observations in different periods and locations are analyzed for various purposes. This study focuses more on the spatial distribution of NOx emissions in NEI2011, while previous studies are concerned more about the NOx emission magnitudes in highly polluted sites, although the spatial distribution issue was also mentioned in some of the studies. If we limit our analyses to those observations in Figures 7, 10, and 12 and the 4-km REAM, we would also conclude an overestimation of NEI
Considering the significant heterogeneity of NO\textsubscript{x} emissions, the spatial distribution of NO\textsubscript{x} emissions is a critical factor in evaluating NO\textsubscript{x} emissions and improving emission estimation and air quality models, which deserves more attention in future studies, especially when chemical and transport models are moving to higher and higher resolutions.

### 4 Conclusions

We investigate the diurnal cycles of surface NO\textsubscript{2} concentrations, NO\textsubscript{2} vertical profiles, and NO\textsubscript{2} TVCDs using REAM model simulations on the basis of the observations from air quality monitoring sites, aircraft, Pandora, OMI, and GOME-2A during the DISCOVER-AQ 2011 campaign. We find that WRF simulated nighttime $k_{cc}$-determined MLHs are significantly lower than ELF lidar measurements. Increasing nighttime mixing from 18:00 – 5:00 LT in the REAM simulations, we significantly improve REAM simulations of nighttime surface NO\textsubscript{2} and O\textsubscript{3} concentrations.

The REAM simulation reproduces well the observed regional mean diurnal cycles of surface NO\textsubscript{2} and NO\textsubscript{y} concentrations, NO\textsubscript{2} vertical profiles, and NO\textsubscript{2} TVCDs on weekdays. Observed NO\textsubscript{2} concentrations in the boundary layer and TVCDs on weekends are significantly lower than on weekdays. By specifying a weekend to weekday NO\textsubscript{x} emission ratio of 2:3 and applying a less variable NO\textsubscript{x} emission diurnal profile on weekends than weekdays, REAM can simulate well the weekend observations. Two issues are also noted. First, Pandora TVCDs show different variations from aircraft-derived and REAM-simulated TVCDs in the early morning and late afternoon, which may be due to the uncertainties of Pandora measurements at large SZAs and the small effective FOV of Pandora. Second, the weekday OMI NO\textsubscript{2} TVCDs derived by NASA are somewhat lower than the KNMI OMI product, P-3B aircraft-derived TVCDs, Pandora, and REAM results; the difference may be caused by the a priori vertical profiles used in the NASA retrieval.
While a higher-resolution simulation is assumed to be superior at a priori, the large observation dataset during DISCOVER-AQ 2011 offers the opportunity of a detailed comparison of 4-km and 36-km model simulations. Through the comparison, we find two areas that have not been widely recognized. The first is not using convection parameterization in high-resolution WRF simulations since convection can be resolved explicitly and most convection parameterizations are not designed for high-resolution simulations. We find that 4-km WRF tends to overestimate boundary-layer mixing and vertical transport in the late afternoon, leading to a high model bias in simulated NO\textsubscript{2} vertical profiles compared to P-3B aircraft observations. The reasons for this late-afternoon bias in 4-km WRF simulations and model modifications to mitigate this bias need further studies.

A second issue is related to the spatial distribution of NO\textsubscript{x} emissions in NEI2011. In general, the 4-km simulation results tend to have a high bias relative to the 36-km results on the regional mean observations. However, for individual sites, relative to the 36-km model simulations, the 4-km model results can show larger, smaller, or similar biases compared to the observations depending upon observation location. Based on process diagnostics and analyses, we find that the bias discrepancies between the 36-km and 4-km REAM simulations are mainly attributed to their different NO\textsubscript{x} emissions and their spatial gradients at different sites. The comparison of 4-km ACAM NO\textsubscript{2} VCD measurements from the UC-12 aircraft with coincident 4-km REAM results shows that 4-km REAM NO\textsubscript{2} VCDs are more concentrated in urban regions than the ACAM observations. OMI and GOME-2A data also show less spatially varying NO\textsubscript{2} TVCD distributions with lower NO\textsubscript{2} TVCDs around the Baltimore-Washington urban regions and higher TVCDs in surrounding rural areas than corresponding 36-km REAM simulation results. Further model analysis indicates that the 36- and 4-km VCD discrepancies are due primarily to the distribution bias of NEI2011 NO\textsubscript{x} emissions at 36- and 4-km resolutions. Our results highlight the research need to improve the methodologies and datasets to improve the spatial distributions in emission estimates.
Data availability

The DISCOVER-AQ 2011 campaign datasets are archived on https://www-air.larc.nasa.gov/cgi-bin/ArcView/discover-aq.dc-2011 (last access: March 14, 2021). EPA air quality monitoring datasets are from https://www3.epa.gov/airdata/ (last access: June 23, 2015). The NASA OMI NO\textsubscript{2} product is from https://disc.gsfc.nasa.gov/datasets/OMNO2_003/summary (last access: September 26, 2020). The KNMI OMI NO\textsubscript{2} product is from http://www.temis.nl/airpollution/no2.html (last access: January 14, 2015). We obtain the KNMI GOME-2A NO\textsubscript{2} VCD archives from http://www.temis.nl/airpollution/no2col/no2colgome2_v2.php (last access: January 22, 2015). The GMI MERRA-2 simulation results are from https://portal.nccs.nasa.gov/datashare/dirac/gmidata2/users/mrdamon/Hindcast-Family/HindcastMR2/2011/stations/ (last access: May 14, 2019). We obtain the UC-12 ACAM NO\textsubscript{2} VCD product by X. Liu from https://www-air.larc.nasa.gov/cgi-bin/ArcView/discover-aq.dc-2011?UC12=1#LIU.XIONG/ (last access: December 31, 2019). The Stage IV precipitation data is downloaded from https://rda.ucar.edu/datasets/ds507.5/ (last access: December 28, 2019). The NCEP CFSv2 6-hourly product is available at http://rda.ucar.edu/datasets/ds094.0/ (last access: March 10, 2015). REAM simulation results for this study and the UC-12 ACAM NO\textsubscript{2} VCD product by Lamsal et al. (2017) are available upon request.

Author contribution

JL and YW designed the study. JL, RZ, and CS updated the REAM model. JL conducted model simulations. KFB developed the DOMINO algorithm, CS applied the algorithm to REAM vertical profiles, and JL updated the retrieval algorithm and did the retrieval by using REAM NO\textsubscript{2} vertical profiles. AW, JH, EAC, RWL, JJS, RD, AMT, TNK, LNL, SJJ, MGK, XL, CRN made various measurements in the DISCOVER-AQ 2011 campaign. JL conducted the analyses with discussions with YW, RZ, CS, AW, JH, KFB, EAC, RWL, JJS, RD, AMT, TNK, LNL, SJJ, MGK, XL, and CRN. JL and YW led the writing of the manuscript with inputs from all other coauthors. All coauthors reviewed the manuscript.
Competing interests

The authors declare that they have no conflict of interest.

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**Table 1.** Comparison of the concentrations of NO$_y$ and its components between REAM and P-3B aircraft measurements during the DISCOVER-AQ campaign

<table>
<thead>
<tr>
<th></th>
<th>NO$_y$ / ppb</th>
<th>NO / ppb</th>
<th>NO$_2$-NCAR / ppb</th>
<th>NO$_2$ LIF / ppb</th>
<th>∑PNs / ppb</th>
<th>∑ANs / ppb</th>
<th>HNO$_3$ / ppb</th>
<th>Derived-NO$_y$ / ppb</th>
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<tr>
<td><strong>36-km</strong></td>
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<td></td>
<td></td>
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<tr>
<td><strong>Weekday</strong></td>
<td>P-3B</td>
<td>2.51 ± 0.29</td>
<td>0.18 ± 0.29</td>
<td>0.85 ± 1.13</td>
<td>0.68 ± 0.95</td>
<td>0.70 ± 0.58</td>
<td>0.31 ± 0.23</td>
<td>1.15 ± 0.73</td>
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<td>REAM</td>
<td>3.64 ± 3.13</td>
<td>0.18 ± 0.30</td>
<td>0.74 ± 1.04</td>
<td>0.68 ± 0.89</td>
<td>0.54 ± 0.45</td>
<td>0.10 ± 0.09</td>
<td>1.80 ± 1.61</td>
<td>3.10 ± 2.70</td>
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<td><strong>Weekend</strong></td>
<td>P-3B</td>
<td>3.00 ± 2.18</td>
<td>0.15 ± 0.20</td>
<td>0.71 ± 0.80</td>
<td>0.63 ± 0.72</td>
<td>0.91 ± 0.53</td>
<td>0.36 ± 0.21</td>
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<td>REAM</td>
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<td>0.54 ± 0.59</td>
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<td>0.09 ± 0.06</td>
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<td><strong>4-km</strong></td>
<td>P-3B</td>
<td>2.51 ± 0.25</td>
<td>0.19 ± 0.30</td>
<td>0.86 ± 1.27</td>
<td>0.68 ± 0.98</td>
<td>0.70 ± 0.59</td>
<td>0.31 ± 0.22</td>
<td>1.17 ± 0.74</td>
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<td>REAM</td>
<td>3.81 ± 3.81</td>
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<td>0.08 ± 0.10</td>
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<td><strong>Weekend</strong></td>
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<td>REAM</td>
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1 For P-3B, the concentrations of NO$_y$, NO, and NO$_2$-NCAR were measured by using the NCAR 4-channel chemiluminescence instrument. The measurement uncertainties are 10%, 10 - 15%, and 10% for NO, NO$_2$, and NO$_y$, respectively. The 1-second, 1-sigma detection limits are 20 pptv, 30 pptv, and 20 pptv for NO, NO$_2$, and NO$_y$, respectively (https://discover-aq.larc.nasa.gov/pdf/2010STM/Weinheimer20101005_DISCOVERAQ_AJW.pdf). For REAM, NO, NO$_2$, total peroxyacyl nitrates (ΣPNs), total alkyl nitrates (ΣANs) (include alkyl nitrates and hydroxyalkyl nitrates), HNO$_3$, HONO, 2 × N$_2$O$_5$, HNO$_4$, first generation C5 carbonyl nitrates (nighttime isoprene nitrate ISN1: C$_5$H$_9$NO$_2$), 2 × C5 dihydroxydinitrate (DHDN: C$_5$H$_9$(O$_2$)N$_2$), methyl peroxy nitrate (MPN: CH$_3$O$_2$NO$_2$), propionate nitrate (PROPNN: CH$_3$C(O)CH$_2$ONO$_2$), nitrate from methyl vinyl ketone (MVKN: HOCH$_2$CH(ONO)$_2$C(=O)CH$_2$), nitrate from methacrolein (MARCN: HOCH$_2$C(ONO)$_2$(CH)$_3$CHO), and ethanol nitrate (ETHLN: CHOCH$_2$ONO$_2$).

2 For P-3B, the concentrations of NO$_2$ LIF, ΣPNs, ΣANs, and HNO$_3$ were measured by applying the thermal dissociation-laser induced fluorescence (TD-LIF) technique. The accuracy of TD-LIF measurements of NO$_2$, ΣPNs, ΣANs, and HNO$_3$ is better than 15%, and the detection limit for the sum of NO$_2$, ΣPNs, ΣANs, and HNO$_3$ is 10 ppt 10$^{-5}$ (Day et al., 2002).

3 To compare NO$_y$ concentrations from TD-LIF measurements with those from REAM, we calculate derived-NO$_y$ as the sum of NO, NO$_2$ LIF, ΣPNs, ΣANs, and HNO$_3$. Only when the concentrations of all the five species are available at the same hour in the same grid cell, we can calculate derived-NO$_y$ at the given hour in the given grid cell. Therefore, in Table 1, the averaged derived-NO$_y$ values are not exactly equal to the sum of averaged NO, NO$_2$ LIF, ΣPNs, ΣANs, and HNO$_3$ concentrations that only depend on the availability of a single species. In addition, the measurement times and frequencies between NO$_2$ and derived-NO$_y$ are not the same. A comparison between these two types of data needs coincident sampling, as described in the main text.

4 Mean NO$_y$ emissions over the six P-3B spiral sites are close (relative difference < 4%) between the 36-km and 4-km REAM (Table S1).

5 Due to different sampling times and locations between weekdays and weekends, we do not recommend a direct comparison between weekday and weekend values here.
Figure 1. The locations of surface and P-3B aircraft observations during the DISCOVER-AQ 2011 campaign. We mark the 36-km REAM grid cells with red lines and the 4-km REAM grid cells with black lines. Gray shading denotes land surface in the nested 4-km WRF domain, while white area denotes ocean/water surface. Blue dots denote surface O_3 observation sites. Cross-marks denote surface NO_2 observation sites, and their colors denote different measurement instruments: green for the Thermo Electron 42C-Y NO_y analyzer, dark orchid for the Ecotech Model 9841/9843 T-NO_y analyzers, black for the Thermo Model 42C NO_x analyzer, and chocolate for the Teledyne API model 200eup photolytic NO_x analyzer. Circles denote Pandora sites, and the cyan circle denotes a Pandora site (USNA) on a ship. Black squares denote the inland P-3B aircraft spiral locations.
Figure 2. Distributions of NO\textsubscript{x} emissions for the (a) 36-km and (b) 4-km REAM simulations around the DISCOVER-AQ 2011 region. Here NO\textsubscript{x} emissions refer to the mean values (molecules km\textsuperscript{-2} s\textsuperscript{-1}) in one week (Monday – Sunday).
**Figure 3.** Relative diurnal profiles of weekday and weekend NO$_x$ emissions (molecules km$^{-2}$ s$^{-1}$) in the DISCOVER-AQ 2011 region (the 36/4 km grid cells over the 11 inland Pandora sites shown in Figure 1) for the 36-km and 4-km REAM. All the profiles are scaled by the 4-km weekday emission average value (molecules km$^{-2}$ s$^{-1}$).
Figure 4. Hourly ratios of NO$_2$ measurements from the Teledyne API model 200 eup photolytic NO$_x$ analyzer to NO$_2$ from coincident catalytic instruments for 2011 July. “CY42” denotes the ratios of photolytic NO$_2$ to NO$_2$ from the Thermo Electron 42C-Y NO$_x$ analyzer in Edgewood, “C42” denotes the ratios of photolytic NO$_2$ to NO$_2$ from the Thermo Model 42C NO$_x$ analyzer in Padonia, and “ECO” denotes the ratios of photolytic NO$_2$ to NO$_2$ from the Ecotech Model 9841 T-NO$_y$ analyzer in Padonia. “ECO” ratios are also used to scale NO$_2$ measurements from the Ecotech Model 9843 T-NO$_y$ analyzer.
Figure 5. Diurnal cycles of surface (a, c) NO$_2$ and (b, d) O$_3$ concentrations on (a, b) weekdays and (c, d) weekends during the DISCOVER-AQ campaign in the DISCOVER-AQ region (the 36-km grid cells over the 11 inland Pandora sites shown in Figure 1). Black lines denote the mean observations from all the 11 NO$_2$ surface monitoring sites and 19 O$_3$ surface sites during the campaign (Figure 1), as mentioned in Section 2.5. “REAM-raw” (blue lines) denotes the coincident 36-km REAM simulation results with WRF-YSU simulated $k_{zz}$ data, and “REAM-kzz” (red lines) is the coincident 36-km REAM simulation results with updated $k_{zz}$ data. See the main text for details. Vertical bars denote corresponding standard deviations.
Figure 6. ELF observed and model simulated diurnal variations of MLH at the UMBC site during the Discover-AQ campaign. “ELF MLH” denotes ELF derived MLHs by using the covariance wavelet transform method. “WRF-YSU MLH” denotes the 36-km WRF-YSU $k_z$-determined MLHs, and “Updated MLH” denotes updated $k_z$-determined MLHs. See the main text for details. Vertical bars denote standard deviations. For the ELF MLHs, there are 13,506 1-minute measurements in total during the campaign, and we bin them into hourly data. The green line corresponding to the right y-axis shows the diurnal variations of the number of hourly ELF data points.
Figure 7. Diurnal cycles of observed and simulated average surface NO$_2$ concentrations over Padonia, Oldtown, Essex, Edgewood, Beltsville, and Aldino (Table S1) on (a) weekdays and (b) weekends. Black lines denote mean observations from the six sites. Red lines denote coincident 36-km REAM simulation results, and blue lines are for coincident 4-km REAM simulation results. Error bars denote standard deviations.
Figure 8. Temporal evolutions of NO$_2$ vertical profiles below 3 km on (a, c, e) weekdays and (b, d, f) weekends from the (a, b) P-3B aircraft and (c, d) 36-km and (e, f) 4-km REAM during the DISCOVER-AQ campaign. Horizontal bars denote the corresponding standard deviations. In (a) and (b), dots denote aircraft measurements, while lines below 1 km are based on quadratic polynomial fitting, as described in section 2.6. The fitting values are mostly in reasonable agreement with the aircraft and surface measurements in the boundary layer. On weekends, no aircraft observations were made at 6:00 – 8:00 LT, and therefore no corresponding model profiles are shown.
Figure 9. Contributions of emission, chemistry, transport, and dry deposition to NO$_x$ TVCD diurnal variations over the 11 inland Pandora sites (Table S1 and Figure 1) on weekdays in July 2011 for the (a) 36-km and (b) 4-km REAM simulations. “Chem” refers to net NO$_x$ chemistry production; “Emis” refers to NO$_x$ emissions; “Drydep” denotes NO$_x$ dry depositions; “Transport” includes advection, turbulent mixing, lightning NO$_x$ production, and wet deposition. “Total (NO$_x$)” is the hourly change of NO$_x$ TVCDs ($\Delta$TVCD) = TVCD$_{t+1}$ - TVCD$_t$). “Total (NO$_2$)” is the hourly change of NO$_2$ TVCDs, and “Total (NO)” is the hourly change of NO TVCDs.
Figure 10. Daily variations of NO\textsubscript{2} TVCDs on (a) weekdays and (b) weekends during the DISCOVER-AQ campaign. “REAM-36km” refers to the 36-km REAM simulation results over the 11 inland Pandora sites. “REAM-4km” refers to the 4-km REAM simulation results over the 11 inland Pandora sites. “Pandora” refers to updated Pandora TVCD data. “Flight” denotes P-3B aircraft-derived NO\textsubscript{2} VCDs below 3.63 km. “NASA-OMI” denotes the OMI NO\textsubscript{2} TVCDs retrieved by NASA over the Pandora sites; “KNMI-OMI” denotes the OMI NO\textsubscript{2} TVCDs from KNMI; “KNMI-GOME2” is the GOME-2A NO\textsubscript{2} TVCDs from KNMI. “OMI-retrieval” and “GOME2-retrieval” denote OMI and GOME-2A TVCDs retrieved by using the KNMI DOMINO algorithm with corresponding 36-km REAM vertical profiles, respectively. The vertical bars denote corresponding standard deviations for all data except the 36-km REAM simulation results, the standard deviations of which are shown with pink shading. We list NO\textsubscript{2} TVCD values at 9:30 and 13:30 LT in Table S3.
Figure 11. Weekday hourly variations of NO$_2$ VCDs at different height (AGL) bins (< 3.63 km AGL, < 300 m AGL, and 300 m ~ 3.63 km AGL) based on P-3B aircraft-derived datasets and the 36-km and 4-km REAM results. “Flight” denotes P-3B aircraft-derived NO$_2$ VCDs, “REAM-36km” denotes coincident 36-km REAM simulated VCDs, and “REAM-4km” denotes coincident 4-km REAM simulated VCDs.
Figure 12. Diurnal cycles of observed and simulated average surface NO\textsubscript{y} concentrations at Padonia, Edgewood, Beltsville, and Aldino on (a) weekdays and (b) weekends. Vertical bars denote the corresponding standard deviations. It is noteworthy that the mean NO\textsubscript{x} emissions over Padonia, Edgewood, Beltsville, and Aldino are 99% higher in the 4-km than the 36-km REAM simulations (Table S1).
Figure 13. Comparisons of NO$_2$ (a, c) TVCDs and (b, d) surface concentrations over the 11 inland Pandora sites between the 4-km and 36-km REAM simulations on (a, b) weekdays and (c, d) weekends for July 2011. “REAM-36km” (black lines) denotes the 36-km REAM simulation results; “REAM-4km” (red lines) denotes the 4-km REAM simulation results; “4km-regrid” (blue lines) refers to the 36-km values by re-gridding the 4-km REAM simulation results into 36-km REAM grid cells. The vertical bars denote corresponding standard deviations for all data except the 36-km REAM simulation results, the standard deviations of which are shown with gray shading.
Figure 14. Distributions of the scaled mean (a) 4-km REAM simulated NO$_2$ VCDs below the UC-12 aircraft and (b) coincident ACAM measurements on weekdays in July 2011. (c), the distribution of the scaled NEI2011 NO$_x$ emissions on weekdays. (d) The scatter plot of the scaled 4-km REAM and ACAM NO$_2$ VCDs from (a) and (b). (e) shows the relative differences between (a) and (b) ($\frac{REAM}{ACAM} - 1$). (f) The distribution of the number of data points used to calculate grid cell mean NO$_2$ VCDs in (a) and (b). Here, we scale all values (VCDs and NO$_x$ emissions) based on their corresponding domain averages. The domain averages of ACAM and coincident 4-km REAM NO$_2$ VCDs are $4.7 \pm 2.0$ and $4.6 \pm 3.2 \times 10^{15}$ molecules cm$^{-2}$, respectively.
Figure 15. Distributions of weekday NO$_2$ TVCDs around the DISCOVER-AQ 2011 region for 13:30 LT in July 2011: (a) the 36-km REAM simulation results, (b) the NASA OMI product (OMNO2), (c) the KNMI OMI product, (d) the retrieved OMI NO$_2$ TVCDs by using the KNMI DOMINO algorithm with corresponding 36-km REAM vertical profiles, (e) the distribution of the NO$_2$ TVCD differences (c minus a) between KNMI OMI and 36-km REAM, and (f) the difference (d minus a) between retrieved OMI NO$_2$ TVCDs and the 36-km REAM results. The NO$_2$ TVCD unit is 10$^{15}$ molecules cm$^{-2}$. 