



Using satellite observations of tropospheric NO₂ columns to infer long-term trends in US NO_x emissions: the importance of accounting for the free tropospheric NO₂ background

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Abstract. The National Emission Inventory (NEI) of the US Environmental Protection Agency (EPA) reports a steady decrease of US NO_x emissions over the 2005-2017 period at a rate of 0.1 Mt a⁻¹ (53% decrease over the period), reflecting sustained efforts to improve air quality. Tropospheric NO₂ columns observed by the satellite-based Ozone Monitoring Instrument (OMI) over the US show a steady decrease until 2009 but a flattening afterward, which has been attributed to a flattening of NO_x emissions in contradiction with the NEI. We show here that the steady 2005-2017 decrease of NO_x emissions reported by the NEI is in fact consistent with observed network trends of surface NO₂ and ozone concentrations. The OMI NO₂ trend is instead similar to that observed for nitrate wet deposition fluxes, where post-2009 flattening is due to an increasing relative contribution of non-anthropogenic background (mainly lightning and soils) and not to a flattening of anthropogenic emissions. This is confirmed by contrasting OMI NO₂ trends in urban winter, where the background is low and OMI NO₂ shows a steady 2005-2017 decrease consistent with the NEI, and rural summer, where the background is high and OMI NO₂ shows no significant 2005-2017 trend. A GEOS-Chem model simulation driven by NEI emission trends for the 2005-2017 period reproduces these different trends except for the post-2009 flattening of OMI NO₂, which we attribute to a model underestimate of free tropospheric NO₂. Better understanding is needed of the factors controlling free tropospheric NO₂ in order to relate satellite observations of tropospheric NO₂ columns to the underlying NO_x emissions and their trends. Focusing on urban winter conditions in the satellite data minimizes the effect of this free tropospheric background.



1. Introduction

Nitrogen oxide radicals ($\text{NO}_x \equiv \text{NO} + \text{NO}_2$) emitted by fuel combustion harm air quality by catalyzing ozone production and by producing nitrate particulate matter. They also contribute to acid and nitrogen deposition. Starting in the early 2000s, the US Environmental Protection Agency (EPA) implemented increasingly stringent NO_x emission controls targeted principally at improving ozone air quality. The EPA National Emission Inventory (NEI) reports a steady decrease of US NO_x emissions over the 2005-2017 period at a rate of 0.10 Tg N a^{-1} or 53% overall (EPA, 2018). However, Jiang et al. (2018) showed that tropospheric NO_2 columns observed by OMI over the US stopped decreasing after 2009, and they concluded that NO_x emissions have been decreasing much less than reported by the NEI. Here we show that the flattening of the OMI NO_2 trend is in fact not inconsistent with the sustained decrease of NO_x emissions reported by the NEI, and that the NEI emission trend is consistent with other atmospheric observations of NO_x and ozone trends. Our results demonstrate the importance of accounting for the free tropospheric NO_2 background when using satellite observations of NO_2 columns to infer NO_x emissions and their trends.

The Ozone Monitoring Instrument (OMI) aboard the US National Aeronautics and Space Administration (NASA) Aura satellite has been making continuous daily global observations of NO_2 since late 2004 (Levelt et al., 2006; 2018). The NO_2 retrieval (Boersma et al., 2011; Bucsela et al., 2013) involves spectral fitting of measured nadir solar backscatter at 400-500 nm, yielding “slant” NO_2 columns along the line of sight from which the contribution from the stratosphere is removed (Martin et al., 2002; Richter and Burrows, 2002; Bucsela et al., 2013). The slant tropospheric columns are then converted to actual tropospheric NO_2 columns by accounting for surface and atmospheric scattering, and assuming a vertical distribution of NO_2 within the column (“shape factor”). In polluted regions with high NO_x emissions, most of the information in the NO_2 tropospheric column is presumed to originate from the boundary layer. Thus the column is commonly viewed as a proxy for NO_x emissions.

Satellite observations of tropospheric NO_2 columns have been used extensively to infer NO_x emissions and their trends (Leue et al., 2001; Martin et al., 2003; Richter et al., 2005; Boersma et al., 2008). A number of studies have used the observed OMI NO_2 decreases over the US as evidence for decreases in NO_x emissions consistent with the NEI (Russell et al., 2012; Duncan et al., 2013; Streets et al., 2013; de Foy et al., 2015; Duncan et al., 2016; Krotkov et al., 2016), and consistent also with trends in NO_2 concentrations observed from surface networks (Kharol et al., 2015; Lamsal et al., 2015; Lu et al., 2015; Tong et al., 2015; Zhang et al., 2018). Several studies reported a steepening of the OMI NO_2 decrease during the Great Recession of 2007-2009 and a subsequent flattening attributed to economic recovery (Russell et al., 2012; Tong et al., 2015; de Foy et al., 2016). However, the analysis of the 2005-2015 record



by Jiang et al. (2018) shows that the post-2009 flattening of the NO_2 trend extends well beyond the initial economic recovery period.

The NEI is a ‘bottom-up’ national inventory compiled by the EPA every three years using continuous emission monitoring systems (CEMS) for large point sources, and estimates derived from activity data and emission factors (NO_x emitted per unit of activity) for smaller and distributed sources. Emissions in 2017 estimated by EPA (2018) included 35% from on-road mobile sources, 25% from off-road mobile sources, 12% from industrial point sources, and 27% from electricity generating units (EGUs). Mobile emissions are estimated from the Motor Vehicle Emission Simulator (MOVES) model using as inputs vehicle population, vehicle miles traveled (VMT), and operating modes. Long-term trends in NO_x emissions are re-computed with each new NEI release using updated emission models so that national trends are self-consistent for a given NEI version.

Many recent studies using near-source, urban, and regional observations of atmospheric NO_x have found that the NEI greatly overestimates US NO_x emissions (Castellanos et al., 2011; Brioude et al., 2013; Anderson et al., 2014; Goldberg et al., 2016; Sourì et al., 2016; Travis et al., 2016). CEMS measurements of point sources are considered reliable but tunnel and roadside measurements show that the MOVES inventory for mobile sources may be too high (Fujita et al., 2012). Fuel-based approaches for estimating emissions from mobile sources appear to be more reliable than the MOVES VMT approach (Dallmann and Harley, 2010; McDonald et al., 2012; Kim et al., 2016). McDonald et al. (2018) showed that on-road gasoline NO_x emission factors used by NEI are a factor of 2 too high compared to roadside observations and their fuel-based inventory. All these studies were conducted under summertime or warm conditions. By contrast, atmospheric observations of NO_x and related species during the WINTER campaign over the Northeast US during February-March 2015 showed good agreement with the NEI (Jaegle et al., 2018; Salmon et al., 2018).

The uncertainty regarding NEI NO_x emissions suggests that the trend in these emissions could be uncertain as well. However, a flattening out of US NO_x emissions over the past decade as inferred by Jiang et al. (2018) from the OMI data would be difficult to reconcile with observations of steady improvement in ozone air quality (Astitha et al., 2017; Chang et al., 2017), which has been attributed specifically to NO_x emission controls (Hidy and Blanchard, 2015; Simon et al., 2015; Strode et al., 2015; Xing et al., 2015; Blanchard and Hidy, 2018; Li et al., 2018). Here we conduct a more comprehensive analysis of 2005-2017 trends in US NO_x emissions by using the GEOS-Chem chemical transport model (Travis et al., 2016) driven by NEI trends to interpret concurrently the trends observed in OMI NO_2 columns, nitrogen wet deposition fluxes, and surface observations of NO_2 and ozone.

2. Trends of OMI tropospheric NO_2 columns



Figure 1 shows the 2005-2017 trends of OMI tropospheric NO₂ columns averaged spatially and annually over the contiguous US. The observations are from the NASA operational retrieval (Level 2, v3.0; Krotkov et al., 2017). OMI is in a sun-synchronous orbit with overpass at 13:30 local time. Cloudy scenes (cloud radiance fraction > 0.5), bright surfaces (surface reflectivity > 0.3), and observations affected by the so-called row anomaly (Dobber et al., 2008) have been filtered out. Inversion of the backscattered radiance spectra measured by OMI is used to retrieve the slant column along the line of sight from the sun to satellite. The stratospheric contribution to the total slant column is estimated using OMI observations over clean background and cloudy areas and applying an interpolating-filtering-smoothing algorithm (Bucsela et al., 2013), and is subsequently removed to derive the tropospheric slant column. The tropospheric slant columns are then converted to vertical columns with air mass factors (AMFs; Palmer et al., 2001) that convolve the altitude-dependent sensitivity from atmospheric scattering (scattering weights) with the local relative vertical distribution of NO₂ from the Global Modeling Initiative (GMI) model (shape factor). Over continental source regions, the AMF dominates the overall retrieval error due to uncertainties in a priori NO₂ profiles, surface albedo, and cloud parameters (Lamsal et al., 2014; Lorente et al., 2017). Inputs to AMF calculation, including the static database of surface reflectivity (Kleipool et al., 2008) and the implicit accounting of aerosol effects through cloud retrievals (Boersma et al., 2011), could also affect the AMF and its trend. We re-computed the AMFs using GEOS-Chem rather than GMI shape factors and found little difference in the mean (Figure 1).

The OMI data show an evident flattening of NO₂ columns after 2009, as pointed out by Jiang et al. (2018) who also find the same flattening in alternative OMI NO₂ retrievals produced by KNMI (Boersma et al., 2011) and UC Berkeley (Laughner et al., 2018). NO₂ tropospheric columns decrease at a mean rate of $6 \pm 0.5\% \text{ a}^{-1}$ over the 2005-2009 period but then do not change significantly post-2009. We find that data for the western, central, northeastern, and southeastern US all show similar trends. Hence we focus our analysis on the mean trends over the contiguous US, as did Jiang et al. (2018).

Also shown in Figure 1 are trends from a 13-year simulation (2005-2017) with the GEOS-Chem global chemical transport model at $0.5^\circ \times 0.625^\circ$ nested horizontal resolution over North America. The model is driven by NEI NO_x emissions for fuel combustion, decreased by 60% for non-EGU sources following Travis et al. (2016). It also includes NO_x emissions from background (non-fuel combustion) sources including open fires (Darmenov and da Silva, 2013), lightning (Murray et al., 2012), and soil and fertilizer (Hudman et al., 2012). Further details on the model are in the Appendix. The model NO₂ column averages 28% lower than observed, due to both an underestimate in background NO₂, discussed below, and because the Travis et al. (2016) correction to the NEI is excessive, which we will address in a separate paper. More to the point here, the model shows a sustained decrease averaging $3.3 \pm 0.1\% \text{ a}^{-1}$ over the 2005-2017 period, at odds with the OMI observations, though lower than the NEI reported decrease of $5.9\% \text{ a}^{-1}$



over the same period. Here and throughout this paper we derive linear trends by ordinary regression and express them in units of [% a⁻¹] relative to the mean over the data period, following Jiang et al. (2018). We compute uncertainty using the bootstrapping method as the error standard deviation of the linear trend.

The weaker relative trend in the model compared to the NEI is because of the contribution from background NO_x sources. The right panel of Figure 1 shows the annual total US NO_x emissions for 2005-2017 in the GEOS-Chem simulation. Anthropogenic emissions from fuel combustion decrease at a rate of 5.9% a⁻¹, following the NEI trend. But these emissions account for only 61% of total US emissions in 2005 and 42% in 2017. Natural emissions from lightning and soils play a relatively increasing role as anthropogenic emissions decrease. They have interannual variability but no significant 2005-2017 trend. The trend of total US NO_x emissions for 2005-2017 is -3.5% a⁻¹, closely matching the simulated NO₂ column trend.

Trends in the NO_x chemical lifetime over the 2005-2017 period would affect the relationship between trends in NO_x emissions and atmospheric NO₂. Many factors could contribute to a trend in NO_x lifetime (Laughner, 2018; Laughner and Cohen, 2018). We find in GEOS-Chem that the daily tropospheric NO₂ column lifetime over the contiguous US is 8.1 h in 2005 (annual mean) and 7.7 h in 2017. In the model at least, the trend in NO_x lifetime is much weaker than the trend in emissions, so that the trend in concentrations mainly follows that of emissions.

3. Trends of surface observations

Long-term records of surface NO₂ concentrations over the US are available at a large number of monitoring sites from the US EPA Air Quality System (AQS) (<https://www.epa.gov/aqs>; Demerjian et al., 2000) and at additional sites in the Southeast from the Southeastern Aerosol Research and Characterization Study (SEARCH) network (<https://www.dropbox.com/sh/o9hxo4wlo97zpe/AACbm6LetQowrpUgX4vUxnoDa?dl=0>; Hansen et al., 2003; Edgerton et al., 2006). AQS sites are mainly urban and measure NO₂ with a chemiluminescence analyzer equipped with a molybdenum converter, known to have positive interferences from NO_x oxidation products including peroxyacetylnitrate (PAN) and nitric acid (HNO₃; Dunlea et al., 2007; Steinbacher et al., 2007; Reed et al., 2016). SEARCH sites are both urban and rural and use a more specific photolytic converter instrument in which broadband photolysis of NO₂ is followed by chemiluminescence detection of the product, NO, with accuracy better than 10% (Ryerson et al., 2000; Pollack et al., 2010).

The top and middle rows of Figure 2 show annual average trends in daily surface NO₂ concentrations at the 132 AQS sites with continuous yearlong records for 2005-2017 and the 2 rural SEARCH sites (Centreville, AL and Yorkville, GA) with continuous records for 2005-2016 (SEARCH was discontinued in 2017). Also shown for the AQS sites are the values corrected for interferences based on



local GEOS-Chem monthly mean NO₂, alkyl nitrate, PAN, and HNO₃ concentrations and following the correction factor in Lamsal et al. (2008). The AQS data show steadily decreasing trends throughout the 2005-2017 period, consistent with the NEI. The rural SEARCH sites also show a steady decrease but are more noisy (only 2 sites). One would expect the trend in the urban AQS data to be most indicative of the trend in anthropogenic NO_x emissions from fuel combustion. GEOS-Chem underestimates the AQS observations because of the urban nature of the sites, but the model relative decreases agree closely with observations for both the AQS and the SEARCH data. This is in sharp contrast to the post-2009 flattening of the OMI NO₂ data.

Jiang et al. (2018) reported AQS surface NO₂ trends of $-6.6 \pm 1.4\% \text{ a}^{-1}$ for 2005-2009 and $-2.6 \pm 1.5\% \text{ a}^{-1}$ for 2011-2015, indicating a significant weakening of the trend with time. But they used all AQS sites in that analysis including those with incomplete records, which could bias the trend. We find that when using only sites with continuous records, the slope is steeper for the later time period. Specifically, we find the AQS trend to be $-6.6 \pm 1.2\% \text{ a}^{-1}$ for 2005-2009 and $-4.5 \pm 1.7\% \text{ a}^{-1}$ for 2011-2015, indicating that while there is some slowdown in the decline of surface NO₂, it is in fact consistent with the NEI emissions and does not show a post-2009 flattening.

The bottom row of Figure 2 shows observed and simulated trends in nitrate (NO₃⁻) wet deposition fluxes for the 138 National Acid Deposition Program (NADP; <https://nadp.slh.wisc.edu/data/NTN/>) sites with continuous yearlong records for 2005-2017. Nitric acid gas and nitrate aerosol are both efficiently scavenged by precipitation and the lifetime of NO_x is sufficiently short that nitrate wet deposition fluxes should relate to total NO_x emissions. The relationship is not one-to-one because of competition from dry deposition but one would not expect a long-term trend in the wet/dry deposition ratio. GEOS-Chem model values for individual years are corrected for any precipitation bias using the high-resolution PRISM precipitation data (<http://prism.oregonstate.edu>; Di Luzio et al., 2008) as described by Paulot et al. (2014) and Travis et al. (2016). Model values average 17% lower than observed, again because the model may underestimate emissions, but the trends are consistent. The fluxes show a decrease over the 2005-2017 time period (averaging $2.7 \pm 0.3\% \text{ a}^{-1}$ observed, $2.9 \pm 0.3\% \text{ a}^{-1}$ modeled), weaker than for surface NO₂ concentrations. After 2012, there is still a significant decrease in nitrate wet deposition, though it is less than during the earlier time period (averaging $1.3 \pm 0.9\% \text{ a}^{-1}$ observed, $1.7 \pm 0.7\% \text{ a}^{-1}$ modeled).

Nitrate wet deposition is more sensitive to background (non-fuel combustion) influences than NO₂ concentrations because (1) the wet deposition sites are prevalingly rural; (2) precipitation scavenges a deeper column. Indeed, in GEOS-Chem, the mean nitrate wet deposition trend is more consistent with the $-3.5\% \text{ a}^{-1}$ trend of total NO_x emissions (including lightning and soils) than that of emissions from fuel combustion ($-5.9\% \text{ a}^{-1}$).



The relative contribution from background sources to nitrate wet deposition would be expected to increase over time as fuel combustion emissions decrease. In order to quantify this, we performed GEOS-Chem sensitivity simulations for 2005 and 2017 with only background NO_x emissions (shutting off NO_x emissions from US fuel combustion). We find that background contributes 50% of nitrate wet deposition at NADP sites in 2005 but 69% in 2017. This explains the leveling of the nitrate wet deposition trend. In contrast, background only contributes 5% to surface NO₂ at AQS sites in 2005 and 10% in 2017.

Figure 3 shows summertime ozone trends for 2005-2017 as further evidence of a sustained decrease in anthropogenic NO_x emissions. Data are from the AQS and Clean Air Status and Trends Network (CASTNET; <https://www.epa.gov/castnet>) networks. We show records for the 47 CASTNET and 427 AQS sites with continuous summertime records for 2005-2017. The trends are for the 95th percentiles in the maximum daily 8-h average (MDA8) values determined at individual sites and then averaged across all sites for each summer. We excluded high elevation (> 1.5 km) CASTNET sites in the western US because they have different trends driven in part by the larger influence from background ozone (Cooper et al., 2011; Lin et al., 2017; Jaffe et al., 2018). Much of the interannual variability in ozone concentrations in Figure 3 can be explained by surface temperatures, including the 2012 peak in ozone in the observations and captured by GEOS-Chem, which is due to anomalously high temperatures (Fiore et al., 2015; Jia et al., 2016; Lin et al., 2017). Nonetheless, the surface observations do show overall decreases over the 2005-2017 time period. On a national scale, the observations show declines of 1.11±0.08 ppb a⁻¹ (CASTNET) and 1.04±0.03 ppb a⁻¹ (AQS) with no indication of a post-2009 flattening. The GEOS-Chem model shows similar trends. The sustained (post-2009) decrease of ozone pollution over the past decade provides additional evidence of a continued decrease in anthropogenic NO_x emissions.

4. Comparative analysis of trends

Figure 4 combines into a single plot the relative trends since 2005 of NEI NO_x emissions, OMI tropospheric NO₂ columns, surface NO₂ concentrations, and nitrate wet deposition fluxes. Observed surface NO₂ concentrations follow the NEI emissions trend closely, showing consistency with a sustained decline of emissions over the 2005-2017 time period. This behavior is well captured by GEOS-Chem, which confirms the 1:1 relationship expected between surface NO₂ concentrations and NO_x emissions. Nitrate wet deposition observations show a trend consistent with the NEI until 2009 and then a much weaker trend, which we attributed in Section 3 to an increasing contribution of the background. The GEOS-Chem trend for nitrate wet deposition is similarly weaker than for surface NO₂, reflecting the influence of the background, but shows a steeper decrease than observed after 2009. This suggests that GEOS-Chem may underestimate the background contribution.



Tropospheric NO₂ columns show trends remarkably similar to those of nitrate wet deposition fluxes, both in the OMI observations and in GEOS-Chem, suggesting that the post-2009 flattening of the OMI trend is due to background influence rather than to leveling of US NO_x emissions.

5 5. Background contribution to OMI NO₂ trends

We showed in Section 4 that the 2005-2017 trend of OMI NO₂ columns over the US is similar to that of nitrate wet deposition, and much weaker than that of surface NO₂ concentrations, pointing to the importance of background in affecting the NO₂ column and driving the observed post-2009 flattening of the trend. To further examine this effect, we segregated the OMI observations by winter/summer and urban/rural. Urban conditions are defined as the top 10% NO_x-emitting 0.5°×0.625° grid squares in the NEI. We expect that background influences should be relatively higher at rural than urban sites, and higher in summer (lightning, soil, intercontinental transport; Fischer et al., 2014) than in winter. Thus background influences should be minimum in winter urban conditions and maximum under summer rural conditions.

Figure 5 shows the results. OMI NO₂ observations in urban winter show a steady decline at a mean rate of 3.3±0.5% a⁻¹ and do not exhibit the post-2009 flattening seen in the annual mean record for the contiguous US (Figure 1). GEOS-Chem matches closely the OMI NO₂ trend under these conditions. By contrast, the OMI NO₂ observations in rural summer show not only a post-2009 leveling off but also a 2016-2017 uptick. GEOS-Chem has a weaker decreasing trend for summer rural conditions than for urban winter, due to larger background influence, and no significant decrease for the 2009-2017 period. The winter rural and summer urban conditions in Figure 5 show trends intermediate between these two limiting cases. The ability of GEOS-Chem to capture the observed post-2009 weakening of the trend in the summer urban case argues against a seasonal flattening of emissions that would affect summer but not winter.

It thus appears that the post-2009 flattening of OMI NO₂ over the US is due to increasing relative importance of the background, rather than to flattening of US NO_x emissions. Satellite observations of tropospheric NO₂ columns are more sensitive to the free troposphere than to the boundary layer because of atmospheric scattering; the sensitivity increases by a factor of 3 from the surface to the upper troposphere for clear sky and by much more for a partly cloudy atmosphere (Martin et al., 2002). For the OMI NO₂ data set used here the sensitivity increases on average by over a factor of 4 from the surface to the upper troposphere, as given by the scattering weights (Krotkov et al., 2017). The AMF is intended to correct for this effect but relies on an assumed model vertical distribution of NO₂ that may not correctly account for the changing ratio between the free troposphere and the boundary layer as anthropogenic NO_x emissions decrease.

There is indeed evidence that free tropospheric NO₂ makes a large contribution to OMI NO₂ columns and that models underestimate this contribution. Measurements of NO₂ vertical profiles during the



SEAC⁴RS aircraft campaign over the Southeast US in August-September 2013 showed a median concentration of 300 ppt near the surface dropping to a 50 ppt background in the free troposphere at 2-10 km and rising back to 130 ppt at the 12 km aircraft ceiling (Silvern et al., 2018). By applying OMI scattering weights to this median vertical profile, most representative of a rural profile, Travis et al. (2016) found that the boundary layer below 1.5 km contributed only 19-28% of the OMI NO₂ tropospheric column. A GEOS-Chem simulation of the SEAC⁴RS conditions matched the observed 50 ppt background (mostly from lightning) but could not reproduce the enhancement above 10 km (Travis et al., 2016; Silvern et al., 2018). The GMI model used to compute AMFs in the NASA OMI NO₂ retrievals also has little NO₂ in the upper troposphere (Lamsal et al., 2014). Measurements of NO₂ in the upper troposphere are prone to positive interferences because of inlet decomposition of labile reservoirs (Reed et al., 2016) but the measurements in SEAC⁴RS were designed to minimize and correct for these interferences (Thornton et al., 2000; Day et al., 2002; Wooldridge et al., 2010; Nault et al., 2015).

Choi et al. (2014) and Belmonte Rivas et al. (2015) used the so-called cloud-slicing method to isolate the upper tropospheric contribution to the OMI NO₂ observations by comparing neighboring cloudy scenes with cloud tops at different altitudes. They report in this manner partial NO₂ columns at 6-10 km altitude. Marais et al. (2018) evaluated these data in comparison with aircraft observations and found large uncertainties, but concluded that GEOS-Chem underestimates NO₂ at 6-10 km over North America by 20-30 ppt in winter with no significant bias in summer. The good agreement in summer is consistent with the comparison to SEAC⁴RS observations, which shows however a low model bias above 10 km.

We conducted a sensitivity test adding 50 ppt of background NO₂ to the GEOS-Chem vertical profiles above 5 km altitude in winter and above 10 km in summer, up to the local tropopause. The resulting normalized vertical profiles (shape factors) were convolved with the vertical distribution of sensitivities (scattering weights) provided by the NASA retrieval to re-compute the AMFs. The implications for the model trends are shown in Figure 5 as the blue lines. The effect is large for winter rural conditions, where the added free tropospheric background is particularly important and largely reconciles the model trend with the OMI observations. It is much less in summer, where the addition is only above 10 km and there is already substantial background NO₂ present. The discrepancy between model and observations in summer is though largely driven by the uptick in the summer rural observations for 2016-2017.

It is possible that additional background NO₂ missing from the model could be present in the tropopause region and lower stratosphere in summer. The deepest convection in summertime over the US can reach 17 km in the lowermost stratosphere (Randel et al., 2012; Huntrieser et al., 2016b; Anderson et al., 2017; Herman et al., 2017; Smith et al., 2017). Such deep convective injection could conceivably deliver substantial lightning NO₂ above the tropopause. Although delivered above the tropopause, this NO₂



would be counted as tropospheric in retrievals because it would represent an enhancement above background NO₂ columns in the stratospheric separation. It could have a particularly important effect on the AMF by being delivered above clouds. There is suggestive evidence that convective injection into the lowermost stratosphere over the US may have increased during the 2004-2013 period (Cooney et al., 2018), which could further affect the OMI NO₂ column trend, though a conclusive trend is highly uncertain due to changes in the sensor network over time. High NO_x mixing ratios in the lowermost stratosphere were observed over the central and Southeast US during the DC3 aircraft campaign in May-June 2012 and attributed to lightning (Huntrieser et al., 2016a; Huntrieser et al., 2016b), and higher lightning flash rates have been observed during tropopause-penetrating above-anvil cirrus plumes (Bedka et al., 2018). While tropopause heights in the GEOS meteorological data driving GEOS-Chem agree well with SEAC⁴RS observations of water vapor and ozone (Kuang et al., 2017; Smith et al., 2017), models in general do not properly capture the observed convective injections into the lowermost stratosphere (Smith et al., 2017; Anderson et al., 2019).

6. Conclusions

US emissions of nitrogen oxides (NO_x ≡ NO + NO₂) from fuel combustion have been steadily declining over 2005-2017 at a mean rate of 5.9% a⁻¹ according to the National Emission Inventory (NEI) of the US EPA. Tropospheric NO₂ columns over the US observed by OMI on board the Aura satellite show instead a leveling off after 2009, leading to the suggestion that the NEI emission trend is in error and that related air quality gains have halted. Here we re-examined this issue by using trends in surface observations together with a 2005-2017 GEOS-Chem chemical transport model simulation to better understand the relationship between satellite NO₂ observations and NO_x emissions and their trends.

We started by comparing the 2005-2017 GEOS-Chem simulation driven by NEI emission trends to the OMI observations. The model shows a sustained decrease in the tropospheric NO₂ column at a mean rate of 3.3±0.1% a⁻¹ over the period. The rate is less than the NEI trend because of natural NO_x emissions (mainly from lightning and soils) that account in GEOS-Chem for 58% of total NO_x emissions over the US by 2017. Nevertheless, the GEOS-Chem simulation cannot capture the post-2009 flattening in the OMI observations.

We then examined 2005-2017 US trends in surface observations of NO₂ concentrations and nitrate wet deposition fluxes from surface networks (AQS, SEARCH, NADP). Surface NO₂ concentrations measured by the AQS (urban) and SEARCH (rural) surface networks show a steady decline over the 2005-2017 time period that closely matches the NEI emissions trend. This tight relationship between trends in NO₂ surface concentrations and NO_x emissions is confirmed in GEOS-Chem. Nitrate wet deposition shows a much weaker 2005-2017 trend than surface NO₂ and NEI emissions, both in the observations and the



model, reflecting a large and increasing relative contribution from background sources (69% in the model in 2017) as anthropogenic emissions decrease. Surface ozone concentrations from the CASTNET and AQS networks show sustained 2005-2017 decreases, consistent with the model; such sustained decreases would be hard to reconcile with a flattening of NO_x emissions.

5 Bringing together these different observed trends, we see two different patterns: (1) a steady 2005-2017 decrease in surface NO₂ that confirms the steady decrease in NO_x emissions reported by the EPA NEI; (2) a weaker trend and post-2009 flattening of OMI NO₂ and nitrate wet deposition that reflects a growing influence from the background, rather than an error in NEI NO_x emissions.

10 We confirmed the importance of background NO₂ in driving the post-2009 flattening of OMI NO₂ trends over the US by segregating the OMI observations into urban/rural and winter/summer. There is a steady 2005-2017 decrease and no post-2009 flattening in the urban winter data where background influence is lowest. By contrast, there is no significant 2005-2017 trend in rural summer (where background influence is highest). The failure of GEOS-Chem to reproduce the observed post-2009 flattening then points to a model underestimate of the NO₂ background. Cloud-sliced OMI NO₂ data
15 indicate a GEOS-Chem underestimate of the upper tropospheric background in winter, which could reconcile the model with the flattening observed in rural winter. Convective injections of lightning NO₂ above the tropopause might add to the NO₂ background in summer.

20 We conclude that the sustained 2005-2017 decrease in US NO_x emissions reported by the EPA is correct, and that better understanding of the free tropospheric background is needed to interpret satellite observations of NO₂ tropospheric columns in terms of their implications for NO_x emissions and trends. The concern is minor in highly polluted areas where NO_x emissions are sufficiently high to dominate over the background influence. In the US, however, NO_x emissions have now decreased to the point that NO₂ columns over non-urban areas are mostly contributed by the free tropospheric background. Accounting for this poorly understood background will become increasingly important as NO_x emissions continue to
25 decrease in the developed world, and in regions in the tropics that are undergoing rapid development and have intense lightning.

Appendix: the GEOS-Chem model

30 We conducted a 13-year simulation (2005-2017) with the GEOS-Chem global 3D chemical transport model version 11-02c (<http://www.geos-chem.org>) using NASA MERRA-2 assimilated meteorological data (Gelaro et al., 2017). We use the nested North America version of GEOS-Chem at the native MERRA-2 0.5°×0.625° horizontal resolution over North America and adjacent oceans (140-40°W, 10-70°N) with dynamic boundary conditions from a global simulation with 4°×5° horizontal resolution. The simulation includes detailed NO_x-hydrocarbon-aerosol chemistry as described in Travis et al. (2016),



Fisher et al. (2016) and Marais et al. (2016). US anthropogenic emissions are distributed spatially following the NEI2011 inventory (EPA, 2018) as described by Travis et al. (2016). NEI2011 is scaled for individual years using national annual totals (EPA, 2018), and we decrease non-EGU NO_x emissions by 60% as in Travis et al. (2016) for all years. Open fire emissions are from the daily Quick Fire Emissions Database (QFED; Darmenov and da Silva, 2013) with diurnal variability from the Western Regional Air Partnership (Air Sciences, 2005). Soil NO_x emissions, including emissions from fertilizer application, are computed according to Hudman et al. (2012), with a 50% reduction in the Midwestern US for summertime based on a previous comparison with OMI NO₂ observations (Vinken et al., 2014). Lightning NO_x emissions are described by Murray et al. (2012) with a horizontal distribution matching climatological observations of lightning flashes, interannual variability driven by MERRA-2 convection, and most of the release at the top of convective updrafts (Ott et al., 2010). The NO_x yield per flash is 260 mol to the south of 35°N and 500 mol to the north (Hudman et al., 2007; Huntrieser et al., 2008; 2009; Ott et al., 2010; Travis et al., 2016).

The GEOS-Chem simulation of NO_x and related species over the US has been evaluated in a number of papers including Zhang et al. (2012), Ellis et al. (2013), and Lee et al. (2016) for nitrogen deposition, Travis et al. (2016) for NO_x concentrations over the Southeast US during the SEAC⁴RS campaign, and Fisher et al. (2016) for organic nitrates during that same campaign. These evaluations find that the model is overall successful with no indication of systematic bias.

Data availability.

- OMI NO₂ observations are available from <https://mirador.gsfc.nasa.gov/>.
AQS NO₂ and ozone observations are available from <https://www.epa.gov/aqs>.
SEARCH NO₂ observations are available from <https://www.dropbox.com/sh/o9hxoa4wlo97zpe/AACbm6LetQowrpUgX4vUxnoDa?dl=0>.
NADP nitrate wet deposition observations are available from <https://nadp.slh.wisc.edu/data/NTN/>.
CASNET ozone observations are available from <https://www.epa.gov/castnet>.
GEOS-Chem output from this work is available upon request.

Author contributions. DJJ, LJM, and RFS designed the study. RFS and MPS conducted model simulations. RFS analyzed satellite, surface, and model data. KRT contributed NEI emissions in GEOS-Chem and supported data analysis. LJM, EAM, RCC, and JLL helped with scientific interpretation and discussion. SC, JJ, and LNL provided OMI data and supporting guidance. RFS and DJJ wrote the manuscript and all authors provided input on the paper for revision before submission.

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



Acknowledgements. This publication was made possible by USEPA grant 83587201. Its contents are solely the responsibility of the grantee and do not necessarily represent the official views of the USEPA. Further, USEPA does not endorse the purchase of any commercial products or services mentioned in the publication. DJJ was supported by the NASA Earth Science Division.

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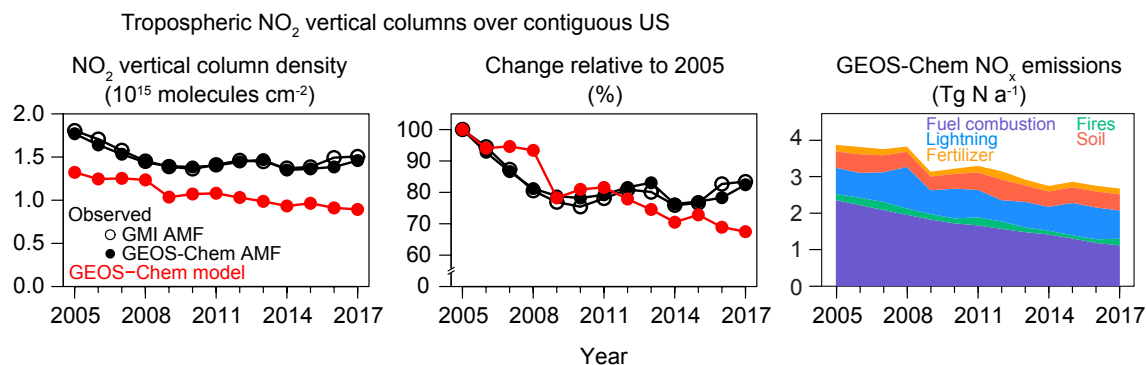


Figure 1. 2005-2017 trends in tropospheric NO₂ columns and NO_x emissions over the contiguous US. The left panel shows OMI observations averaged over the contiguous US and the corresponding GEOS-Chem simulation. The OMI observations are from the NASA retrieval (Krotkov et al., 2017) with air mass factors (AMFs) computed from the original GMI model NO₂ vertical profiles or GEOS-Chem vertical profiles. The middle panel shows percent changes in tropospheric NO₂ columns relative to 2005. The right panel shows 2005-2017 annual total NO_x emissions from the GEOS-Chem model, including anthropogenic fuel combustion emissions from the National Emission Inventory (NEI) with a 60% decrease for non-EGU sources (see text and Appendix).

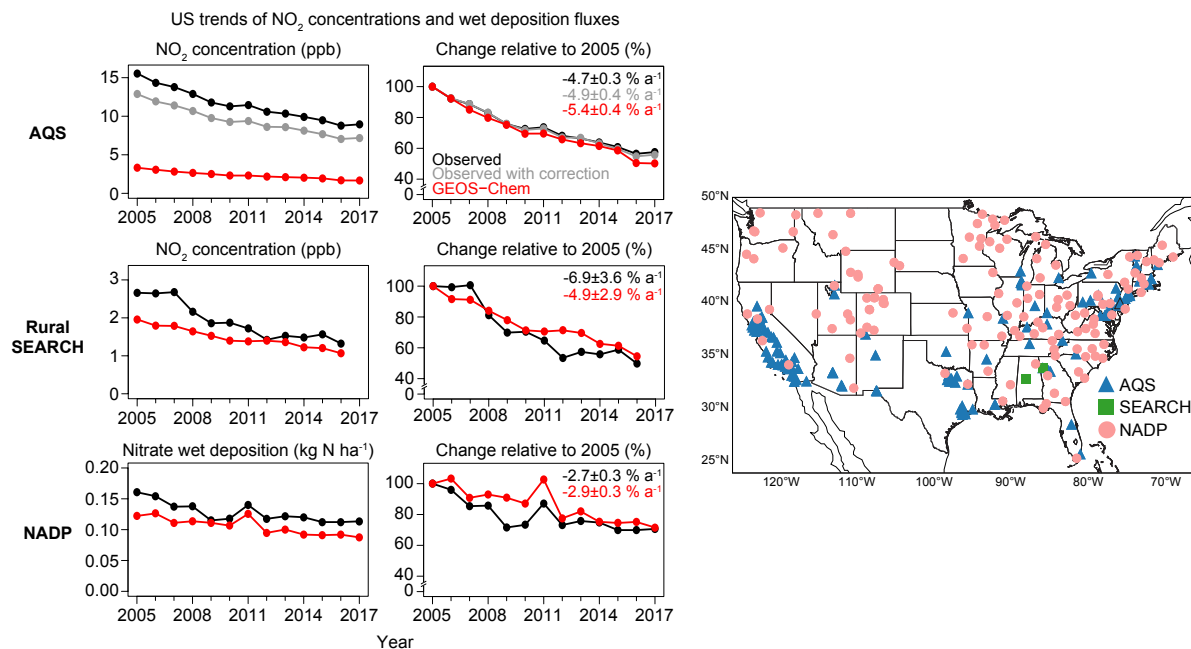
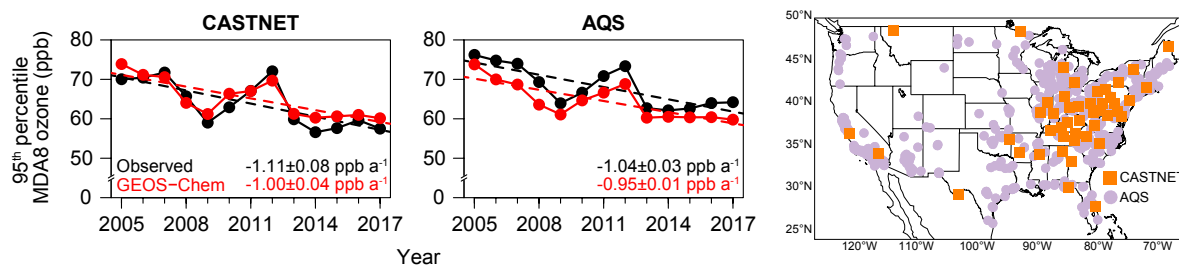


Figure 2. 2005-2017 trends in annual mean surface NO_2 concentrations and nitrate wet deposition fluxes over the contiguous US. Observations are compared to GEOS-Chem model values sampled at the corresponding sites. The map at the right shows the observation sites for the AQS, SEARCH, and NADP measurements networks with continuous annual records for 2005-2017 (2016 for SEARCH). The top row shows surface NO_2 observed at AQS sites (mainly urban). The measurements are affected by positive interference from NO_x oxidation products and the gray line shows the data corrected as in Lamsal et al. (2008). The middle row shows surface NO_2 at the 2 rural SEARCH sites in the Southeast US. The bottom row shows nitrate wet deposition fluxes at NADP sites. The right panels show trends relative to 2005 values and the mean \pm standard deviation percent change per year is shown inset. All trends shown are statistically significant.



5 **Figure 3.** Summertime surface ozone trends for 2005-2017 at the CASTNET and AQS networks in the contiguous US. The trends are for the 95th percentile of the maximum daily 8-hour average (MDA8) ozone concentrations computed for individual sites (shown in the map on the right) and then averaged over all sites from the network. High elevation (> 1.5 km) CASTNET sites in the western US are excluded. The slope and standard deviation of the linear regressions are shown inset, and all trends shown are statistically significant.

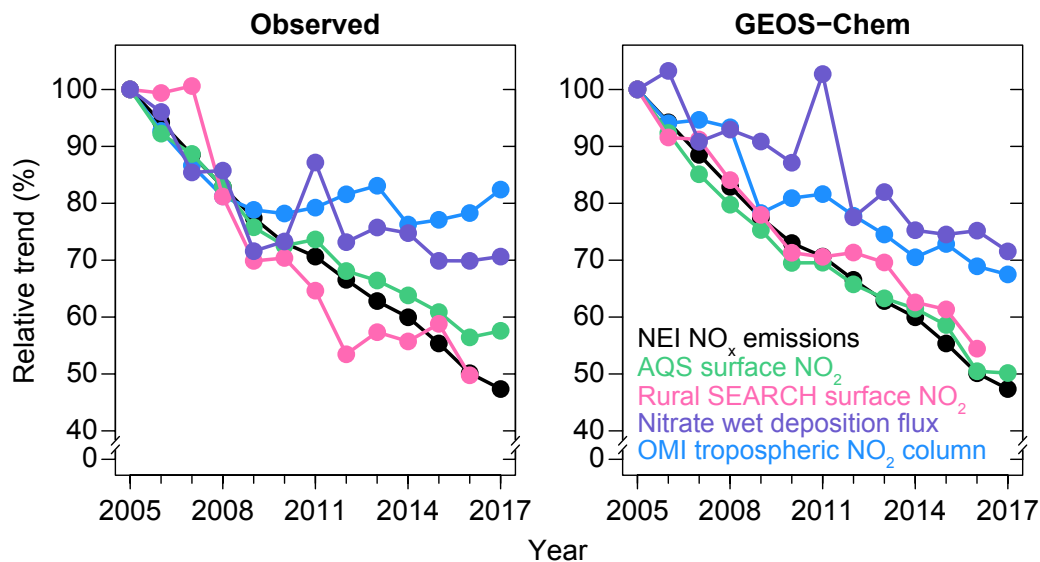


Figure 4. Relative trends since 2005 of NEI NO_x emissions and relevant atmospheric quantities averaged over the contiguous US. The left panel shows observations and the right panel shows the GEOS-Chem simulation. NEI NO_x emissions are the same in both panels. SEARCH data for 2017 are unavailable.

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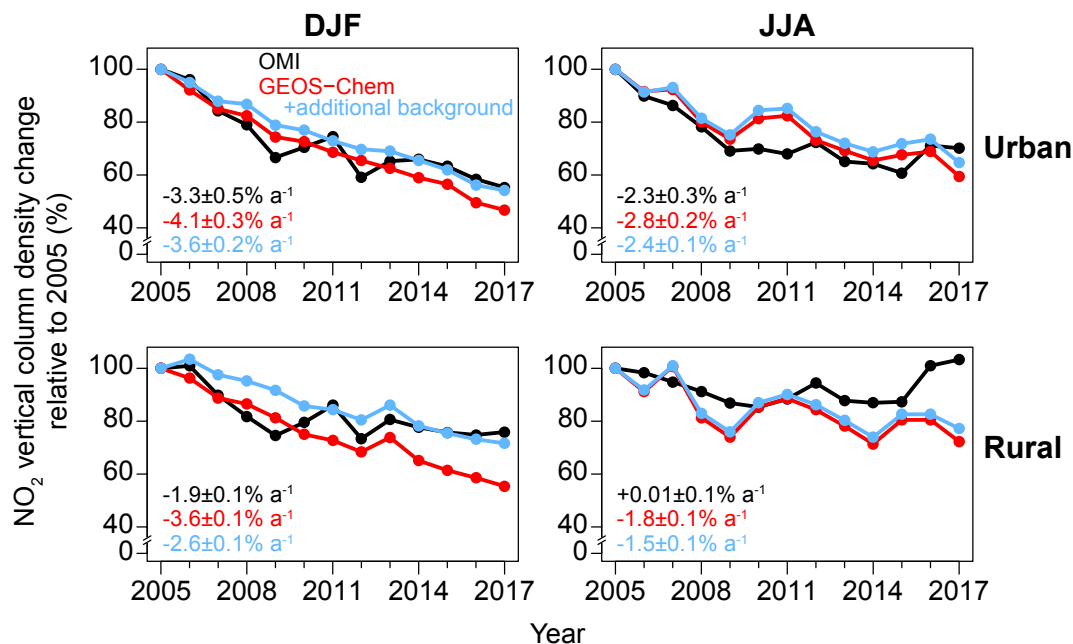


Figure 5. OMI tropospheric NO₂ column trends over the contiguous US relative to 2005, separated by urban/rural and summer (JJA)/winter (DJF). OMI observations are shown in black, the standard GEOS-Chem model simulation with EPA National Emission Inventory (NEI) trends (EPA, 2018) is in red, and the GEOS-Chem sensitivity simulation with additional background (50 ppt above 5 km in winter and above 10 km in summer, up to the local tropopause) is shown in blue. Slopes and standard deviation of the linear regressions are shown inset. Urban conditions are defined as the top 10% NO_x-emitting 0.5°×0.625° grid squares in the NEI.