

### NASA Public Access Author manuscript

Atmos Chem Phys. Author manuscript; available in PMC 2018 April 02.

Published in final edited form as:

Atmos Chem Phys. 2016; 16(21): 13561–13577. doi:10.5194/acp-16-13561-2016.

# Why do Models Overestimate Surface Ozone in the Southeastern United States?

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#### Abstract

Ozone pollution in the Southeast US involves complex chemistry driven by emissions of anthropogenic nitrogen oxide radicals (NO<sub>x</sub>  $\equiv$  NO + NO<sub>2</sub>) and biogenic isoprene. Model estimates of surface ozone concentrations tend to be biased high in the region and this is of concern for designing effective emission control strategies to meet air quality standards. We use detailed chemical observations from the SEAC<sup>4</sup>RS aircraft campaign in August and September 2013, interpreted with the GEOS-Chem chemical transport model at 0.25°×0.3125° horizontal resolution, to better understand the factors controlling surface ozone in the Southeast US. We find that the National Emission Inventory (NEI) for NO<sub>x</sub> from the US Environmental Protection Agency (EPA) is too high. This finding is based on SEAC<sup>4</sup>RS observations of NO<sub>x</sub> and its oxidation products, surface network observations of nitrate wet deposition fluxes, and OMI satellite observations of tropospheric NO<sub>2</sub> columns. Our results indicate that NEI NO<sub>x</sub> emissions from mobile and industrial sources must be reduced by 30-60%, dependent on the assumption of the contribution by soil  $NO_x$  emissions. Upper tropospheric  $NO_2$  from lightning makes a large contribution to satellite observations of tropospheric NO2 that must be accounted for when using these data to estimate surface  $NO_x$  emissions. We find that only half of isoprene oxidation proceeds by the high-NO<sub>x</sub> pathway to produce ozone; this fraction is only moderately sensitive to changes in NO<sub>x</sub> emissions because isoprene and NO<sub>x</sub> emissions are spatially segregated. GEOS-Chem with reduced  $NO_x$  emissions provides an unbiased simulation of ozone observations from the aircraft, and reproduces the observed ozone production efficiency in the boundary layer as derived from a regression of ozone and NO<sub>x</sub> oxidation products. However, the model is still biased high by  $8\pm13$  ppb relative to observed surface ozone in the Southeast US. Ozonesondes launched during midday hours show a 7 ppb ozone decrease from 1.5 km to the surface that GEOS-Chem does not capture. This bias may reflect a combination of excessive vertical mixing and net ozone production in the model boundary layer.

#### 1 Introduction

Ozone in surface air is harmful to human health and vegetation. Ozone is produced when volatile organic compounds (VOCs) and carbon monoxide (CO) are photochemically oxidized in the presence of nitrogen oxide radicals ( $NO_x \equiv NO+NO_2$ ). The mechanism for producing ozone is complicated, involving hundreds of chemical species interacting with transport on all scales. In October 2015, the US Environmental Protection Agency (EPA) set a new National Ambient Air Quality Standard (NAAQS) for surface ozone as a maximum daily 8-h average (MDA8) of 0.070 ppm not to be exceeded more than three times per year. This is the latest in a succession of gradual tightening of the NAAQS from 0.12 ppm (1-h average) to 0.08 ppm in 1997, and to 0.075 ppm in 2008, responding to accumulating evidence that ozone is detrimental to public health even at low concentrations (EPA, 2013). Chemical transport models (CTMs) tend to significantly overestimate surface ozone in the Southeast US (Lin et al., 2008; Fiore et al., 2009; Reidmiller et al., 2009; Brown-Steiner et

al., 2015; Canty et al., 2015), and this is an issue for the design of pollution control strategies (McDonald-Buller et al., 2011). Here we examine the causes of this overestimate by using the GEOS-Chem CTM to simulate NASA SEAC<sup>4</sup>RS aircraft observations of ozone and its precursors over the region in August–September 2013 (Toon et al., 2016), together with additional observations from surface networks and satellite.

A number of explanations have been proposed for the ozone model overestimates in the Southeast US. Fiore et al. (2003) suggested excessive modeled ozone inflow from the Gulf of Mexico. Lin et al. (2008) proposed that the ozone dry deposition velocity could be underestimated. McDonald-Buller et al. (2011) pointed out the potential role of halogen chemistry as a sink of ozone. Isoprene emitted from vegetation is the principal VOC precursor of ozone in the Southeast US in summer, and Fiore et al. (2005) found that uncertainties in isoprene emissions and in the loss of NO<sub>x</sub> from formation of isoprene nitrates could also affect the ozone simulation. Horowitz et al. (2007) found a large sensitivity of ozone to the fate of isoprene nitrates and the extent to which they release NO<sub>x</sub> when oxidized. Squire et al. (2015) found that the choice of isoprene oxidation mechanism can alter both the sign and magnitude of the response of ozone to isoprene and NO<sub>x</sub> emissions.

The SEAC<sup>4</sup>RS aircraft campaign in August–September 2013 provides an outstanding opportunity to improve our understanding of ozone chemistry over the Southeast US. The SEAC<sup>4</sup>RS DC-8 aircraft hosted an unprecedented chemical payload including isoprene and its oxidation products, NO<sub>x</sub> and its oxidation products, and ozone. The flights featured extensive boundary layer mapping of the Southeast as well as vertical profiling to the free troposphere (Toon et al., 2016). We use the GEOS-Chem global CTM with high horizontal resolution over North America (0.25°×0.3125°) to simulate and interpret the SEAC<sup>4</sup>RS observations. We integrate into our analysis additional Southeast US observations during the summer of 2013 including from the NOMADSS aircraft campaign, the SOAS surface site in Alabama, the SEACIONS ozonesonde network, the CASTNET ozone network, the NADP nitrate wet deposition network, and NO2 satellite data from the OMI instrument. Several companion papers apply GEOS-Chem to simulate other aspects of SEAC<sup>4</sup>RS and concurrent data for the Southeast US including aerosol sources and optical depth (Kim et al., 2015), isoprene organic aerosol (Marais et al., 2016), organic nitrates (Fisher et al., 2016), formaldehyde and its relation to satellite observations (Zhu et al., 2016), and sensitivity to model resolution (Yu et al., 2016).

#### 2 GEOS-Chem Model Description

We use the GEOS-Chem global 3-D CTM (Bey et al., 2001) in version 9.02 (www.geoschem.org) with modifications described below. GEOS-Chem is driven with assimilated meteorological data from the Goddard Earth Observing System (GEOS-5.11.0) of the NASA Global Modeling and Assimilation Office (GMAO). The GEOS-5.11.0 data have a native horizontal resolution of  $0.25^{\circ}$  latitude by  $0.3125^{\circ}$  longitude and a temporal resolution of 3 h (1 h for surface variables and mixing depths). We use a nested version of GEOS-Chem (Chen et al., 2009) with native  $0.25^{\circ} \times 0.3125^{\circ}$  horizontal resolution over North America and adjacent oceans  $(130^{\circ} - 60^{\circ}W, 9.75^{\circ} - 60^{\circ}N)$  and dynamic boundary

conditions from a global simulation with  $4^{\circ} \times 5^{\circ}$  horizontal resolution. Turbulent boundary layer mixing follows a non-local parameterization based on K-theory (Holtslag and Boville, 1993) implemented in GEOS-Chem by Lin and McElroy (2010). Daytime mixing depths are reduced by 40% from the GEOS-5.11.0 data as described by Kim et al. (2015) and Zhu et al. (2016) to match aircraft lidar observations. The GEOS-Chem nested model simulation is conducted for August–September 2013, following six months of initialization at  $4^{\circ} \times 5^{\circ}$ resolution.

#### 2.1 Chemistry

The chemical mechanism in GEOS-Chem version 9.02 is described by Mao et al, (2010, 2013). We modified aerosol reactive uptake of HO<sub>2</sub> to produce  $H_2O_2$  instead of  $H_2O$  in order to better match  $H_2O_2$  observations in SEAC<sup>4</sup>RS. We also include a number of updates to isoprene chemistry, listed comprehensively in the Supplementary Material (Tables S1 and S2) and describe here more specifically for the low-NO<sub>x</sub> pathways. Companion papers describe the isoprene chemistry updates relevant to isoprene nitrates (Fisher et al., 2016) and organic aerosol formation (Marais et al., 2016). Oxidation of biogenic monoterpenes also is added to the GEOS-Chem mechanism (Fisher et al., 2016) but does not significantly affect ozone.

A critical issue in isoprene chemistry is the fate of the isoprene peroxy radicals (ISOPO<sub>2</sub>) produced from the oxidation of isoprene by OH (the dominant isoprene sink). When NO<sub>x</sub> is sufficiently high, ISOPO<sub>2</sub> reacts mainly with NO to produce ozone (high-NO<sub>x</sub> pathway). At lower NO<sub>x</sub> levels, ISOPO<sub>2</sub> may instead react with HO<sub>2</sub> or other organic peroxy radicals, or isomerize, in which case ozone is not produced (low-NO<sub>x</sub> pathways). Here we increase the molar yield of isoprene hydroperoxide (ISOPOOH) from the ISOPO<sub>2</sub> + HO<sub>2</sub> reaction to 94% based on observations of the minor channels of this reaction (Liu et al., 2013). Oxidation of ISOPOOH by OH produces isoprene epoxides (IEPOX) that subsequently react with OH or are taken up by aerosol (Paulot et al., 2009b; Marais et al., 2016). We use updated rates and products from Bates et al. (2014) for the reaction of IEPOX with OH.

ISOPO<sub>2</sub> isomerization produces hydroperoxyaldehydes (HPALDs) (Peeters et al., 2009; Crounse et al., 2011; Wolfe et al., 2012), and we explicitly include this in the GEOS-Chem mechanism. HPALDs go on to react with OH or photolyze at roughly equal rates over the Southeast US. We use the HPALD+OH reaction rate constant from Wolfe et al. (2012) and the products of the reaction from Squire et al. (2015). The HPALD photolysis rate is calculated using the absorption cross-section of MACR, with a quantum yield of 1, as recommended by Peeters and Müller (2010). The photolysis products are taken from Stavrakou et al. (2010). Self-reaction of ISOPO<sub>2</sub> is updated following Xie et al. (2013).

A number of studies have suggested that conversion of NO<sub>2</sub> to nitrous acid (HONO) by gasphase or aerosol-phase pathways could provide a source of HO<sub>x</sub> radicals following HONO photolysis (Li et al., 2014; Zhou et al., 2014). This mechanism would also provide a catalytic sink for ozone when NO<sub>2</sub> is produced by the NO + ozone reaction, viz.,

$$NO+O_3 \rightarrow NO_2+O_2$$
 (1)

 $NO_2 \rightarrow HONO$  (by various pathways) (2)

 $HONO+hv \rightarrow NO + OH$  (3)

Observations of HONO from the NOMADSS campaign (https://www2.acom.ucar.edu/ campaigns/nomadss) indicate a mean daytime HONO concentration of 10 ppt in the Southeast US boundary layer (Zhou et al., 2014), whereas the standard gas-phase mechanism in GEOS-Chem version 9.02 yields less than 1 ppt. We add the pathway proposed by Li et al. (2014), in which HONO is produced by the reaction of the HO<sub>2</sub>•H<sub>2</sub>O complex with NO<sub>2</sub>, but with a slower rate constant ( $k_{HO2•H2O+NO2} = 2 \times 10^{-12}$  cm<sup>3</sup> molecule  $^{-1}$  s<sup>-1</sup>) to match the observed ~10 ppt daytime HONO in the Southeast US boundary layer. The resulting impact on boundary layer ozone concentrations is negligible.

#### 2.2 Dry Deposition

The GEOS-Chem dry deposition scheme uses a resistance-in-series model based on Wesely (1989) as implemented by Wang et al. (1998). Underestimate of dry deposition has been invoked as a cause for model overestimates of ozone in the eastern US (Lin et al., 2008; Walker, 2014). Daytime ozone deposition is determined principally by stomatal uptake. Here, we decrease the stomatal resistance from 200 s m<sup>-1</sup> for both coniferous and deciduous forests (Wesely, 1989) by 20% to match summertime measurements of the ozone dry deposition velocity for a pine forest in North Carolina (Finkelstein et al., 2000) and for the Ozarks oak forest in southeast Missouri (Wolfe et al., 2015), both averaging 0.8 cm s<sup>-1</sup> in the daytime. The mean ozone deposition velocity in GEOS-Chem along the SEAC<sup>4</sup>RS boundary layer flight tracks in the Southeast US averages0.7±0.3 cm s<sup>-1</sup> for the daytime (9–16 local) surface layer. Deposition is suppressed in the model at night due to both stomatal closure and near-surface stratification, consistent with the Finkelstein et al. (2000) observations.

Deposition flux measurements for isoprene oxidation products at the Alabama SOAS site (http://soas2013.rutgers.edu) indicate higher deposition velocities than simulated by the standard GEOS-Chem model (Nguyen et al., 2015). The diurnal cycle of dry deposition in GEOS-Chem compares well with the observations from SOAS (Nguyen et al., 2015). As an expedient, Nguyen et al. (2015) scaled the Henry's law coefficients for these species in GEOS-Chem to match their observed deposition velocities and we follow their approach here. Other important depositing species include HNO<sub>3</sub> and peroxyacetyl nitrate (PAN), with mean deposition velocities along the SEAC<sup>4</sup>RS Southeast US flight tracks in daytime of  $3.9 \text{ cm s}^{-1}$  and  $0.6 \text{ cm s}^{-1}$ , respectively.

#### 2.3 Emissions

We use hourly US anthropogenic emissions from the 2011 EPA national emissions inventory (NEI11v1) at a horizontal resolution of  $0.1^{\circ} \times 0.1^{\circ}$  and adjusted to 2013 using national

annual scaling factors (EPA, 2015). The scaling factor for NO<sub>x</sub> emissions is 0.89, for a 2013 US NEI total of 3.5 Tg N a<sup>-1</sup>. Further information on the use of the NEI11v1 in GEOS-Chem can be found here: http://wiki.seas.harvard.edu/geos-chem/index.php/EPA/ NEI11\_North\_American\_emissions/. Soil NO<sub>x</sub> emissions, including emissions from fertilizer application, are computed according to Hudman et al. (2012), with a 50% reduction in the Midwest US based on a previous comparison with OMI NO<sub>2</sub> observations (Vinken et al., 2014). Open fire emissions are from the daily Quick Fire Emissions Database (QFED) (Darmenov and da Silva, 2014) with diurnal variability from the Western Regional Air Partnership (Air Sciences, 2005). We emit 40% of open fire NO<sub>x</sub> emissions as PAN and 20% as HNO<sub>3</sub> to account for fast oxidation taking place in the fresh plume (Alvarado et al., 2010). Following Fischer et al. (2014), we inject 35% of fire emissions above the boundary layer, evenly between 3.5 and 5.5 km altitude. Lightning is an additional source of NO<sub>x</sub> but is mainly released in the upper troposphere, as described below.

Initial implementation of the above inventory in GEOS-Chem resulted in an 60-70% overestimate of NO<sub>x</sub> and HNO<sub>3</sub> measured from the SEAC<sup>4</sup>RS DC-8 aircraft, and a 70% overestimate of nitrate ( $NO_3^-$ ) wet deposition fluxes measured by the National Acid Deposition Program (NADP) across the Southeast US. Correcting this bias required a ~40% decrease in surface  $NO_x$  emissions. Assuming strongly reduced soil and fertilizer  $NO_x$ emissions (18% of total NO<sub>x</sub> emissions in the Southeast) and open fires (2%), also considering the large uncertainty in these emissions, would be insufficient to correct this bias. Emissions from power plant stacks are directly measured but account for only 12% of NEI NO<sub>x</sub> emissions on an annual basis (EPA, 2015). Several local studies in recent years have found that NEI NOx emissions for mobile sources may be too high by a factor of two or more (Castellanos et al, 2011; Fujita et al., 2012; Brioude et al., 2013; Anderson et al., 2014). We can achieve the required 40% decrease in total  $NO_x$  emissions by reducing NEI emissions from mobile and industrial sources (all sources except power plants) by 60%, or alternatively by reducing these sources by 30% and zeroing out soil and fertilizer  $NO_x$ emissions. Since it is apparent that there is some minimum contribution by soil  $NO_x$ emissions we assessed the impact of the approach of reducing the NEI emissions by 60%. The spatial overlap between anthropogenic and soil NO<sub>x</sub> emissions is such that we cannot readily arbitrate between these two scenarios. Comparisons with observations will be presented in the next Section.

We constrain the lightning  $NO_x$  source with satellite data as described by Murray et al. (2012). Lightning  $NO_x$  is mainly released at the top of convective updrafts following Ott et al. (2010). The standard GEOS-Chem model uses higher  $NO_x$  yields for mid-latitudes lightning (500 mol/flash) than for tropical (260 mol/flash) (Huntrieser et al., 2007, 2008; Hudman et al., 2007; Ott et al., 2010) with a fairly arbitrary boundary between the two at 23°N in North America and 35°N in Eurasia. Zhang et al. (2014) previously found that this leads GEOS-Chem to overestimate background ozone in the southwestern US and we find the same here for the eastern US and the Gulf of Mexico. We treat here all lightning in the 35°S–35°N band as tropical and thus remove the distinction between North America and Eurasia.

Figure 1 gives the resulting surface  $NO_x$  emissions for the Southeast US for August and September 2013. With the original NEI inventory, fuel combustion accounted for 81% of total surface  $NO_x$  emissions in the Southeast US (not including lightning). If the required reduction of non-power plant NEI emissions is 60%, the contribution from fuel combustion would be 68%.

Biogenic VOC emissions are from MEGAN v2.1, including isoprene, acetone, acetaldehyde, monoterpenes, and >C2 alkenes. We reduce MEGAN v2.1 isoprene emissions by 15% to better match SEAC<sup>4</sup>RS observations of isoprene fluxes from the Ozarks (Wolfe et al., 2015) and observed formaldehyde (Zhu et al., 2016). Yu et al. (2016) show the resulting isoprene emissions for the SEAC<sup>4</sup>RS period.

#### 3 Overestimate of NO<sub>x</sub> emissions in the EPA NEI inventory

Figure 2 shows simulated and observed median vertical distributions of  $NO_x$ , total inorganic nitrate (gas-phase HNO<sub>3</sub>+aerosol NO<sub>3</sub><sup>-</sup>), and ozone concentrations along the SEAC<sup>4</sup>RS flight tracks over the Southeast US. Here and elsewhere the data exclude urban plumes as diagnosed by  $[NO_2] > 4$  ppb, open fire plumes as diagnosed by  $[CH_3CN] > 200$  ppt, and stratospheric air as diagnosed by  $[O_3]/[CO] > 1.25$  mol mol<sup>-1</sup>. These filters exclude <1%, 7%, and 6% of the data respectively. We would not expect the model to be able to capture these features even at native resolution (Yu et al., 2016).

Model results in Figure 2 are shown both with the original  $NO_x$  emissions (dashed line) and with non-power plant NEI fuel emissions decreased by 60% (solid line). Decreasing emissions corrects the model bias for  $NO_x$  and also largely corrects the bias for inorganic nitrate. Boundary layer ozone is overestimated by 12 ppb with the original  $NO_x$  emissions but this bias disappears after decreasing the  $NO_x$  emissions. Results are very similar if we decrease the non-power plant NEI fuel emissions by only 30% and zero out soil and fertilizer emissions. Thus the required decrease of  $NO_x$  emissions may involve an overestimate of both anthropogenic and soil emissions.

Further support for decreasing NO<sub>x</sub> emissions is offered by observed nitrate wet deposition fluxes from the NADP network (NADP, 2007). Figure 3 compares simulated and observed fluxes for the model with decreased NO<sub>x</sub> emissions. Model values have been corrected for precipitation bias following the method of Paulot et al. (2014), in which the monthly deposition flux is assumed to scale to the  $0.6^{th}$  power of the precipitation bias. We diagnose precipitation bias in the GEOS-5.11.0 data relative to high-resolution PRISM observations (http://prism.oregonstate.edu). For the Southeast US, the precipitation bias is -34% in August and -21% in September 2013. We see from Figure 3 that the model with decreased NO<sub>x</sub> emissions reproduces the spatial variability in the observations with only +8% bias over the Southeast US and +7% over the contiguous US. In comparison, the model with original emissions had a 63% overestimate of the nitrate wet deposition flux nationally and a 71% overestimate in the Southeast. The high deposition fluxes along the Gulf of Mexico in Figure 3, both in the model and in the observations, reflect particularly large precipitation. The model with decreased  $NO_x$  emissions also reproduces the spatial distribution of  $NO_x$  in the Southeast US boundary layer as observed in SEAC<sup>4</sup>RS. This is shown in Figure 4 with simulated and observed concentrations of  $NO_x$  along the flight tracks below 1.5 km altitude. The spatial correlation coefficient is 0.71. There are no obvious spatial patterns of model bias that would point to specific source sectors as responsible for the  $NO_x$  emission overestimate, beyond the blanket 30–60% decrease of non-power plant NEI emissions needed to correct the regional emission total.

## 4 Using satellite $NO_2$ data to verify $NO_x$ emissions: sensitivity to upper troposphere

Observations of tropospheric NO<sub>2</sub> columns by solar backscatter from the OMI satellite instrument offer an additional constraint on NO<sub>x</sub> emissions (Duncan et al., 2014; Lu et al., 2015). We compare the tropospheric columns simulated by GEOS-Chem with the NASA operational retrieval (Level 2, v2.1) (NASA, 2012; Bucsela et al., 2013) and the Berkeley High-Resolution (BEHR) retrieval (Russell et al., 2011). The NASA retrieval has been validated to agree with surface measurements to within  $\pm$  20% (Lamsal et al., 2014). Both retrievals fit the observed backscattered solar spectra to obtain a slant tropospheric NO<sub>2</sub> column,  $\Omega$ s, along the optical path of the backscattered radiation detected by the satellite. The slant column is converted to the vertical column,  $\Omega v$ , by using an air mass factor (*AMF*) that depends on the vertical profile of NO<sub>2</sub> and on the scattering properties of the surface and the atmosphere (Palmer et al., 2001):

$$\Omega_{\nu} = \frac{\Omega_s}{AMF} = \frac{\Omega_s}{AMF_G \int_0^{Z_T} w(z)S(z)dz} \quad (4)$$

In Equation 4,  $AMF_G$  is the geometric air mass factor that depends on the viewing geometry of the satellite, w(z) is a scattering weight calculated by a radiative transfer model that describes the sensitivity of the backscattered radiation to NO<sub>2</sub> as a function of altitude, S(z)is a shape factor describing the normalized vertical profile of NO<sub>2</sub> number density, and ZT is the tropopause. Scattering weights for NO<sub>2</sub> retrievals typically increase by a factor of 3 from the surface to the upper troposphere (Martin et al., 2002). Here we use our GEOS-Chem shape factors to re-calculate the AMFs in the NASA and BEHR retrievals as recommended by Lamsal et al. (2014) for comparing model and observations. We filter out cloudy scenes (cloud radiance fraction > 0.5) and bright surfaces (surface reflectivity > 0.3).

Figure 5 shows the mean NO<sub>2</sub> tropospheric columns from BEHR, NASA, and GEOS-Chem (with NO<sub>x</sub> emission reductions applied) over the Southeast US for August–September 2013. The BEHR retrieval is on average 6% higher than the NASA retrieval. GEOS-Chem is on average 11±19% lower than the NASA retrieval and 16±18% lower than the BEHR retrieval. With the original NEI NO<sub>x</sub> emissions, GEOS-Chem would be biased high against both retrievals by 26–31%. The low bias in the model with reduced NO<sub>x</sub> emissions does not appear to be caused by an overcorrection of surface emissions but rather by the upper troposphere. Figure 6 (top left panel) shows the mean vertical profile of NO<sub>2</sub> number density

as measured from the aircraft by two independent instruments (NOAA and UC Berkeley) and simulated by GEOS-Chem. At the surface, the median difference is  $1.8 \times 10^9$  molecules cm<sup>-3</sup> which is within the NOAA and UC Berkeley measurement uncertainties of +/- 0.030 ppbv + 7% and +/- 5%, respectively. The observations show a secondary maximum in the upper troposphere above 10 km, absent in GEOS-Chem. It has been suggested that aircraft measurements of NO<sub>2</sub> in the upper troposphere could be biased high due to decomposition in the instrument inlet of thermally unstable NO<sub>x</sub> reservoirs such as HNO<sub>4</sub> and methylperoxynitrate (Browne et al., 2011; Reed et al., 2016). This would not affect the UC Berkeley measurement (Nault et al., 2015) and could possibly account for the difference with the NOAA a measurement in Figure 6.

The top right panel of Figure 6 shows the cumulative contributions from different altitudes to the slant NO<sub>2</sub> column measured by the satellite, using the median vertical profiles from the left panel and applying mean altitude-dependent scattering weights from the NASA and BEHR retrievals. The boundary layer below 1.5 km contributes only 19–28% of the column. The upper troposphere above 8 km contributes 32–49% in the aircraft observations and 23% in GEOS-Chem. Much of the observed upper tropospheric NO<sub>2</sub> likely originates from lightning and is broadly distributed across the Southeast because of the long lifetime of NO<sub>x</sub> at that altitude (Li et al., 2005; Bertram et al., 2007; Hudman et al., 2007). The NO<sub>2</sub> vertical profile (shape factor) assumed in the BEHR retrieval does not include any lightning influence, and the Global Modeling Initiative (GMI) model vertical profile assumed in the NASA retrieval has little contribution from the upper troposphere (Lamsal et al., 2014). These underestimates of upper tropospheric NO<sub>2</sub> in the retrieval shape factors will cause a negative bias in the AMF and therefore a positive bias in the retrieved vertical columns.

The GEOS-Chem underestimate of observed upper tropospheric  $NO_2$  in Figure 6 is partly driven by  $NO/NO_2$  partitioning. The bottom left panel of Figure 6 shows the  $[NO]/[NO_2]$  concentration ratio in GEOS-Chem and in the observations (NOAA for NO, UC Berkeley for  $NO_2$ ). One would expect the  $[NO]/[NO_2]$  concentration ratio in the daytime upper troposphere to be controlled by photochemical steady-state:

$$NO + O_3 \rightarrow NO_2 + O_2$$
 (5)

$$NO + HO_2/RO_2 \rightarrow NO_2 + OH/RO$$
 (6)

$$NO_2 + hv \xrightarrow{O_2} NO + O_3$$
 (7)

If reaction (6) plays only a minor role then  $[NO]/[NO_2] \approx k/(k_5[O_3])$ , defining the NO-NO<sub>2</sub>-O<sub>3</sub> photochemical steady state (PSS). The PSS plotted in Figure 6 agrees closely with GEOS-Chem. Such agreement has previously been found when comparing photochemical

models with observed [NO]/[NO<sub>2</sub>] ratios from aircraft in the marine upper troposphere (Schultz et al., 1999) and lower stratosphere (Del Negro et al., 1999). The SEAC<sup>4</sup>RS observations show large departure. The NO<sub>2</sub> photolysis frequencies  $k_7$  computed locally by GEOS-Chem are on average within 10% of the values determined in SEAC<sup>4</sup>RS from measured actinic fluxes (Shetter and Muller, 1999), so this is not the problem.

A possible explanation is that the model underestimates peroxy radical concentrations and hence the contribution of reaction (6) in the upper troposphere. Zhu et al. (2016) found that GEOS-Chem underestimates the observed HCHO concentrations in the upper troposphere during SEAC<sup>4</sup>RS by a factor of 3, implying that the model underestimates the HO<sub>x</sub> source from convective injection of HCHO and peroxides (Jaeglé et al., 1997; Prather and Jacob, 1997; Müller and Brasseur, 1999). HO<sub>2</sub> observations over the central US in summer during the SUCCESS aircraft campaign suggest that this convective injection increases HO<sub>x</sub> concentrations in the upper troposphere by a factor of 2 (Jaeglé et al., 1998). The bottom right panel of Figure 6 shows median modeled and observed vertical profiles of the HO<sub>x</sub> reservoir hydrogen peroxide (H<sub>2</sub>O<sub>2</sub>) during SEAC<sup>4</sup>RS over the Southeast US. GEOS-Chem underestimates observed H<sub>2</sub>O<sub>2</sub> by a mean factor of 1.7 above 8km. The bottom left panel of Figure 6 shows the [NO]/[NO<sub>2</sub>] ratio in GEOS-Chem with HO<sub>2</sub> and RO<sub>2</sub> doubled above 8 km. Such a change corrects significantly the bias relative to observations.

The PSS and GEOS-Chem simulation of the NO/NO<sub>2</sub> concentration ratio in Figure 6 use  $k_5 = 3.0 \times 10^{-12} \exp[-1500/\text{T}] \text{ cm}^3$  molecule<sup>-1</sup> s<sup>-1</sup> and spectroscopic information for  $k_7$  from Sander et al. (2011). It is possible that the strong thermal dependence of  $k_5$  has some error, considering that only one direct measurement has been published for the cold temperatures of the upper troposphere (Borders and Birks, 1982). Cohen et al. (2000) found that reducing the activation energy of  $k_5$  by 15% improved model agreement in the lower stratosphere. Correcting the discrepancy between simulated and observed [NO]/[NO<sub>2</sub>] ratios in the upper troposphere in Figure 6 would require a similar reduction to the activation energy of  $k_5$ , but this reduction would negatively impact the surface comparison. This inconsistency of the observed [NO]/[NO<sub>2</sub>] ratio with basic theory needs to be resolved, as it affects the inference of NO<sub>x</sub> emissions from satellite NO<sub>2</sub> column measurements. Notwithstanding this inconsistency, we find that NO<sub>2</sub> in the upper troposphere makes a significant contribution to the tropospheric NO<sub>2</sub> column observed from space.

#### 5 Isoprene oxidation pathways

Measurements aboard the SEAC<sup>4</sup>RS aircraft included first-generation isoprene nitrates (ISOPN), isoprene hydroperoxide (ISOPOOH), and hydroperoxyaldehydes (HPALDs) (Crounse et al., 2006; Paulot et al., 2009a; St. Clair et al., 2010; Crounse et al., 2011; Beaver et al., 2012; Nguyen et al., 2015). Although measurement uncertainties are large (30%, 40%, and 50%, respectively (Nguyen et al., 2015)), these are unique products of the ISOPO<sub>2</sub> + NO, ISOPO<sub>2</sub> + HO<sub>2</sub>, and ISOPO<sub>2</sub> isomerization pathways and thus track whether oxidation of isoprene proceeds by the high-NO<sub>x</sub> pathway (producing ozone) or the low-NO<sub>x</sub> pathways. Figure 2 (bottom row) compares simulated and observed concentrations. All three gases are restricted to the boundary layer because of their short lifetimes. Mean model concentrations in the lowest altitude bin (Figure 2, approximately 400m above ground) differ from

observations by +19% for ISOPN, +70% for ISOPOOH, and -50% for HPALDs. The GEOS-Chem simulation of organic nitrates including ISOPN is further discussed in Fisher et al. (2016). Our HPALD source is based on the ISOPO<sub>2</sub> isomerization rate constant from Crounse et al. (2011). A theoretical calculation by Peeters et al. (2014) suggests a rate constant that is  $1.8 \times$  higher, which would reduce the model bias for HPALDs and ISOPOOH and increase boundary layer OH by 8%. St. Clair et al. (2015) found that the reaction rate of ISOPOOH + OH to form IEPOX is approximately 10% faster than the rate given by Paulot et al. (2009b), which would further reduce the model overestimate. For both ISOPOOH and HPALDs, GEOS-Chem captures much of the spatial variability (r= 0.80 and 0.79, respectively).

Figure 7 shows the model branching ratios for the fate of the ISOPO<sub>2</sub> radical by tracking the mass of ISOPO<sub>2</sub> reacting via the high-NO<sub>x</sub> pathway (ISOPO<sub>2</sub>+NO) and the low-NO<sub>x</sub> pathways over the Southeast US domain. The mean branching ratios for the Southeast US are ISOPO<sub>2</sub>+NO 54%, ISOPO<sub>2</sub>+HO<sub>2</sub> 26%, ISOPO<sub>2</sub> isomerization 15%, and ISOPO<sub>2</sub>+RO<sub>2</sub> 5%. The lack of dominance of the high-NO<sub>x</sub> pathway is due in part to the spatial segregation of isoprene and NO<sub>x</sub> emissions (Yu et al., 2016). This segregation also buffers the effect of changing NO<sub>x</sub> emissions on the fate of isoprene. Our original simulation with higher total NO<sub>x</sub> emissions (unadjusted NEI11v1) had a branching ratio for the ISOPO<sub>2</sub>+NO reaction of only 62%.

#### 6 Implications for ozone: aircraft and ozonesonde observations

Figure 2 compares simulated and observed median vertical profiles of ozone concentrations over the Southeast US during SEAC<sup>4</sup>RS. There is no significant bias through the depth of the tropospheric column. The median ozone concentration below 1.5 km is 49 ppb in the observations and 51 ppb in the model. We also find excellent model agreement across the US with the SEACIONS ozonesonde network (Figure 8). The successful simulation of ozone is contingent on the decrease in NO<sub>x</sub> emissions. As shown in Figure 2, a simulation with the original NEI emissions overestimates boundary layer ozone by 12 ppb.

The model also has success in reproducing the spatial variability of boundary layer ozone seen from the aircraft, as shown in Figure 4. The correlation coefficient is r = 0.71 on the  $0.25^{\circ} \times 0.3125^{\circ}$  model grid, and patterns of high and low ozone concentration are consistent. The highest observed ozone (>75 ppb) was found in air influenced by agricultural burning along the Mississippi River and by outflow from Houston over Louisiana. GEOS-Chem does not capture the extreme values and this probably reflects a dilution effect (Yu et al., 2016).

A critical parameter for understanding ozone production is the ozone production efficiency (OPE) (Liu et al., 1987), defined as the number of ozone molecules produced per molecule of NO<sub>x</sub> emitted. This can be estimated from atmospheric observations by the relationship between odd oxygen ( $O_x \equiv O_3 + NO_2$ ) and the sum of products of NO<sub>x</sub> oxidation, collectively called NO<sub>z</sub> and including inorganic and organic nitrates (Trainer et al., 1993; Zaveri, 2003). The O<sub>x</sub> vs. NO<sub>z</sub> linear relationship (as derived from a linear regression) provides an upper estimate of the OPE because of rapid deposition of NO<sub>y</sub>, mainly HNO<sub>3</sub> (Trainer et al., 2000; Rickard et al., 2002).

Figure 9 shows the observed and simulated daytime (9–16 local)  $O_x$  vs.  $NO_z$  relationship in the SEAC<sup>4</sup>RS data below 1.5 km, where  $NO_z$  is derived from the observations as  $NO_y$ - $NO_x \equiv HNO_3$  + aerosol nitrate + PAN + alkyl nitrates. The resulting OPE from the observations (17.4±0.4 mol mol<sup>-1</sup>) agrees well with GEOS-Chem (16.7±0.3). Previous work during the INTEX-NA aircraft campaign in summer 2004 found an OPE of 8 below 4 km (Mena-Carrasco et al., 2007). By selecting INTEX-NA data only for the Southeast and below 1.5 km we find an OPE of 14.1±1.1 (Figure 9, right panel). The median  $NO_z$  was 1.1 ppb during SEAC<sup>4</sup>RS and 1.5 ppb during INTEX-NA, a decrease of approximately 40%. With the original NEI11v1  $NO_x$  emissions (53% higher), the OPE from GEOS-Chem would be 14.7±0.3. Both the INTEX-NA data and the model are consistent with the expectation that OPE increases with decreasing  $NO_x$  emissions (Liu et al., 1987).

#### 7 Implications for ozone: surface air

Figure 10 compares maximum daily 8-h average (MDA8) ozone values at the US EPA Clean Air Status and Trends Network (CASTNET) sites in June-August 2013 to the corresponding GEOS-Chem values. The model has a mean positive bias of  $6\pm14$  ppb with no significant spatial pattern. The model is unable to match the low tail in the observations, including a significant population with MDA8 ozone less than 20 ppb. The improvements to dry deposition described in Section 2.2 minimally reduce (approximately 1 ppb) GEOS-Chem ozone compared to SEAC<sup>4</sup>RS boundary layer and CASTNET surface MDA8 ozone observations. The reduction of daytime mixing depths described in Section 2 results in a small increase in mean MDA8 ozone (approximately 2 ppb).

The positive bias in the model for surface ozone is remarkable considering that the model has little bias relative to aircraft observations below 1.5 km altitude (Figures 2 and 4). A standard explanation for model overestimates of surface ozone over the Southeast US, first proposed by Fiore et al. (2003) and echoed in the review by McDonald-Buller et al. (2011), is excessive ozone over the Gulf of Mexico, which is the prevailing low-altitude inflow. We find that this is not the case. SEAC<sup>4</sup>RS included four flights over the Gulf of Mexico, and Figure 11 compares simulated and observed vertical profiles of ozone and NO<sub>x</sub> concentrations that show no systematic bias. The median ozone concentration in the marine boundary layer is 26 ppb in the observations and 29 ppb in the model. This successful simulation is due to our adjustment of lightning NO<sub>x</sub> emission (Section 2.3); a sensitivity test with the original (twice higher) GEOS-Chem lightning emissions in the southern US increases surface ozone over the Gulf of Mexico by up to 6 ppb. The aircraft observations in Figure 4 further show no indication of a coastal depletion that might be associated with halogen chemistry. Remarkably, the median ozone over the Gulf of Mexico is higher than approximately 8% of MDA8 values at sites in the Southeast.

It appears instead that there is a model bias in boundary layer vertical mixing and chemistry. Figure 12 shows the median ozonesonde profile at a higher vertical resolution over the Southeast US (Huntsville, Alabama and St. Louis, Missouri sites) during SEAC<sup>4</sup>RS as compared to GEOS-Chem below 1.5 km. The ozonesondes indicate a decrease of 7 ppb from 1.5 km to the surface, whereas GEOS-Chem features a reverse gradient of increasing ozone from 1.5 to 1 km with flat concentrations below. This implies a combination of two

model errors in the boundary layer: (1) excessive vertical mixing, (2) net ozone production whereas observations indicate a net loss.

#### 8 Conclusions

We used aircraft (SEAC<sup>4</sup>RS), surface, satellite, and ozonesonde observations from August and September 2013, interpreted with the GEOS-Chem chemical transport model, to better understand the factors controlling surface ozone in the Southeast US. Models tend to overestimate ozone in that region. Determining the reasons behind this overestimate is critical to the design of efficient emission control strategies to meet the ozone NAAQS.

A major finding from this work is that the EPA National Emission Inventory (NEI11v1) for  $NO_x$  (the limiting precursor for ozone formation) is biased high across the US by as much as a factor of 2. Evidence for this comes from (1) SEAC<sup>4</sup>RS observations of  $NO_x$  and its oxidation products, (2) NADP network observations of nitrate wet deposition fluxes, and (3) OMI satellite observations of  $NO_2$ . Presuming no error in emissions from large power plants with continuous emission monitors (14% of unadjusted NEI inventory), we find that emissions from other industrial sources and mobile sources must be 30–60% lower than NEI values, depending on the assumption of the contribution from soil  $NO_x$  emissions. We thus estimate that anthropogenic fuel  $NO_x$  emissions in the US in 2013 were 1.7–2.6 Tg N a<sup>-1</sup>, as compared to 3.5 Tg N a<sup>-1</sup> given in the NEI.

OMI NO<sub>2</sub> satellite data over the Southeast US are consistent with this downward correction of NO<sub>x</sub> emissions but interpretation is complicated by the large contribution of the free troposphere to the NO<sub>2</sub> tropospheric column retrieved from the satellite. Observed (aircraft) and simulated vertical profiles indicate that NO<sub>2</sub> below 2 km contributes only 20–35% of the tropospheric column detected from space while NO<sub>2</sub> above 8 km (mainly from lightning) contributes 25–50%. Current retrievals of satellite NO<sub>2</sub> data do not properly account for this elevated pool of upper tropospheric NO<sub>2</sub>, so that the reported tropospheric NO<sub>2</sub> columns are biased high. More work is needed on the chemistry maintaining high levels of NO<sub>2</sub> in the upper troposphere.

Isoprene emitted by vegetation is the main VOC precursor of ozone in the Southeast in summer, but we find that only 50% reacts by the high- $NO_x$  pathway to produce ozone. This is consistent with detailed aircraft observations of isoprene oxidation products from the aircraft. The high- $NO_x$  fraction is only weakly sensitive to the magnitude of  $NO_x$  emissions because isoprene and  $NO_x$  emissions are spatially segregated. The ability to properly describe high- and low- $NO_x$  pathways for isoprene oxidation is critical for simulating ozone and it appears that the GEOS-Chem mechanism is successful for this purpose.

Our updated GEOS-Chem simulation with decreased  $NO_x$  emissions provides an unbiased simulation of boundary layer and free tropospheric ozone measured from aircraft and ozonesondes during SEAC<sup>4</sup>RS. Decreasing NO<sub>x</sub> emissions is critical to this success as the original model with NEI emissions overestimated boundary layer ozone by 12 ppb. The ozone production efficiency (OPE) inferred from O<sub>x</sub> vs. NO<sub>z</sub> aircraft correlations in the mixed layer is also well reproduced. Comparison to the INTEX-NA aircraft observations

over the Southeast in summer 2004 indicates a 14% increase in OPE associated with a 40% reduction in  $NO_x$  emissions.

Despite the successful simulation of boundary layer ozone (Figures 2 and 9), GEOS-Chem overestimates MDA8 surface ozone observations in the Southeast US in summer by  $6\pm14$  ppb. Daytime ozonesonde data indicate a 7 ppb decrease from 1.5 km to the surface that GEOS-Chem does not capture. This may be due to excessive boundary layer mixing and net ozone production in the model. Excessive mixing in GEOS-Chem may be indicative of an overestimate of sensible heat flux (Holtslag and Boville, 1993), and thus an investigation of boundary layer meteorological variables is warranted. Such a bias may not be detected in the comparison of GEOS-Chem with aircraft data, generally collected under fair-weather conditions and with minimal sampling in the lower part of the boundary layer. An investigation of relevant meteorological variables and boundary layer source and sink terms in the ozone budget to determine the source of bias and its prevalence across models will be the topic of a follow-up paper.

#### Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

#### Acknowledgments

We are grateful to the entire NASA SEAC<sup>4</sup>RS team for their help in the field. We thank Tom Ryerson for his measurements of NO and NO<sub>2</sub> from the NOAA NO<sub>y</sub>O<sub>3</sub> instrument. We thank L. Gregory Huey for the use of his CIMS PAN measurements. We thank Fabien Paulot and Jingqiu Mao for their helpful discussions of isoprene chemistry. We thank Christoph Keller for his help in implementing the NEI11v1 emissions into GEOS-Chem. We acknowledge the EPA for providing the 2011 North American emission inventory, and in particular George Pouliot for his help and advice. These emission inventories are intended for research purposes. A technical report describing the 2011-modeling platform can be found at: http://www.epa.gov/ttn/chief/net/2011nei/ 2011\_nei\_tsdv1\_draft2\_june2014.pdf. A description of the 2011 NEI can be found at: http://www.epa.gov/ttn/chief/net/2011inventory.html. This work was supported by the NASA Earth Science Division and by STAR Fellowship Assistance Agreement no. 91761601-0 awarded by the US Environmental Protection Agency (EPA). It has not been formally reviewed by EPA. The views expressed in this publication are solely those of the authors. JAF acknowledges support from a University of Wollongong Vice Chancellor's Postdoctoral Fellowship. This research was undertaken with the assistance of resources provided at the NCI National Facility systems at the Australian National University through the National Computational Merit Allocation Scheme supported by the Australian Government.

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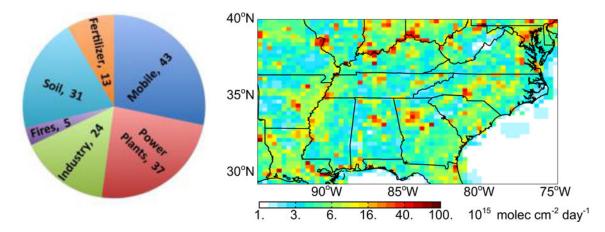
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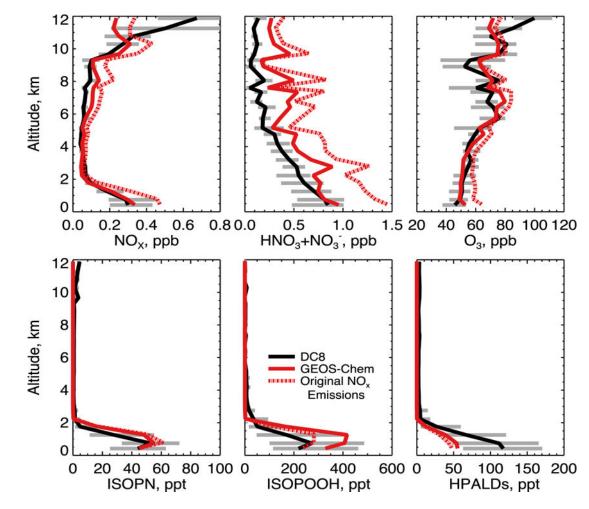
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#### Figure 1.

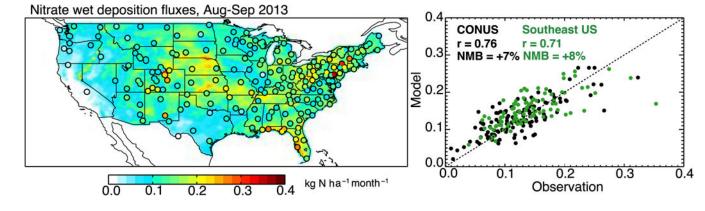
Surface NOx emissions in the Southeast US in GEOS-Chem for August and September 2013 including fuel combustion, soils, fertilizer use, and open fires (total emissions=153 Gg N). Anthropogenic emissions from mobile sources and industry in the National Emission Inventory (NEI11v1) for 2013 have been decreased by 60% to match atmospheric observations (see text). Lightning contributes an additional 25 Gg N to the free troposphere (not included in the Figure). The emissions are mapped on the  $0.25^{\circ} \times 0.3125^{\circ}$  GEOS-Chem grid. The pie chart gives the sum of August–September 2013 emissions (Gg N) over the Southeast US domain as shown on the map (94.5–75° W, 29.5–40° N).

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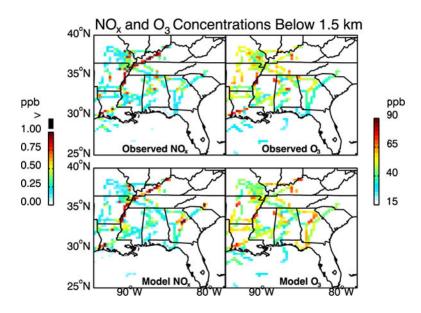
#### Figure 2.

Median vertical concentration profiles of NO<sub>x</sub>, total inorganic nitrate (gas HNO<sub>3</sub> + aerosol NO<sub>3</sub><sup>-</sup>), ozone, isoprene nitrate (ISOPN), isoprene hydroperoxide (ISOPOOH), and hydroperoxyaldehydes (HPALD) for the SEAC<sup>4</sup>RS flights over the Southeast US (domain of Figure 1). Observations from the DC-8 aircraft are compared to GEOS-Chem model results. The dashed red line shows model results before adjustment of NO<sub>x</sub> emissions from fuel combustion and lightning (see text). The 25<sup>th</sup> and 75<sup>th</sup> percentiles of the DC-8 observations are shown as grey bars. The SEAC<sup>4</sup>RS observations have been filtered to remove open fire plumes, stratospheric air, and urban plumes as described in the text. Model results are sampled along the flight tracks at the time of flights and gridded to the model resolution. Profiles are binned to the nearest 0.5 km. The NOAA NOvO3 4-channel chemiluminescence (CL) instrument made measurements of ozone and NO<sub>v</sub> (Ryerson et al., 1998), NO (Ryerson et al., 2000) and NO<sub>2</sub> (Pollack et al, 2010). Total inorganic nitrate was measured by the University of New Hampshire Soluble Acidic Gases and Aerosol (UNH SAGA) instrument (Dibb et al., 2003) and was mainly gas-phase HNO<sub>3</sub> for the SEAC<sup>4</sup>RS conditions. ISOPOOH, ISOPN, and HPALDs were measured by the Caltech single mass analyzer CIMS (Crounse et al., 2006; Paulot et al., 2009a; Crounse et al., 2011).



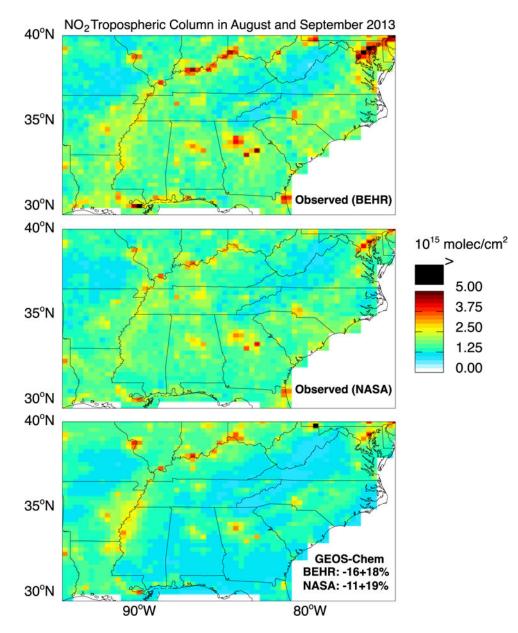
#### Figure 3.

Nitrate wet deposition fluxes across the US in August–September 2013. Mean observations from the NADP network (circles in the left panel) are compared to model values with decreased  $NO_x$  emissions (background). Also shown is a scatterplot of simulated versus observed values at individual sites for the whole contiguous US (black) and for the Southeast US (green). The correlation coefficient (*r*) and normalized mean bias (NMB) are shown inset, along with the 1:1 line.



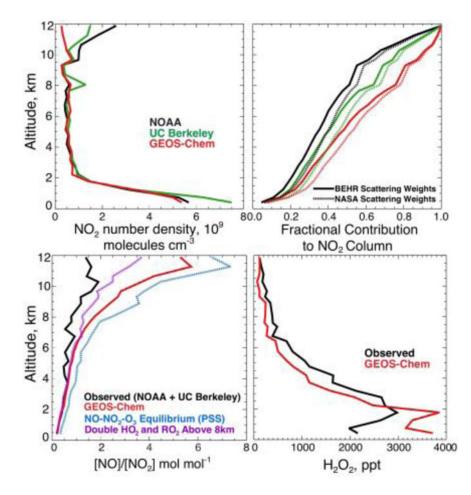
#### Figure 4.

Ozone and NO<sub>x</sub> concentrations in the boundary layer (0–1.5km) during SEAC<sup>4</sup>RS (6 Aug to 23 Sep 2013) Observations from the aircraft and simulated values are averaged over the  $0.25^{\circ} \times 0.3125^{\circ}$  GEOS-Chem grid. NO<sub>x</sub> above 1ppb is shown in black. The spatial correlation coefficient is 0.71 for both NO<sub>x</sub> and O<sub>3</sub>. The normalized mean bias is –11.5% for NO<sub>x</sub> and 4.5% for O<sub>3</sub>.



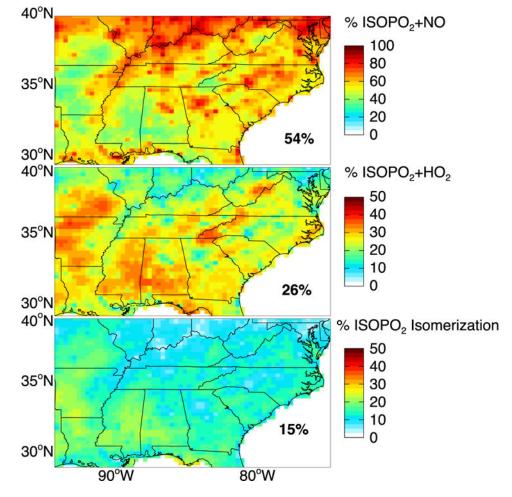
#### Figure 5.

NO<sub>2</sub> tropospheric columns over the Southeast US in August–September 2013. GEOS-Chem (sampled at the 13:30 local time overpass of OMI) is compared to OMI satellite observations using the BEHR and NASA retrievals. Values are plotted on the  $0.25^{\circ}\times0.3125^{\circ}$  GEOS-Chem grid. The GEOS-Chem mean bias over the Figure domain and associated spatial standard deviation are inset in the bottom panel.



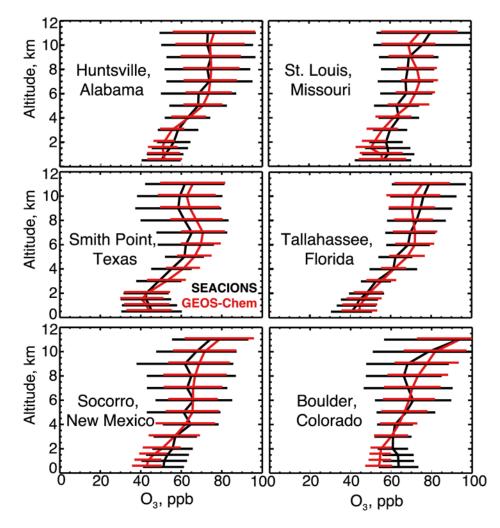
#### Figure 6.

Vertical distribution of NO<sub>2</sub> over the Southeast US during SEAC<sup>4</sup>RS (August-September 2013) and contributions to tropospheric NO<sub>2</sub> columns measured from space by OMI. The top left panel shows median vertical profiles of NO<sub>2</sub> number density measured from the SEAC<sup>4</sup>RS aircraft by the NOAA and UC Berkeley instruments and simulated by GEOS-Chem. The top right panel shows the fractional contribution of NO<sub>2</sub> below a given altitude to the total tropospheric NO<sub>2</sub> slant column measured by OMI, accounting for increasing sensitivity with altitude as determined from the retrieval scattering weights. The bottom left panel shows the median vertical profiles of the daytime [NO]/[NO<sub>2</sub>] molar concentration ratio in the aircraft observations (NOAA for NO and UC Berkeley for NO<sub>2</sub>) and in GEOS-Chem. Also shown is the ratio computed from NO-NO<sub>2</sub>-O<sub>3</sub> photochemical steady state (PSS) as given by reactions (5)+(7) (blue) and including reaction (6) with doubled HO<sub>2</sub> and RO<sub>2</sub> concentrations above 8km (purple). The bottom right panel shows the median H<sub>2</sub>O<sub>2</sub> profile from the model and from the SEAC4RS flights over the Southeast US. H<sub>2</sub>O<sub>2</sub> was measured by the Caltech CIMS (see Figure 2).



#### Figure 7.

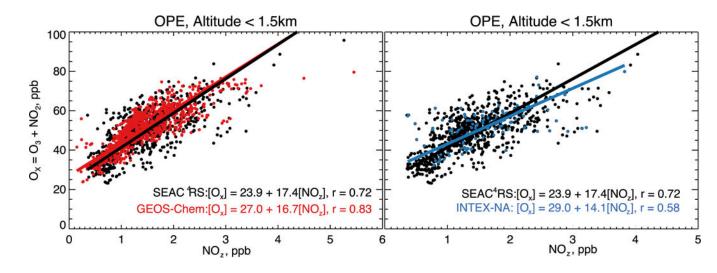
Branching ratios for the fate of the isoprene peroxy radical (ISOPO<sub>2</sub>) as simulated by GEOS-Chem over the Southeast US for August–September 2013. Values are percentages of ISOPO<sub>2</sub> that react with NO, HO<sub>2</sub>, or isomerize from the total mass of isoprene reacting over the domain. Note the difference in scale between the top panel and the lower two panels. Regional mean percentages for the Southeast US are shown inset. They add up to less than 100% because of the small ISOPO<sub>2</sub> sink from reaction with other organic peroxy radicals (RO<sub>2</sub>).



#### Figure 8.

Mean ozonesonde vertical profiles at the US SEACIONS sites (http://croc.gsfc.nasa.gov/ seacions/) during the SEAC<sup>4</sup>RS campaign in August–September 2013. An average of 20 sondes were launched per site between 9am and 4pm local time. Ozonesondes at Smith Point, Texas were only launched in September. Model values are coincident with the launches. Data are averaged vertically over 0.5 km bins below 2 km altitude and 1.0 km bins above. Also shown are standard deviations.

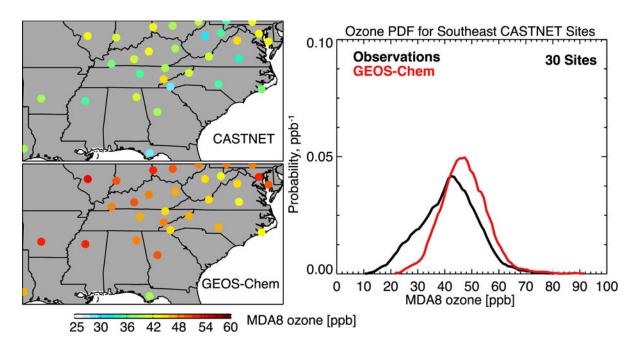
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#### Figure 9.

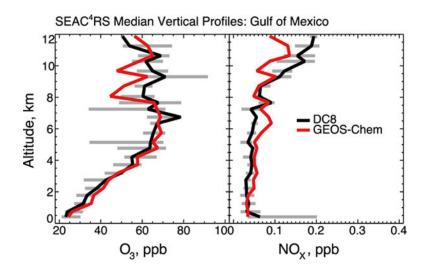
Ozone production efficiency (OPE) over the Southeast US in summer estimated from the relationship between odd oxygen ( $O_x$ ) and the sum of  $NO_x$  oxidation products ( $NO_z$ ) below 1.5 km altitude. The left panel compares SEAC<sup>4</sup>RS observations to GEOS-Chem values for August–September 2013 (data from Figure 2). The right panel compares SEAC<sup>4</sup>RS observations to INTEX-NA aircraft observations collected over the same Southeast US domain in summer 2004 (Singh et al., 2006).  $NO_z$  is defined here as  $HNO_3 + PAN +$  alklynitrates, all of which were measured from the SEAC<sup>4</sup>RS and INTEX-NA aircraft. The slope and intercept of the reduced-major-axis (RMA) regression are provided inset with the correlation coefficient (r). Observations for INTEX-NA were obtained from ftp://ftp-air.larc.nasa.gov/pub/INTEXA/.

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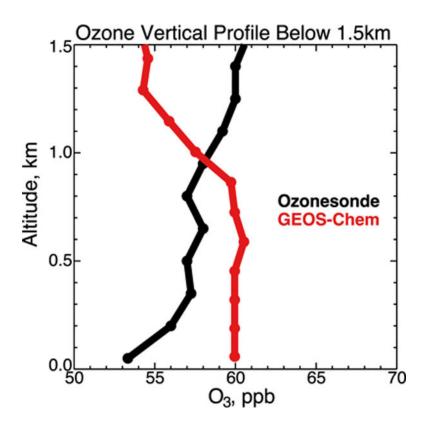
#### Figure 10.

Maximum daily 8-h average (MDA8) ozone concentrations at the 30 CASTNET sites in the Southeast US in June–August 2013. The left panels show seasonal mean values in the observations and GEOS-Chem. The right panel shows the probability density functions (pdfs) of daily values at the 30 sites.



#### Figure 11.

Median vertical profiles of ozone and  $NO_x$  concentrations over the Gulf of Mexico during SEAC<sup>4</sup>RS. Observations are from four SEAC<sup>4</sup>RS flights over the Gulf of Mexico (August 12, September 4, 13, 16). GEOS-Chem model values are sampled along the flight tracks. The 25<sup>th</sup> and 75<sup>th</sup> percentiles of the aircraft observations are shown as horizontal bars.



#### Figure 12.

Median vertical profile of ozone concentrations over St. Louis, Missouri and Huntsville, Alabama during August and September 2013. Observations from SEACIONS ozonesondes launched between 10 and 13 local time (57 launches) are compared to GEOS-Chem results sampled at the times of the ozonesonde launches and at the vertical resolution of the model (11 layers below 1.5km, red circles). The ozonesonde data are shown at 150m resolution. Altitude is above local ground level.