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# Evaluation of a regional air-quality model with bi-directional NH<sub>3</sub> exchange coupled to an agro-ecosystem model

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## Abstract

Atmospheric ammonia  $(NH_3)$  is the primary atmospheric base and an important precursor for inorganic particulate matter and when deposited  $NH_3$  contributes to surface water eutrophication, soil acidification and decline in species biodiversity. Flux measurements indicate that the air-surface exchange of  $NH_3$  is bi-directional. How-

- <sup>5</sup> measurements indicate that the air-surface exchange of NH<sub>3</sub> is bi-directional. However, the effects of bi-directional exchange, soil biogeochemistry and human activity are not parameterized in air quality models. The US Environmental Protection Agency (EPA)'s Community Multiscale Air-Quality (CMAQ) model with bi-directional NH<sub>3</sub> exchange has been coupled with the United States Department of Agriculture (USDA)'s
- Environmental Policy Integrated Climate (EPIC) agro-ecosystem model's nitrogen geochemistry algorithms. CMAQ with bi-directional NH<sub>3</sub> exchange coupled to EPIC connects agricultural cropping management practices to emissions and atmospheric concentrations of reduced nitrogen and models the biogeochemical feedback on NH<sub>3</sub> airsurface exchange. This coupled modeling system reduced the biases and error in NH<sub>x</sub>
- (NH<sub>3</sub> + NH<sub>4</sub><sup>+</sup>) wet deposition and in ambient aerosol concentrations in an annual 2002 Continental US (CONUS) domain simulation when compared to a 2002 annual simulation of CMAQ without bi-directional exchange. Fertilizer emissions estimated in CMAQ 5.0 with bi-directional exchange exhibits markedly different seasonal dynamics than the US EPA's National Emissions Inventory (NEI), with lower emissions in the spring and fall and higher emissions in July.
  - 1 Introduction

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Ammonia ( $NH_3$ ) is the primary atmospheric base and an aerosol precursor (Seinfeld and Pandis, 1998). Atmospheric particulate matter has been shown to have adverse affects on respiratory and cardiovascular systems (Sutton et al., 2011) and can exacerbate preexisting respiratory and cardiovascular conditions (Pope and Dockery, 2006). The deposition of  $NH_3$  and ammonium aerosols contributes to surface water



eutrophication, soil acidification, and alters the soil nitrogen geochemistry (Galloway et al., 2003). Vegetation in ecosystems can be damaged via acute toxicity of nitrogen dioxide ( $NO_2$ ),  $NH_3$ , and ammonium ( $NH_4^+$ ) (Sutton et al., 2011) and long term nitrogen deposition has been linked to declines in species biodiversity in nutrient-poor ecosystems (Duprè et al., 2010). The total ecosystem and human health costs of nitrogen pollution are cumulative because nitrogen cascades through the environment with multiple human health and ecosystem costs (Birch et al., 2011).

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NH<sub>3</sub> emissions are challenging to estimate and concentrations are difficult to measure. It is critical to understand the factors that lead to episodes of poor air quality and atmospheric deposition for the development of effective mitigation strategies. As climate change leads to increased variability in meteorology, relying on seasonal averages as the drivers of NH<sub>3</sub> emissions estimates, as is done in most air-quality models,

adds additional uncertainty to simulations. It is necessary to capture the dynamic and episodic nature of ammonia emissions, including the influences of meteorology, airsurface exchange, and human activity to reduce uncertainty in model scenarios of NH<sub>3</sub> emissions mitigation strategies, agricultural food production and the effects of climate

change. A reduction in oxides of nitrogen (NO<sub>x</sub>) emissions in the US over the past 15 to 20 yr from power plants and mobile sources has been documented (Gilliland et al.,

- 20 2008), but NH<sub>3</sub> emissions remain uncertain and are expected to increase with increased livestock production and crop cultivation (Reis et al., 2009). NH<sub>3</sub> emission inventories for regional air-quality models have been developed based on annual fertilizer sales and animal density with spatial resolution at the US county level and monthly temporal resolution (Goebes et al., 2003; Pinder et al., 2004), and from mechanistic
- <sup>25</sup> models based on reported agricultural data and semi-empirical relationships between emissions and meteorological observations with spatial resolution as fine as 50 km by 50 km and hourly temporal resolution (Skjøth et al., 2011). The improvements in spatial and temporal resolution and top down inverse modeling constraints on NH<sub>3</sub> emissions have improved air-quality models' skill regarding the estimation of NH<sub>3</sub> and aerosol



NH<sub>4</sub><sup>+</sup> concentrations (Skjøth et al., 2011; Pinder et al., 2006; Gilliland et al., 2006). Despite these model improvements, a systematic difference between ambient NH<sub>3</sub> observations and model estimates on the order of 30 % persists (Erisman et al., 2007). Underestimation of emissions and/or the overestimation of dry deposition in agricul <sup>5</sup> tural areas have been proposed as explanations of the systematic difference between

model estimates and observed NH<sub>3</sub> concentrations (Erisman et al., 2007).

Measurements have shown that the air-surface flux of  $NH_3$  is bi-directional and the direction of the flux is dependent on the land use, land management, and ambient  $NH_3$  concentrations (Sutton et al., 1993a,b). Fertilizer application to agriculturally

- <sup>10</sup> managed land is characterized by NH<sub>3</sub> emission peaks lasting a few days (Flechard et al., 2010). Bi-directional NH<sub>3</sub> exchange is typically observed in flux measurements, but current regional and global scale air-quality models do not include a mechanistic description of these processes. For the first time, an agro-ecosystem model has been coupled to a photochemical air-quality model to capture the dynamics of ob-
- <sup>15</sup> served NH<sub>3</sub> fluxes from fertilized and unfertilized land, and this coupled modeling system was evaluated against observations to better understand the importance of these processes on a regional scale. Cultivated crops and pastures cover 22% of the land area of the continental US (CONUS) and 38% of the Earth's ice free land (Homer et al., 2007; Foley et al., 2011) representing a large spatial area where the impact
- of agricultural management practices alter the balance of atmospheric NH<sub>3</sub> sources and sinks. This manuscript describes an analysis in which the Community Multiscale Air-Quality (CMAQ version 5.0) modeling system was modified to include bi-directional NH<sub>3</sub> exchange and coupled to a soil nitrogen model (Cooter et al., 2012) based on the routines in the United States Department of Agriculture's (USDA) Environmental Policy
- <sup>25</sup> Integrated Climate (EPIC) agro-ecosystem model (Williams et al., 2008) for the US continental (CONUS) domain. The reduced nitrogen  $(NH_x = NH_3 + NH_4^+)$  wet deposition results of this coupled modeling system were evaluated against the National Atmospheric Deposition Program's (NADP) National Trends Network (NTN) NH<sub>x</sub> observations. Nitrate ambient aerosol concentration results were evaluated against observations from



the Interagency Monitoring of Protected Visual Environments (IMPROVE: Malm et al., 1994) and Speciation Trends Network (STN: Chu, 2004).

# 2 Methods

CMAQ (Foley et al., 2010) version 5.0 with bi-directional exchange estimates NH<sub>3</sub> fluxes from agricultural cropping activities, a simple inorganic nitrogen soil geochem-5 istry parameterization, and meteorological parameters. The agricultural cropping activity data required are fertilizer application rates, depths, and timing. These variables are provided on a daily basis from CONUS EPIC simulations (Cooter et al., 2012). The soil NH<sub>x</sub> budget follows the parameterization used in EPIC (Williams et al., 2008) and consists of solving for NH<sub>3</sub> fluxes and soil nitrification simultaneously. Evasive and 10 deposition fluxes of NH<sub>3</sub> were modeled using a two layer resistance model developed from (Nemitz et al., 2001) based on CMAQ dry deposition resistance parameterizations (Pleim and Xiu, 1995). Soil  $NH_4^+$  nitrification in CMAQ with bi-directional  $NH_3$  exchange was modeled following the parameterization in EPIC (Williams et al., 2008). NH<sub>3</sub> fluxes and micrometeorological parameters were estimated for each sub grid cell land use 15 category in CMAQ with bi-directional NH<sub>3</sub> exchange and then aggregated up to the modeled 12 km grid cell.

# 2.1 Soil and vegetation emission potentials

A NH<sub>3</sub> bi-directional exchange model was developed for the CMAQ modeling system
 using field scale (~ 100 ha) observations taken at field sites in North Carolina, USA (Walker et al., 2012) and published NH<sub>3</sub> air-surface exchange parameterizations (Massad et al., 2010 and references therein). To support bi-directional exchange estimates, two soil layers and a canopy compensation point model was incorporated into CMAQ. Soil NH<sub>4</sub><sup>+</sup>, pH, and the soil emission potential, (Γ<sub>g</sub>, defined as [NH<sub>4</sub><sup>+</sup>]/[H<sup>+</sup>]) were modeled as a function of fertilizer application rate, crop type, soil type, and meteorology.



Agricultural practices including fertilizer application and timing were modeled following Cooter et al. (2012) and  $\Gamma_a$  due to inorganic fertilization application was calculated following Massad et al. (2010).

$$\Gamma_{\rm g} = \frac{{\rm N}_{\rm app}/\theta_{\rm s} M_{\rm N} d_{\rm s} h_{\rm m}}{10^{-\rm pH}}$$

<sup>5</sup> where, N<sub>app</sub> is the fertilizer application in kg-Nha<sup>-1</sup>,  $\theta_s$  is the soil volumetric water content in  $m^3 m^{-3}$ ,  $M_N$  is the molar mass of nitrogen (14 gmol<sup>-1</sup>),  $d_s$  is the depth of the soil layer in m,  $h_m$  is the conversion factor from ha to m<sup>2</sup>, and pH is the pH of the soil water solution. Fertilizer application rates, dates and methods, injected to 0.05 m or surface applied, for 21 major US crops were provide from a CONUS simulation of EPIC (Cooter et al., 2012). Unlike Massad et al. (2010) who used an exponential decay function to adjust  $\Gamma_{\alpha}$  as a function of time after fertilization, the atmosphere-soil  $NH_{4}^{+}$  budget was simulated in CMAQ as being dynamically coupled to hourly soil  $NH_{4}^{+}$ losses due to evasion and nitrification, and increases in soil NH<sub>3</sub> due to deposition. The soil  $NH_{4}^{+}$  budget was simulated in CMAQ by adding two soil layers, incorporating the EPIC nitrification routines into CMAQ, and coupling the soil  $NH_4^+$  concentration to atmospheric reduced nitrogen deposition and evasion following Ready et al. (1979).

$$\frac{\mathrm{d}[\mathrm{NH}_{\mathrm{x}}]}{\mathrm{d}t} = \underbrace{-\frac{1}{d_{\mathrm{s}}\theta_{\mathrm{s}}R_{\mathrm{soil}}}([\mathrm{NH}_{3}]_{\mathrm{soil}} - [\mathrm{NH}_{3}]_{\mathrm{C}})}_{1} - \underbrace{K_{\mathrm{N}}[\mathrm{NH}_{4}^{+}]}_{2}$$
(2)

where,  $[NH_4^+]$  is the soil ammonium concentration in moles  $I^{-1}$ ,  $[NH_3]_{soil}$  is the soil compensation point in moles I<sup>-1</sup> calculated from the solubility and Henry's Law equilibria from  $NH_4^+$  in the soil water solution,  $[NH_3]_C$  is the in-canopy concentration (modeled as 20 the canopy compensation point) in moles  $I^{-1}$  calculated following Nemitz et al. (2001),  $R_{\rm soil}$  is the resistance to diffusion through the soil layer sm<sup>-1</sup>, and  $K_{\rm N}$  is the nitrification rate in  $s^{-1}$  following Williams et al. (2008). Deposition and evasion from the soil is



(1)

represented in part 1 of Eq. (2), with evasion occurring when  $[NH_3]_{soil} > [NH_3]_C$ , and nitrification represented according to part 2 of Eq. (2).  $K_N$  is estimated from the soil water content, soil pH, and soil temperature according to Williams et al. (2008).

Emission potentials from ammonium in the vegetation's apoplastic solution  $(\Gamma_s = [NH_4^+]/[H^+])$  and non-agricultural soils were modeled as a function of land cover type ranging from 10 to 160 with agricultural and heavily vegetated areas having the highest values similar to Zhang et al. (2010).  $\Gamma_s$  values used for this simulation are on the low end of the values measured in the field. To assess the models sensitivity to these values a simulation was run following the parameterization of Massad et al. (2010), where  $\Gamma_s$  was modeled as a function of the annual N deposition field and fertilizer application. These changes increased  $\Gamma_s$  by approximately a factor of three in background sites and by as much as a factor of 30 in agricultural regions (Dennis et al., 2012, and discussed in Sect. 3).

#### 2.2 Emissions and deposition estimate

<sup>15</sup> The bi-directional exchange model in CMAQ 5.0 estimates a net NH<sub>3</sub> flux. However the base case of this model and most other air-quality models separates the air-surface exchange of NH<sub>3</sub> into emission and deposition fluxes. NH<sub>3</sub> emissions are typically based on emissions factors that can vary seasonally (Goebes et al., 2003). Atmospheric deposition is typically modeled as the product of a deposition velocity and the ambient concentration. In the CMAQ bi-directional NH<sub>3</sub> exchange model, the NH<sub>3</sub> air-surface flux is modeled as a function of the gradient between the ambient first layer model concentration at ~ 20 m and the canopy compensation point modeled at 0.5 of the canopy height (hc).

$$F_{\rm t} = \frac{1}{R_{\rm a} + 0.5 R_{\rm inc}} \left( \chi_{\rm c} - \chi_{\rm a} \right)$$

<sup>25</sup> where  $F_{\rm t}$  the total air-surface exchange of NH<sub>3</sub>,  $R_{\rm a}$  is the aerodynamic resistance,  $R_{\rm inc}$  is the in-canopy aerodynamic resistance,  $\chi_{\rm c}$  is the canopy NH<sub>3</sub> compensation point,



(3)

and  $\chi_a$  is the atmospheric NH<sub>3</sub> concentration.  $\chi_c$  is a function of  $\chi_a$ , the stomatal compensation point,  $\chi_{st}$ , and the soil compensation point,  $\chi_g$ . All the compensation points are in the units of  $\mu$ gm<sup>-3</sup> and all resistances are in the units of sm<sup>-1</sup>.

$$\frac{\chi_a}{R_a + 0.5R_{\text{inc}}} + \frac{\chi_{\text{st}}}{R_b + R_{\text{st}}} + \frac{\chi_g}{0.5R_{\text{inc}} + R_{\text{bg}} + R_{\text{soil}}}$$
(4)

$$\frac{R_{c}}{(R_{a} + 0.5R_{inc})^{-1} + (R_{b} + R_{st})^{-1} + (R_{b} + R_{w})^{-1} + (0.5R_{inc} + R_{bg} + R_{soil})^{-1}}$$

<sup>5</sup> where  $R_{\rm b}$  is the quasi laminar boundary layer resistance at the leaf surface,  $R_{\rm st}$  is the stomatal resistance,  $R_{\rm bg}$  is the quasi laminar boundary layer resistance at the ground surface, and  $R_{\rm w}$  is the cuticular resistance.  $\chi_{\rm st}$  and  $\chi_{\rm g}$  are calculated following Nemitz et al. (2001).

$$\chi_{\rm st} = M_n / V_m \frac{161\,500}{T_{\rm c}} e^{\left(-\frac{10380}{T_{\rm c}}\right)} \Gamma_{\rm s}$$

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$$\chi_{\rm g} = M_n / V_m \frac{161\,500}{T_{\rm s}} e^{\left(-\frac{10380}{T_{\rm s}}\right)} \Gamma_{\rm g}$$

where  $M_n$  is the molar mass of NH<sub>3</sub> (1.7 × 107 µg mol<sup>-1</sup>),  $V_m$  is to convert I to m<sup>3</sup> (1 × 10<sup>-3</sup>),  $T_c$  and  $T_s$  are the canopy and soil temperature in K. The following modification to Eq. (3) was used in order to estimate an emission from soil NH<sub>4</sub><sup>+</sup> comparable to the estimates used by emissions models where gradient processes are not modeled. This was done to be consistent with NH<sub>3</sub> emissions estimates from agricultural cropping practices used in most air-quality models.

$$F_{\text{emis}} = \frac{1}{R_{\text{a}} + 0.5R_{\text{inc}}} \left( \chi_{\text{c}} \left[ \chi_{\text{a}} = 0 \right] \right)$$
(7)

where  $\chi_c[\chi_a = 0]$  is the compensation point calculated assuming that there is no NH<sub>3</sub> present in the atmosphere and  $F_{emis}$  is the emission flux. Likewise, the deposition flux



(5)

(6)

is estimated by modifying Eq. (3), assuming that there is no atmospheric compensation point.

$$F_{dep} = \frac{1}{R_a + 0.5R_{inc}} \left( \chi_c [\Gamma_s = 0 \text{ and } \Gamma_g = 0] - \chi_a \right)$$

where  $\chi_c$  is calculated as a function of the ambient atmospheric NH<sub>3</sub> concentration alone, the emission potentials from the soil and apoplast are set to zero and  $F_{dep}$  is the deposition component of the flux. Note, that  $F_{emis}$  and  $F_{dep}$  was used to provide for a more direct comparison with the base model and  $F_{emis} + F_{dep} = F_t$ .

#### 2.3 Model simulation

Two CMAQ model cases were run to evaluate the application of this bi-directional NH<sub>3</sub> exchange model on a regional scale (1000–5000 km). The bi-directional case, hereafter referred to as bi-directional, and a base case, hereafter referred to as base, in which NH<sub>3</sub> emissions and deposition were modeled separately. The base case used the EPA National Emissions Inventory (NEI) fertilizer emissions estimates and CMAQ's unidirectional deposition velocity parameterization for NH<sub>3</sub>. Annual 2002
 simulations on the 12 km horizontal grid cell resolution CONUS domain use 2002 NEI emissions (http://www.epa.gov/ttnchie1/net/2002inventory.html) and Weather Research Forecasting (WRF v3.1, Skamarock et al. 2008) meteorology using the Pleim-Xiu land surface scheme (Pleim and Xiu, 1995) and Asymmetric Convective Model version 2 (Pleim, 2007). CMAQ was run with 24 vertical layers using terrain following coordinates with a surface layer thickness of approximately 40 m. The upper most layer was located at 75 mb.

Emissions were identical between the two cases except for NH<sub>3</sub> emissions from agricultural fertilizer application. Agricultural fertilizer emissions in the base case are the product of annual fertilizer activity (applications) following the Carnegie-Mellon University (CMU) emissions model (Goebes et al., 2003) and fixed emission factors. The total

sity (CMU) emissions model (Goebes et al., 2003) and fixed emission factors. The total annual NH<sub>3</sub> emissions (fertilizer emissions plus animal husbandry) were seasonally



(8)

allocated using inverse modeling techniques that relied on wet deposition (Gilliland et al., 2006). The seasonally adjusted animal operation emissions were kept the same in the base case and the bi-directional case. The NEI fertilizer emissions were removed from the bi-directional case and fertilizer emissions were estimated dynamically within

- <sup>5</sup> CMAQ using the EPIC agricultural management output. Information regarding inorganic fertilizer application amounts and timing were simulated for bi-directional CMAQ using EPIC (Williams et al., 2008; Izaurralde et al., 2006) as described above and in Cooter et al. (2012). The vegetation apoplastic emission potential,  $\Gamma_s$ , was parameterized as a function of the land cover type.
- <sup>10</sup> The model simulations were evaluated on a domain-wide basis for the CONUS on annual and monthly time frames against  $NH_x$  wet deposition observations and ammonium  $(NH_4^+)$ , nitrate  $(NO_3^-)$  and sulfate  $(SO_4^{2-})$  aerosol monitoring network observations.  $NH_x$  wet deposition and precipitation was measured by the National Acid Deposition Program's (NADP) National Trends Network (NTN). CMAQ modeled deposition and
- <sup>15</sup> WRF modeled precipitation were evaluated against the NTN wet deposition and precipitation observations to quantify the precipitation biases as part of the wet deposition evaluation at NTN sites. Spatially interpolated Parameter-elevation Regression on Independent Slopes Model (PRISM, Daly et al., 1994) gridded data are available for the entire CONUS domain and compare quite well with the NADP precipitation site data.
- <sup>20</sup> CMAQ wet deposition was adjusted to address precipitation biases on a monthly basis using PRISM interpolated observations by linearly adjusting the CMAQ estimated wet deposition by the ratio of the observed to estimated precipitation (Eq. 9) to generate CONUS NH<sub>x</sub> wet deposition fields following Appel et al. (2011).

$$F_{\rm ba,WD} = \frac{\sum P_{\rm PRISM}}{\sum P_{\rm Model}} \sum F_{\rm WD}$$

where  $F_{ba,WD}$  is the bias adjusted wet deposition,  $P_{PRISM}$  is the monthly total PRISM precipitation,  $P_{Model}$  is the monthly total WRF precipitation, and  $F_{WD}$  is the monthly model wet deposition.



(9)

Modeled inorganic  $NO_3^-$ , and  $SO_4^{2-}$  aerosol concentrations were evaluated against speciated particulate matter (PM) measurements from the mostly rural Interagency Monitoring of Protected Visual Environments (IMPROVE: Malm et al., 1994) sites and  $NH_4^+$ ,  $NO_3^-$ , and  $SO_4^{2-}$  measurements from the mostly urban Speciation Trends Network (STN: Chu, 2004) sites.

#### 3 Results and discussion

## 3.1 Model nitrogen budget

The annual domain-wide 2002 fertilizer emissions estimated using CMAQ with bidirectional exchange and EPIC simulated fertilizer applications were 42.7 % lower than
the values in the NEI. The bi-directional fertilizer emissions were 16.2% of the total (animal, fertilizer and industrial) NH<sub>3</sub> emissions in the bi-directional case. NEI fertilizer emissions in the base case were 29.9% of the total NH<sub>3</sub> emissions in the base case run. The bi-directional case estimated lower NH<sub>3</sub> emissions in the spring and fall and higher emissions in January and July (Fig. 1). Spring and fall NH<sub>3</sub> emissions
in the NEI have a higher degree of uncertainty due to compensating errors related to the precipitation and inverse modeling and may be too high (Gilliland et al., 2006). The total NH<sub>3</sub> emissions were lowered by as much as 45% in March and increased by as much as 20% in July. A portion of these emission differences stems from the EPIC simulated cropland fertilization rates being ~ 12% lower than total agricultural and non-agricultural inorganic fertilizer sales-based activity values used by the NEI

(Cooter et al., 2012). A much larger portion of these differences likely relates to the dynamic emissions response to local temperature conditions present in bi-directional CMAQ (see Sect. 2.2).

The dry deposition of  $NH_3$  was decreased by 45.3% across the CONUS domain <sup>25</sup> in the bi-directional case. The reduced modeled  $NH_3$  emissions from fertilized crops were more than offset by the reduction in the dry deposition sinks resulting in a net



increase in atmospheric NH<sub>3</sub> in most areas. Overall, there was an increase in NH<sub>x</sub> wet deposition of 14 % and an increase of 9.7 % in NH<sub>3</sub> and decrease of 6.9 % in NH<sub>4</sub> ambient concentrations in the CONUS domain. The total NH<sub>x</sub> deposition was reduced by 14.7 %, total N deposition was reduced by 5.4 % over the base case primarily due to the
reduction in NH<sub>3</sub> dry deposition, and bi-directional total NH<sub>3</sub> emissions were reduced by 16.4 %. Thus, the export of NH<sub>x</sub> off the continent was increased by 2.3 %. A June 2006 sensitivity run using the apoplast compensation point of Massad et al. (2010) resulted in a 17 % increase in June bi-directional NH<sub>3</sub> emissions from agricultural cropping operations and a 4.8 % increase in the domain wide total NH<sub>3</sub> emissions (Dennis et al., 2012).

#### 3.2 NH<sub>x</sub> wet deposition evaluation

NH<sub>x</sub> wet deposition estimated using the bi-directional exchange parameterization increased the model bias over the base case by 8% at NADP sites on an annual bases (Table 1). However the 2002 modeled precipitation was biased by 18.1%. The monthly biases in the bi-directional wet deposition correlated well with the monthly meteorological precipitation biases ( $r^2 = 0.581$ , p < 0.05) while the base case NH<sub>x</sub> wet deposition biases did not significantly correlate with precipitation biases ( $r^2 = 0.08$ , p = 0.373). When the annual wet deposition is corrected for precipitation using PRISM interpolated precipitation data following Appel et al. (2011), the absolute magnitude of the normalized bias in the bi-directional case is slightly reduced from 10.2% to -9.8% and the absolute magnitude of the normalized bias in the base case increases from 1.9% to -16% (Table 1). This indicates that the relatively unbiased wet deposition in the base case was likely due to meteorological model precipitation errors. The model precipitation biases are greatest during periods of summertime convective precipitation. These precipitation biases are well documented and not likely to be corrected in mesoscale

models due to the localized/small scale nature of convective precipitation (Tost et al., 2010). Precipitation post processing techniques are necessary to account for potential precipitation biases in chemical transport models to illuminate the differences between



biases propagated from errors in the simulated precipitation field and errors in the emissions, transport and fate in the chemical transport model (Appel et al., 2011). The bias introduced in NH<sub>x</sub> wet deposition estimates by the bi-directional model parametrization is largely mitigated if one accounts for the biases in the modeled precipitation of the <sup>5</sup> driving meteorological model.

Bi-directional surface exchange improved the model seasonal and spatial comparisons to  $NH_x$  wet deposition observations. The underestimation in the  $NH_x$  wet deposition in the upper Midwest was reduced in the bi-directional case (Fig. 2). Both models under estimated the wet deposition in the spring/early summer observed at NADP sites (Fig. 3). The bi-directional case  $NH_x$  wet deposition in June, July and August was biased high by 21.8 %, 42.3 % and 29.6 % respectively (Fig. 3) as a result of model biases in the precipitation during these periods of 44.7 %, 69.3 % and 37.8 % NMB, respectively. The application of bi-directional exchange in CMAQ, together with

the precipitation correction, increased the bias and error in wet deposition from the Mid Atlantic to the Northeastern US states where the base case was relatively unbiased,
 Fig. 2. However, improvements in the domain wide model wet deposition performance with the bi-directional NH<sub>3</sub> parameterization offset localized degradation in the model performance and resulted in a net improvement in the regional scale simulation in NH<sub>x</sub> wet deposition.

## 20 3.3 Ambient aerosol evaluation

NH<sub>3</sub> preferentially partitions to SO<sub>4</sub><sup>2-</sup> aerosol and in sulfate poor conditions excess ammonia will react with other species (Nenes et al., 1998). Thus, large differences in the total sulfate aerosol were not observed nor expected. However, changes in the ambient NH<sub>3</sub> were expected and these changes affected the modeled NO<sub>3</sub><sup>-</sup> aerosol concentrations. CMAQ NO<sub>3</sub><sup>-</sup> aerosol estimates were compared to STN observations located primarily in urban sites and IMPROVE observations located primarily in rural sites. At STN sites the mean annual domain base case NO<sub>3</sub><sup>-</sup> concentration was nearly unbiased (0.2 % NMB) while the bi-directional case introduced a -10.5 % negative bias (under



prediction). At the more rural IMPROVE monitoring sites, the normalized mean annual bias was reduced from 18.2% in base case to 0.6% in the bi-directional case. The over prediction in NO<sub>3</sub><sup>-</sup> aerosol concentrations in Ohio Valley and Midwest in the base case is reduced in the bi-directional case (Fig. 4). Incorporation of the bi-directional <sup>5</sup> exchange model in CMAQ improved the annual mean NO<sub>3</sub><sup>-</sup> concentrations at almost all IMPROVE sites, but both model cases still underestimated annual mean NO<sub>3</sub><sup>-</sup> con-

- centrations at many Western US STN sites (Fig. 4). The positive bias in modeled  $NO_3^-$  concentrations at IMPROVE sites was reduced in the bi-directional case for almost the entire distribution of the observed concentrations, while the bi-directional case reduced
- <sup>10</sup> the over prediction in NO<sub>3</sub><sup>-</sup> aerosol concentrations at STN sites for observed concentrations below approximately  $3 \mu g m^{-3}$  and both models under estimated observations with concentrations above  $5 \mu g m^{-3}$  (Fig. 5). Both model cases overestimated the NO<sub>3</sub><sup>-</sup> concentrations in the Mid Atlantic region of the US. The bi-directional case underestimate of NO<sub>3</sub><sup>-</sup> aerosol concentrations at STN sites was due to an over-reduction of the
- <sup>15</sup> winter (7.2% base and -10.2% bi-directional NMB) and fall (7.2% base and -3.9% bi-directional NMB) base case concentrations. On the other hand, the bi-directional case reduced the summertime base case under prediction (-15.1% base and -4.5% bi-directional NMB) in NO<sub>3</sub><sup>-</sup> aerosol concentrations, Fig. 6. The bi-directional case reduced the over estimation of NO<sub>3</sub><sup>-</sup> aerosol observations at rural IMPROVE sites in the
- <sup>20</sup> base case during the winter and fall (from 44.6 % to 9.9 % NMB and 29.5 % to 12.8 % NMB respectively) and reduced the summertime under prediction of the nitrate aerosol by 15.8 % (from a NMB of 29.2 % to 13.4 %). At both STN and IMPROVE sites, the under prediction of  $NO_3^-$  aerosol during the spring was increased in the bi-directional case (from -7.2 % to -23.7 % and -6.6 % to -23.5 % respectively).
- These results show that ambient  $NO_3^-$  aerosol concentrations are sensitive to  $NH_3$  emissions and that the reduction in the seasonal aerosol biases, Fig. 6, have similar patterns as the change in  $NH_3$  emissions, Fig. 1. However, it is not clear if the reduction in the bias was due to an underestimation of the fertilizer application and, subsequently, an under estimation of the  $NH_3$  emission, or due to the bi-directional



exchange parameterization. To evaluate this question, March 2002 was rerun with the bi-directional exchange model with approximately a seven fold increase in fertilizer application. This introduced a positive bias in the  $NO_3^-$  aerosol evaluation in these bi-directional simulations, but this bias was still approximately half of the bias in the base

(82.0 % NBM at IMPROVE sites and 35.2 % NMB at STN sites) case for March 2002. The increase in NH<sub>3</sub> evasion in March 2002 was not as sensitive to increases in fertilizer applications as the June 2006 simulations reported in Dennis et al. (2012). Thus it appears that the reduction in the NH<sub>3</sub> emissions and, therefore, the bias in the winter aerosol observations were likely due to the parameterization of NH<sub>3</sub> bi-directional exchange and the exponential temperature function of the NH<sub>3</sub> compensation point (Eq. 6).

The gap in observed and modeled  $NO_3^-$  aerosol concentrations at STN sites may be partially closed by adopting the Massad et al. (2010) apoplast compensation point model. The June 2006 simulation with this parameterization resulted in proportionally (relative to the change in emissions) higher  $NO_3^-$  aerosol concentrations than resulted from increases in modeled fertilization rates (Dennis et al., 2012). The increase in the  $NO_3^-$  aerosol concentrations using the Massad et al. (2010) compensation point model may be from the parameterization of  $\Gamma_s$  as a function of the annual total N deposi-

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- tion field. This increased the apoplastic compensation point and atmospheric  $NH_3$  in <sup>20</sup> urban areas where there was often abundant ambient  $NO_x$ , sufficient  $HNO_3$  for  $NO_3^$ aerosol formation, and higher oxidized N deposition rates relative to the total N deposition budget resulting in an increased  $\Gamma_s$ . The Ammonia Monitoring Network (AMoN; Purchalski et al., 2011) began sampling in the continental US in the fall of 2007, thus long term monitoring data of  $NH_3$  was not available to compare against these 2002 an-
- <sup>25</sup> nual simulations. However, simulations are planned to evaluate CMAQ modeled NH<sub>3</sub> concentrations to AMoN observations as well as satellite derived and aircraft observations. Additionally, multiyear simulations are planned to evaluate how NH<sub>3</sub> bi-directional exchange may alter estimated trends in total N deposition to sensitive ecosystems.



# 4 Conclusions

A photochemical air-quality model has been successfully coupled with an agroecosystem model in CMAQ version 5.0 to simulate the bi-directional exchange of NH<sub>3</sub>. This allows for the direct estimation of NH<sub>3</sub> emissions, transport and deposition from <sup>5</sup> agricultural practices from the parameterizations of soil geochemistry, transport and dynamic NH<sub>3</sub> compensation point processes. This coupled modeling system improved the simulations of NH<sub>x</sub> wet deposition (when compensating precipitation biases were

- accounted for) and improved the simulation of ambient nitrate aerosol concentrations. The largest improvements in the aerosol simulations were during the spring and fall.
   NEI estimates at these times are particularly uncertain since significant precipitation prediction biases were incorporated in the inverse modeling adjustments to the seasonality (Gilliland et al., 2006; Pinder et al., 2006; Henze et al., 2009). The CMAQ bi-directional model can likely be improved with additional soil and vegetation geochemical and ambient NH<sub>3</sub> concentration and flux data to enhance and evaluate these
- parameterizations. Nonetheless, the EPIC agro-ecosystem and CMAQ models can be used to assess agro-ecosystem management and changes in biogeochemical processes leading to more robust model assessments of future land use, agricultural, energy and climate change scenario analyses (Cooter et al., 2012).

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**Table 1.** Annual base and bi-directional Pearson's correlation coefficient, NMB and NME compared to annual NADP observations.

	Correlation (r)	NMB	NME
Base	0.766	1.9%	30.6 %
Bi-directional	0.791	10.2 %	30.3 %
Base PRISM	0.750	-16%	33.8 %
Bi-directional PRISM	0.777	-9.8%	31.3%
WRF vs. PRISM precipitation	0.851	18.1 %	25.5%









**Fig. 2.** Maps of base and bi-directional annual  $NH_x$  wet deposition fields top left and right panels, respectively annual  $NH_x$  deposition maps scaled by annual 2002 PRISM precipitation fields for base and bi-directional cases bottom left and right panels. Mean annual NADP observations at each measurement site (N = 243) are plotted in the same color scales over the modeled results.





**Fig. 3.** Box plots of  $NH_x$  wet deposition monthly model bias (top two panels) and total simulated wet deposition (bottom two panels) paired in space and time with NADP observations (N = 560 to 863 per month) for the CMAQ base case estimates (red) and CMAQ with bi-directional case (blue). Monthly biases and total deposition for the raw model output are presented in the top panel of each set and precipitation corrected biases are presented in the bottom panel of each set. The boxes enclose the 25th to 75th percentiles, the whiskers represent the 5th and 95th precentiles, the horizontal bar represents the median, and the black diamond represents the mean.





**Fig. 4.** 2002 annual mean  $NO_3^-$  aerosol concentration in the bi-directional (left panel) and base case (right panel). Mean annual STN observations (N = 208) are plotted over the map as diamonds and IMPROVE observations (N = 156) for each measurement site are plotted over the map as circles. Note that the color scale has been plotted on a log axis.











**Fig. 6.** Box plots of modeled monthly ambient  $NO_3^-$  aerosol biases and concentrations at STN (top two panels; N = 871 to 1236 per month) and IMPROVE sties (bottom two panels; N = 691 to 1135 per month). The base case is in red, the bi-directional case is in blue and STN and IMPROVE observations is in grey. The boxes enclose the 25th to 75th percentile, the whiskers represent the 5th and 95th percentiles, the horizontal bar represents the median, and the filled diamond represents the mean.

