### Sensitivity of Particulate Matter Concentrations to Revised Estimates of Onroad Ammonia Emissions

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### **Background**

- Nationwide, ammonia (NH<sub>3</sub>) emissions dominated by agriculture and fires
- $\circ~$  In urban areas, onroad vehicles are significant source of  $\rm NH_3\,emissions$ 
  - Light-duty gasoline vehicles: Catalytic reduction of NO to form NH<sub>3</sub> in three-way catalytic converter under fuel rich conditions
  - Heavy-duty diesel vehicles: Overdosing of urea in selective catalytic reduction (SCR) systems used to control NOx leads to "ammonia slip"
- EPA's Motor Vehicle Emission Simulator (MOVES)
  - Estimates onroad and nonroad vehicle emissions for EPA's emissions modeling platform
  - Onroad NH<sub>3</sub> emissions based on studies conducted in 2001 and earlier on limited number of vehicles



### **Motivation**

- Research suggests mobile-source NH<sub>3</sub> inventories in urban areas are underestimated by MOVES and the EPA emissions modeling platform
  - $\circ$  Sun et al. (2017) On-road measurements of NH<sub>3</sub>/CO<sub>2</sub> suggest that mobile-source NH<sub>3</sub> is more than 2 X higher than reported in the 2011 NEI
  - Moravek et al. (2019) and Emery et al. (2020) found better air quality model agreement to ammonia and ammonium-nitrate in Salt Lake City when mobile NH<sub>3</sub> increased by 2 X
- Arter et al. (2021) estimated that mobile-source ammonia emissions contribute to significant health burden
  - Estimated that NH<sub>3</sub> emissions have larger health impacts than NOx emissions from onroad vehicles in the northeastern United States

### **Objectives**

- Compare NH<sub>3</sub> emission rates in MOVES to recent remote sensing and road-side studies
- Estimate sensitivity of air quality to changes in onroad NH<sub>3</sub> emissions

### Light-Duty Remote Sensing Data (RSD)

- o RSD collected by University of Denver (see Bishop et al. 2015)
  - Over 335,000 light-duty gasoline vehicle-specific NH<sub>3</sub> observations made in campaigns conducted from 2005 to 2020 available at <u>http://www.feat.biochem.du.edu/</u>
  - Seven locations throughout the United States (four in California)
  - Each measurement includes vehicle model, model year/age, vehicle speed, and acceleration
- Fleet average measurements from University of Denver compare well to tunnel and onroad fleet NH<sub>3</sub>/CO<sub>2</sub> ratios (Sun et al. 2017)





State, City, Year CA FRES 2008 CA LANG 2008 CA\_LANG\_2013 CA LANG 2015 CA\_SAJO\_2008 CA\_VANU\_2010 CO DENV 2005 CO DENV 2013 CO DENV 2015 CO DENV 2017 CO DENV 2020 IL CHIC 2014 IL CHIC 2016 IL CHIC 2018 OK TULS 2005 OK\_TULS\_2013 OK TULS 2015 OK TULS 2017 OK\_TULS\_2019

Photo from Bishop et al. 2015 (Used with permission)

#### Model Year (MY) specific emission rates

- Significant model year effect observed in RSD emission rates
- Developed average rates for MY ranges where observed values are stable
- Derived MY-specific rates for periods of rapid change
- o After MY 2018, rates projected to remain the same
- Estimated separately for light-duty vehicles (LDV) and light-duty trucks (LDT)



- Age Effects
  - Significant age effect observed in lightduty remote sensing data
  - Estimated emission rates by model year and age group
  - For missing vehicle class, model year, and age combinations (e.g., age 2+ for MY 2018) applied the same age effects from earlier model years



- We assigned MOVES3 rates to each RSD observation based on
  - Vehicle class (LDV or LDT)
  - Model year (MY)
  - Vehicle age groups (e.g. 0-3, 4-5, 6-7)
  - Operating conditions (speed, acceleration)
- In the same way, we assigned the sensitivity rates newly developed to each RSD observation
- Finally, we averaged by MY to create the plot shown here
- RSD fuel-based emission rates are significantly higher than MOVES3 across all model years
- LHD Sensitivity emission rates capture the magnitude and trend of the RSD data
  - Small differences between RSD and Sensitivity rates are due to averaging across model year and vehicle age groups



- Time-based emission rates (g/hour) = fuelbased (gNH<sub>3</sub>/kg-fuel) rates from RSD x fuel consumption rates in MOVES (kg-fuel/hour)
  - Use MOVES fuel consumption rates by model year, vehicle class and running operating modes
  - Applied in MOVES run to estimate distancebased rate (g/mile) for individual calendar year and representative operating modes
- Similar trend observed in distance-based and fuel-based emission rates
  - Largest differences between sensitivity case and MOVES occurs for vehicles from ages 5 to 20 (Model years 1997-2012)



MOVES run CY 2017 — Sensitivity — MOVES3

### Heavy-duty (HD) Vehicle NH<sub>3</sub> Emission Data

#### Caldecott Tunnel outside Oakland, California (Preble, et al. 2019a)

- Over 900 diesel truck NH<sub>3</sub> measurements identified by model year
- Observed large increase in NH<sub>3</sub> emissions with trucks equipped with selective catalytic reduction (SCR) aftertreatment systems (MY 2010+)
- Measurements of pre-2010 MY heavy-duty diesel vehicles are low and uncertain
  - Comparable to previous measurements made in the Caldecott Tunnel in 2006

#### Peralta Weigh Station near Anaheim, California (Haugen et al. 2018)

- 1,844 diesel truck measurements
- Large increase in NH<sub>3</sub> in the 2017 campaign compared to previous campaigns, due to presence of MY 2010+ trucks





Caldecott Tunnel, Preble et al. 2019a

Peralta Weight Station, Haugen et al. 2018

Model Year*	Caldecott Tunnel (g/kg) <sup>1</sup>	Peralta Weigh Station (g/kg) <sup>2</sup>
2010-2018	0.18 <u>+</u> 0.07; N = 547	0.14
2007-2009	0.00 <u>+</u> 0.01; N = 181	~0
2004-2006 (no DPF)	0.00 <u>+</u> 0.01; N =24	~0
1960-2003	0.02 <u>+</u> 0.02; N = 62	~0
2018 HDD fleet average	0.1; N = 1167	0.09; N = 1844

\*With the 2010 NOx standards, HD diesel engines often lagged the chassis model year by 1 yr

<sup>1</sup> Engine model year

<sup>2</sup> Chassis model year

## Heavy-duty diesel NH<sub>3</sub> Rates for Sensitivity Analysis

- Converted fuel-based rates from Caldecott Tunnel study (Preble et al. 2018) to time-based rates
  - o Used model year groups from the Caldecott study
  - Used MOVES heavy-duty fuel consumption rates to convert to time-based emission rates
  - o No aging effect applied
  - Applied in MOVES run to estimate distance-based rate (g/mile)
- o Sensitivity rates based on Caldecott tunnel
  - $\circ~$  Lower than MOVES3 for pre-MY 2010 rates
  - Significantly larger than MOVES3 for MY 2010+
    - Variation in MY 2010+ due to improved fuel economy, and sales of non-SCR equipped diesel trucks
    - MY 2010-MY 2018 NH<sub>3</sub> rates applied to MY 2019 and later heavy-duty diesel vehicles



MOVES run CY 2017 — Sensitivity — MOVES3

### Onroad national emissions inventory impact



Replaced the MOVES3 emission rates with the sensitivity rates and ran MOVES for the entire U.S

All other inputs left as MOVES3 defaults

### AQ Model Run Methods/Description

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**Base-Case:** Annual 2017 Conterminous US simulation from the EPA's Air **QUA**lity **TimE S**eries (EQUATES) project

- <u>www.epa.gov/EQUATES</u>
- WRFv4.1.1 and CMAQv5.3.2
- 12 km horizontal resolution
- Chemistry: Carbon Bond 6, Aero7
- Deposition: Surface Tiled Aerosol-Gas Exchange (STAGE) Module with Bidirectional Ammonia (NH<sub>3</sub> BiDi) transfer.
- Emissions: 2017 NEI primary base year.
  - Onroad and nonroad inventories based on MOVES3 except for CA (EMFAC2017) and TX (TexN2 model)

#### 2017 Mobile NH<sub>3</sub> Sensitivity Case:

- Scaled onroad diesel NH<sub>3</sub> emissions by factor of **1.54**
- Scaled onroad non-diesel NH<sub>3</sub> emissions by factor **2.08**
- All other input data and parameters are held constant.





# 2017 Mobile NH<sub>3</sub> Compared to **Cr**oss-trac Infrared **S**ounder (CrIS) Observations



- 2017 Annual CMAQ and CrIS observations were matched in space and time plotted above
- Spatial patterns are similar
  - CMAQ overestimates concentrations in agricultural areas (typically several ppb) and underestimated concentrations elsewhere (typically less than 1 ppm)
  - CrIS overpass at 13:00 local time misses the mobile NH<sub>3</sub> emission peaks during morning and evening commutes

# National NH<sub>3</sub> Impacts (2017 Annual Mean)

- Modeled NH<sub>3</sub> concentrations compared to the Ambient Ammonia Monitoring Network (AMoN)
- Use of sensitivity-case onroad NH<sub>3</sub> emission factors reduce model bias at AMoN sites
  - Annual bias and error are reduced, by up to 1 μg m<sup>-3</sup>, at 96.8% and 93.7% of AMoN sites, respectively
- Cool colors and grey indicate reductions in biases and warm colors indicate increases in biases
- The size of the circle corresponds to the magnitude of the change in bias



### Mid-Atlantic Case Study

- CMAQ with Integrated Source Apportionment Method (ISAM) was run for 2016 for a Mid-Atlantic Subdomain
  - EQUATES inputs used
  - Multiple EGU, Mobile, Marine, and Agriculture sectors were considered
- Mobile NH<sub>3</sub> was a substantial fraction of the ambient NH<sub>3</sub> (up to 50% in January and 35% in July) along the I-95 Corridor
- NH<sub>3</sub> emission factors based on RSD and tunnel measurements increase this contribution from approximately 5% to 10% of the total ambient concentration
  - Reduced model bias and error by 10% and 4% in January and July respectively



# Impacts on Ambient Air Quality

- **PM<sub>2.5</sub> Enhancement:** Difference between sensitivity simulation and base-case.
  - Increases were dominated by NH<sub>4</sub>NO<sub>3</sub> during cooler months.
  - Largest enhancements were in NYCregion, followed by mid-Atlantic/upper Midwest and other urban cores.
  - Population-weighted state-wide increases in NJ/CT/NY region during cooler months: 0.3 – 0.4 μg m<sup>-3</sup>. Increases < 0.1 μg m<sup>-3</sup> during warm months.

Mobile  $PM_{2.5}$  Enhancement [ $\mu$ g m<sup>-3</sup>]



0.02

0.01

0.00

## AQ Sensitivity Conclusions

- Sensitivity-case NH<sub>3</sub> emission factors for onroad gasoline and diesel sectors roughly doubled overall mobile NH<sub>3</sub> emissions in CY2017
  - Note: Differences between MOVES3 and sensitivity-case mobile emissions vary across calendar years and fuel types
- $\circ$  Increases predicted urban NH<sub>3</sub> ambient concentrations by up to 2.3 ppbv in winter and 3.0 ppbv in summer. For winter, this could be up to 50% increase in urban NH<sub>3</sub>.

 $\circ$  Resulting PM<sub>2.5</sub> enhancements in Winter are up to 0.5 µg m<sup>-3</sup>.

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