



# Impacts of Differences in Land Use Characterization and Dry Deposition Schemes on AQMEII4 CMAQ Simulations

Christian Hogrefe, Jesse Bash, Jon Pleim, Donna Schwede,  
Rob Gilliam, Kristen Foley, Wyatt Appel, and Rohit Mathur

Atmospheric & Environmental Systems Modeling Division  
Center for Environmental Measurement & Modeling  
U.S. Environmental Protection Agency, RTP, NC, US

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**Disclaimer:** The views expressed in this presentation are those of the authors and do not necessarily reflect the views or policies of the U.S. EPA.

# Background

- Since 2009, the Air Quality Modeling Evaluation International Initiative (**AQMEII**) (<http://aqmeii.jrc.ec.europa.eu/>) has brought together a total of 37 modeling groups from 17 countries in North America and Europe
- AQMEII's goal is to **conduct coordinated research projects and model inter-comparison** exercises aimed at advancing model evaluation practices and informing model development.
- Previous phases have focused on **atmospheric concentrations and meteorological variables**
  - Phase 1 – Initial comparisons and proof of concept
  - Phase 2 – Coupled models; chemistry-meteorology feedbacks
  - Phase 3 – Global to regional modeling; effect of boundary conditions

# AQMEII4 Motivation and Objectives

## Motivation:

- Deposition remains a crucial process in the species budget of all air quality models, yet has not been systematically evaluated across multiple modeling systems
  - Past studies typically focused on specific modeling systems and deposition totals
- No systematic analysis exists of the individual and combined impacts of different representations of resistances, deposition media, land-use, and meteorological conditions on simulated total deposition

## Objectives of AQMEII Phase 4 Grid Model Intercomparison:

- Assess deposition processes in regional-scale models through a diagnostic evaluation and investigate the reasons for differences
- Assess the impact of the diversity of different land types and land type databases on model-estimated deposition
- Determine the range of variability of deposition estimates on a set of common land use (LU) types
- Assess the different methodologies to describe deposition pathways into and onto vegetation
- Assess the range of variability for estimated critical loads and critical load exceedances

**Parallel to the grid model intercomparison, AQMEII4 will also conduct a point intercomparison of dry deposition schemes using a collection of ozone flux measurements**

# AQMEII4 CMAQ Simulations

- **Years:** 2010 and 2016 (this presentation focuses on 2016)
- **Domain:** Contiguous U.S., southern Canada, northern Mexico at 12 km resolution
- **Model Version:** CMAQv5.3.1\*
  - CB6r3 chemical mechanism, aero7 aerosol scheme, bi-directional  $\text{NH}_3$  flux
  - Dry Deposition: M3DRY and STAGE\*
- **Meteorology:**
  - WRFv4.1.1 w/o lightning assimilation, MODIS LU
  - 2016 sensitivity: WRFv4.1.1 w/ NLCD40 LU
    - For MODIS, leaf area index and vegetation fraction were obtained from lookup tables while for NLCD40, these parameters were obtained directly from MODIS satellite products following Ran et al. (2016)
- **Emissions:**
  - Anthropogenic: 2010eo and 2016ff modeling platforms
  - Biogenic: BEIS inline
  - Lightning: GEIA climatology
- **Boundary Conditions:** Copernicus Atmospheric Monitoring Service (CAMS) reanalysis

# \*Use of M3DRY and STAGE for AQMEII4

## M3DRY

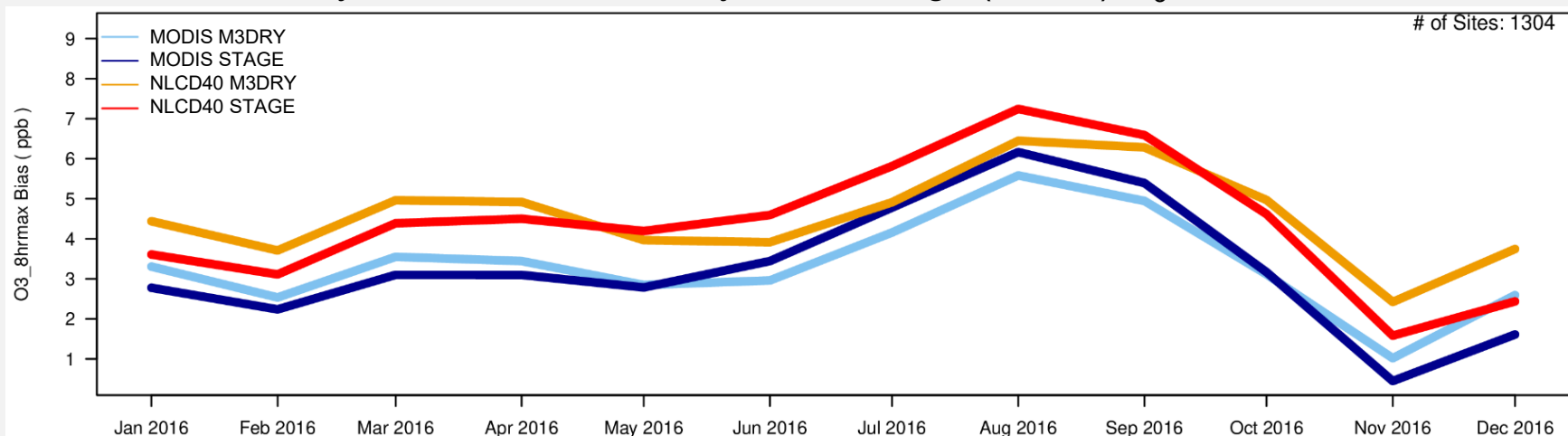
- The AQMEII4 simulations use M3DRY as implemented in the public release of CMAQv5.3.1
- A post-processor has been developed to compute LU-specific dry deposition (DDEP) fluxes and diagnostic variables (deposition velocities -  $V_d$ , component resistances, and conductances → slide 11) from standard CMAQ M3DRY output
  - Caveat: M3DRY in CMAQ is designed for maximum consistency with flux calculations in WRF. Specifically, M3DRY computes deposition fluxes at the grid scale and disaggregating these computations to specific land uses in the post-processor involves approximations. The post-processor is designed to maintain grid-scale deposition fluxes but aggregated diagnostic variables may differ from grid-scale values
- Mapping of computed LU-specific deposition fluxes and diagnostic variables from the WRF/CMAQ LU categories to the 16 AQMEII4 LU categories is performed at the post-processing step (→ slide 9)

## STAGE

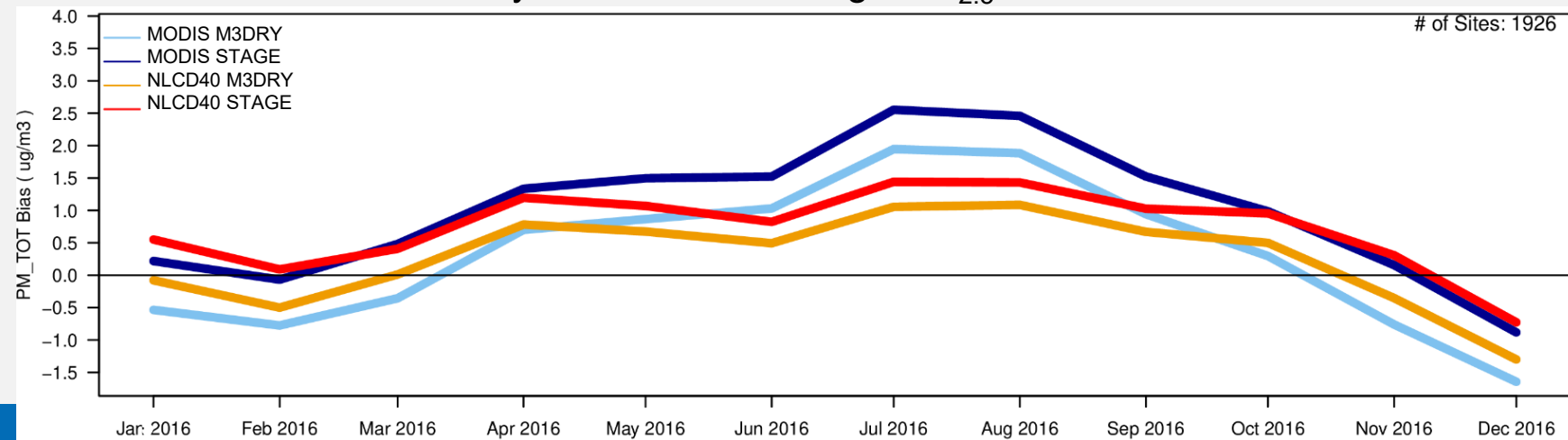
- The AQMEII4 simulations use a customized version of STAGE built on top of the version of STAGE in the public release of CMAQv5.3.1
- The custom version of STAGE calculates and outputs the LU-specific diagnostic variables ( $V_d$ , component resistances, and conductances → slide 11) desired in AQMEII4
- The version maps the WRF/CMAQ LU categories and associated deposition-related parameters to the 16 AQMEII4 LU categories (→ slide 9) when performing the dry deposition calculations, i.e. the STAGE dry deposition calculations are being performed directly for the 16 AQMEII4 LU categories

# 2016 Monthly Mean O<sub>3</sub> and PM<sub>2.5</sub> Bias Time Series

Monthly Mean Maximum Daily 8-hr Average (MDA8) O<sub>3</sub>, All AQS Sites



Monthly Mean 24-hr Average PM<sub>2.5</sub>, All AQS Sites



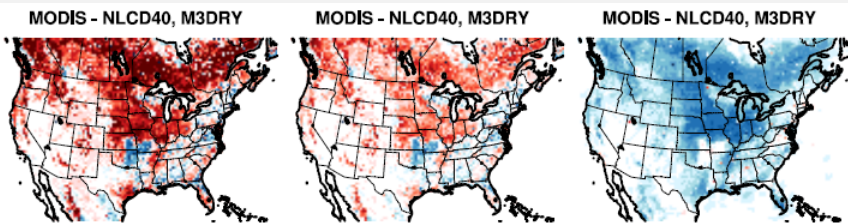
- The choice of land use and dry deposition schemes can have a noticeable impact on model performance
- The effect of MODIS vs. NLCD40 is comparable to the effect of M3DRY vs. STAGE
- Both simulations using MODIS have lower MDA8 O<sub>3</sub> bias than the simulations using NLCD40
- Diagnose reasons for differences
- Focus on O<sub>3</sub> in this presentation



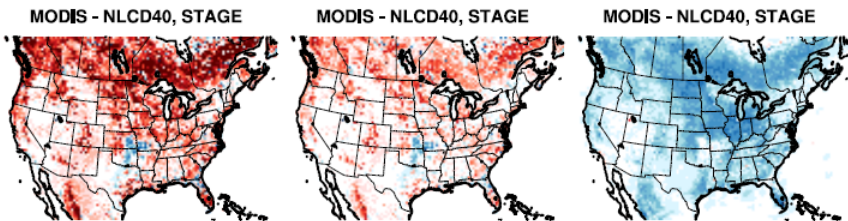
# Impacts of LU and DDEP Scheme on O<sub>3</sub> Vd, DDEP Flux, and Concentrations

**Δ Deposition Velocity** (summer av., cm/s)  
**Δ DDEP Flux** (summer total, kg/ha)  
**Δ Concentrations** (summer av., ppb)

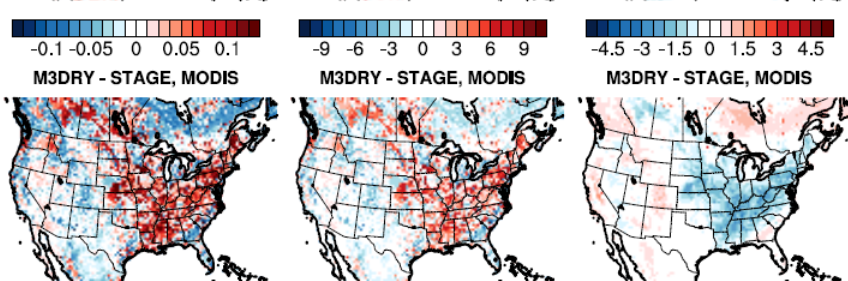
LU Effect,  
M3DRY



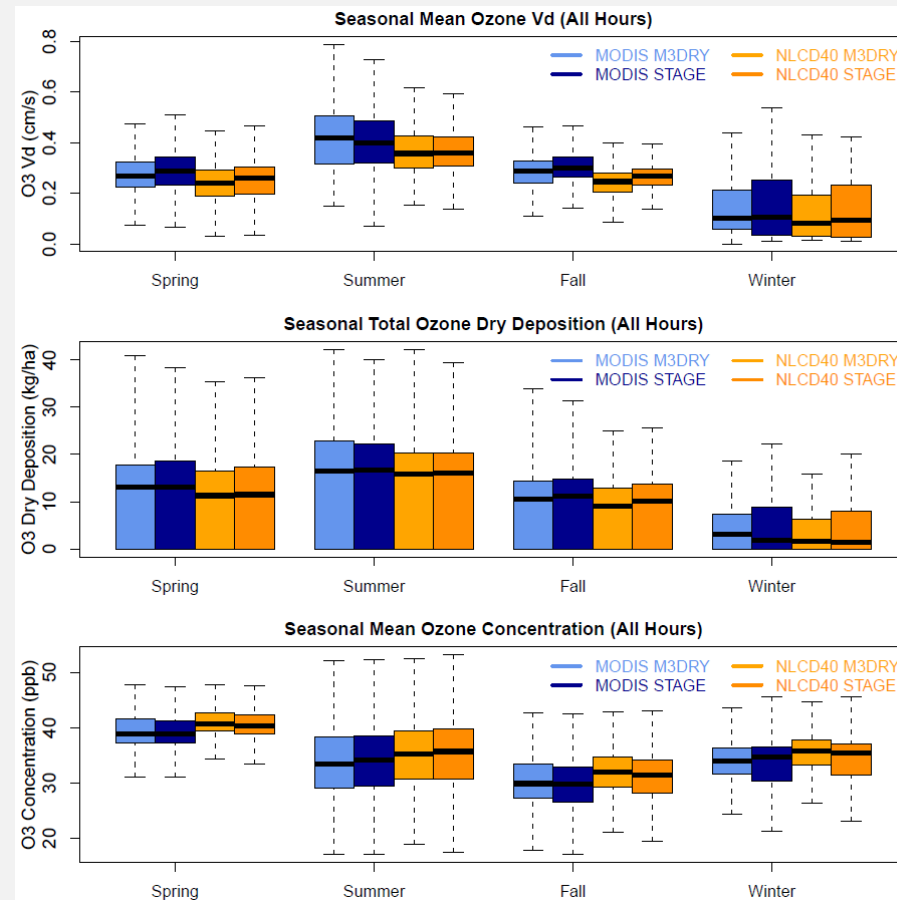
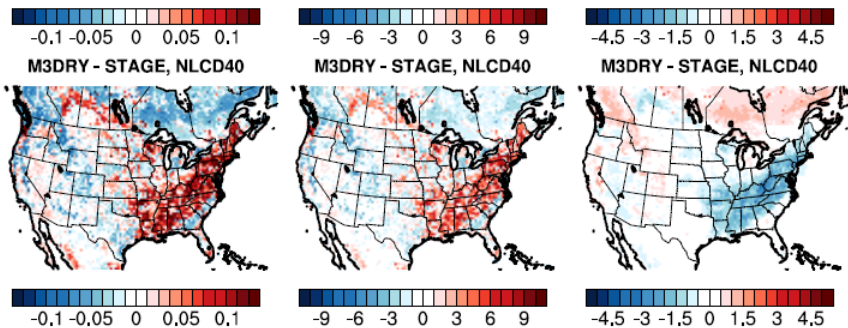
LU Effect,  
STAGE



DDEP Scheme  
Effect, MODIS



DDEP Scheme  
Effect, NLCD40



- The maps and box plots confirm that the patterns and differences in concentrations are linked to patterns and differences in DDEP through patterns and difference in Vd:  $DDEP = Vd * concentrations$
- Both LU differences and DDEP scheme differences affect Vd – perform a diagnostic investigation of the impacts of both

# Effect of MODIS vs. NLCD40 LU Schemes in CMAQ

- LU schemes used in WRF and the dry deposition module of CMAQ affect WRF and CMAQ calculations through the definition of LU types, the spatial distribution of these LU types, and the specification of parameters (surface roughness,  $u_*$ , etc.) associated with each LU type
- To enable the comparison of LU specific deposition effects across models, AQMEII4 defined a set of 16 LU types after surveying the LU schemes used by individual groups
- Use the AQMEII4 common LU types to compare the WRF/CMAQ MODIS and NLCD40 simulations for both M3DRY and STAGE



# Mapping of MODIS and NLCD40 LU to AQMEII4

## MODIS → AQMEII4

| MODIS_Cat                                 | MODIS_Name                         | AQMEII4_Cat  |
|-------------------------------------------|------------------------------------|--------------|
| 17                                        | water                              | AQMEII_01 '  |
| 13                                        | Urban and Built-up                 | AQMEII_02 '  |
| 16                                        | Barren or Sparsely Vegetated       | AQMEII_03 '  |
| 1                                         | Evergreen Needleleaf Forest        | AQMEII_04 '  |
| 3                                         | Deciduous Needleleaf Forest        | AQMEII_05 '  |
| 2                                         | Evergreen Broadleaf Forest         | AQMEII_06 '  |
| 4                                         | Deciduous Broadleaf Forest         | AQMEII_07 '  |
| 5                                         | Mixed Forest                       | AQMEII_08 '  |
| 6                                         | Closed Shrublands                  | AQMEII_09 '  |
| 7                                         | Open Shrublands                    | AQMEII_09 '  |
| 12                                        | Croplands                          | 'AQMEII_11 ' |
| 14                                        | Cropland-Natural Vegetation Mosaic | 'AQMEII_11 ' |
| 10                                        | Grasslands                         | 'AQMEII_12 ' |
| 8                                         | Woody Savanna                      | 'AQMEII_13 ' |
| 9                                         | Savanna                            | 'AQMEII_13 ' |
| 11                                        | Permanent Wetlands                 | 'AQMEII_14 ' |
| 18                                        | Wooded Tundra                      | 'AQMEII_15 ' |
| 19                                        | Mixed Tundra                       | 'AQMEII_15 ' |
| 20*                                       | Barren Tundra                      | 'AQMEII_15 ' |
| 15                                        | Snow and Ice                       | 'AQMEII_16 ' |
| *not present / not used in CONUS12 domain |                                    |              |

## AQMEII4 LU Categories

| AQMEII4_Category                                              | AQMEII4_Description         |
|---------------------------------------------------------------|-----------------------------|
| AQMEII_01                                                     | Water                       |
| AQMEII_02                                                     | Developed / Urban           |
| AQMEII_03                                                     | Barren                      |
| AQMEII_04                                                     | Evergreen needleleaf forest |
| AQMEII_05                                                     | Deciduous needeleaf forest  |
| AQMEII_06                                                     | Evergreen broadleaf forest  |
| AQMEII_07                                                     | Deciduous broadleaf forest  |
| AQMEII_08                                                     | Mixed forest                |
| AQMEII_09                                                     | Shrubland                   |
| AQMEII_10*                                                    | Herbaceous                  |
| AQMEII_11                                                     | Planted/Cultivated          |
| AQMEII_12                                                     | Grassland                   |
| AQMEII_13                                                     | Savanna                     |
| AQMEII_14                                                     | Wetlands                    |
| AQMEII_15**                                                   | Tundra                      |
| AQMEII_16                                                     | Snow and Ice                |
| *not present in CONUS12 domain with either<br>NLCD40 or MODIS |                             |
| **not present in CONUS12 domain with NLCD40                   |                             |

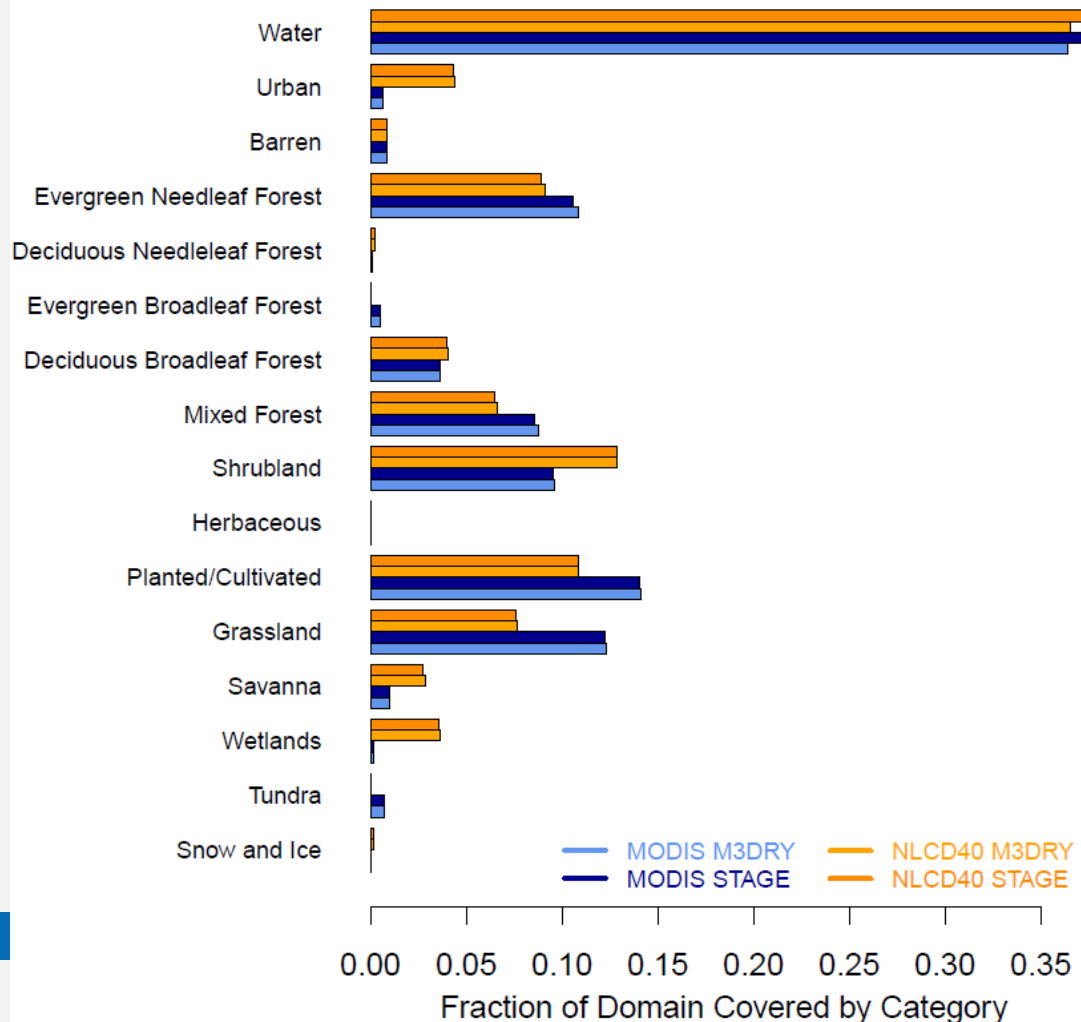
## NLCD40 → AQMEII4

| NLCD40_Cat                                | NLCD40_Name                        | AQMEII4_Cat  |
|-------------------------------------------|------------------------------------|--------------|
| 17                                        | water                              | AQMEII_01 '  |
| 18*                                       | water                              | AQMEII_01 '  |
| 19*                                       | water                              | AQMEII_01 '  |
| 20*                                       | water                              | AQMEII_01 '  |
| 21*                                       | water                              | AQMEII_01 '  |
| 13                                        | Urban and Built-up                 | AQMEII_02 '  |
| 23                                        | Developed open space               | AQMEII_02 '  |
| 24                                        | Developed Low Intensity            | AQMEII_02 '  |
| 25                                        | Developed Medium Intensity         | AQMEII_02 '  |
| 26                                        | Developed High Intensity           | AQMEII_02 '  |
| 16                                        | Barren or Sparsely Vegetated       | AQMEII_03 '  |
| 27                                        | Barren Land                        | AQMEII_03 '  |
| 1                                         | Evergreen Needleleaf Forest        | AQMEII_04 '  |
| 29                                        | Evergreen Forest                   | AQMEII_04 '  |
| 3                                         | Deciduous Needleleaf Forest        | AQMEII_05 '  |
| 2                                         | Evergreen Broadleaf Forest         | AQMEII_06 '  |
| 4                                         | Deciduous Broadleaf Forest         | AQMEII_07 '  |
| 28                                        | Deciduous Forest                   | AQMEII_07 '  |
| 5                                         | Mixed Forest                       | AQMEII_08 '  |
| 30                                        | Mixed Forest                       | AQMEII_08 '  |
| 6                                         | Closed Shrublands                  | AQMEII_09 '  |
| 7                                         | Open Shrublands                    | AQMEII_09 '  |
| 32                                        | Shrub/Scrub                        | AQMEII_09 '  |
| 34*                                       | Sedge/Herbaceous                   | 'AQMEII_10 ' |
| 12                                        | Croplands                          | 'AQMEII_11 ' |
| 14                                        | Cropland-Natural Vegetation Mosaic | 'AQMEII_11 ' |
| 37                                        | Pasture/Hay                        | 'AQMEII_11 ' |
| 38                                        | Cultivated Crops                   | 'AQMEII_11 ' |
| 10                                        | Grasslands                         | 'AQMEII_12 ' |
| 33                                        | Grassland/Herbaceous               | 'AQMEII_12 ' |
| 8                                         | Woody Savanna                      | 'AQMEII_13 ' |
| 9                                         | Savanna                            | 'AQMEII_13 ' |
| 11                                        | Permanent Wetlands                 | 'AQMEII_14 ' |
| 39                                        | Woody Wetland                      | 'AQMEII_14 ' |
| 40                                        | Emergent Herbaceous Wetland        | 'AQMEII_14 ' |
| 31*                                       | Dwarf Scrub                        | 'AQMEII_15 ' |
| 35*                                       | Lichens                            | 'AQMEII_15 ' |
| 36*                                       | Moss                               | 'AQMEII_15 ' |
| 15                                        | Snow and Ice                       | 'AQMEII_16 ' |
| 22*                                       | Perennial Ice/snow                 | 'AQMEII_16 ' |
| *not present / not used in CONUS12 domain |                                    |              |

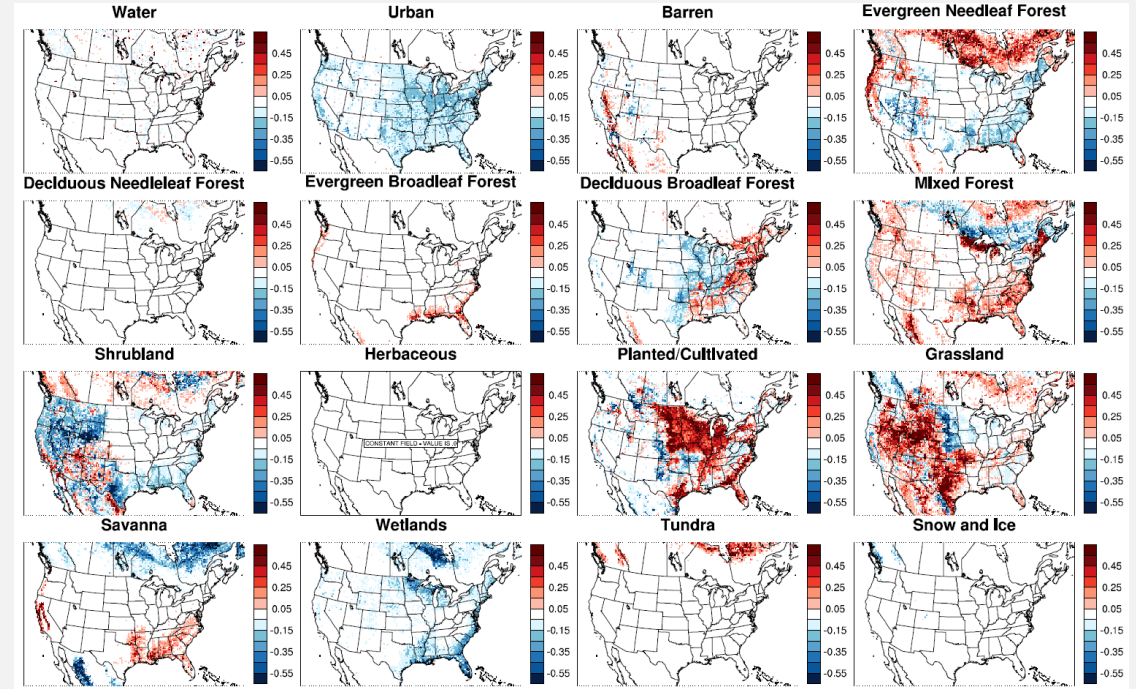
The same mapping is used in both STAGE (as part of the AQMEII4 CMAQ STAGE configuration) and M3DRY (after post-processor estimation of LU-specific fluxes)

# Comparison of MODIS and NLCD40 LU Category Coverages in the 12 km CMAQ Modeling Domain

Fractional Domain-Wide Coverage for Each AQMEII4 LU Category



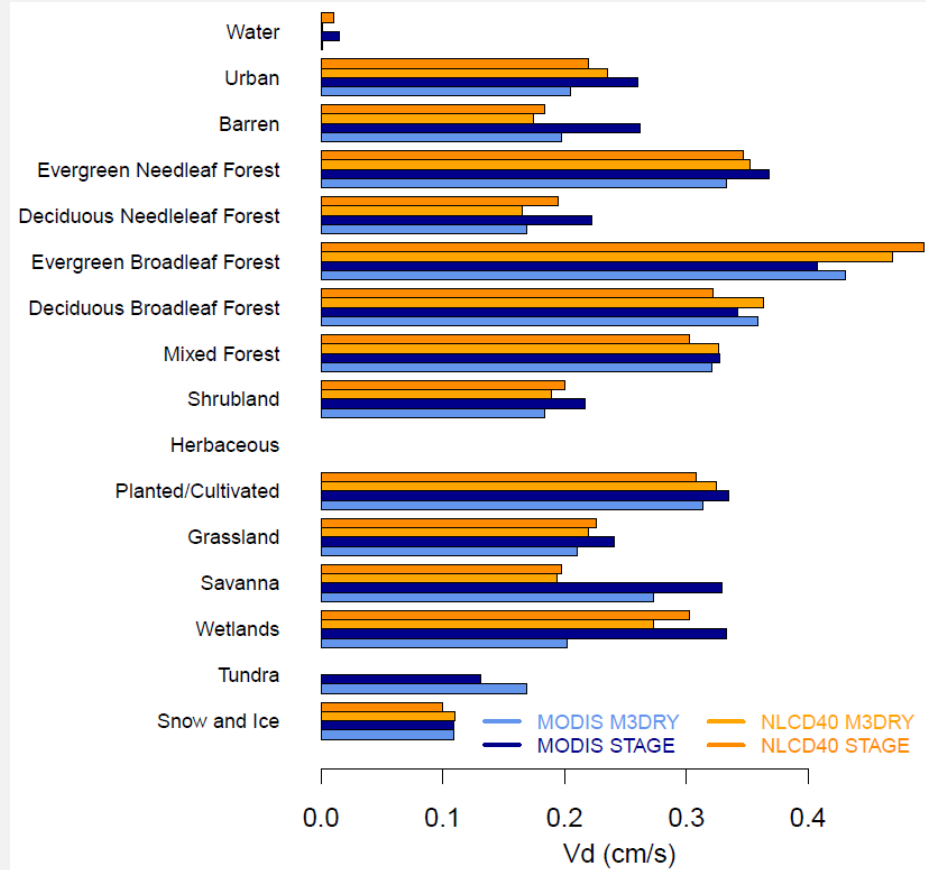
Difference in Fractional LU Coverage  
MODIS – NLCD40, M3DRY



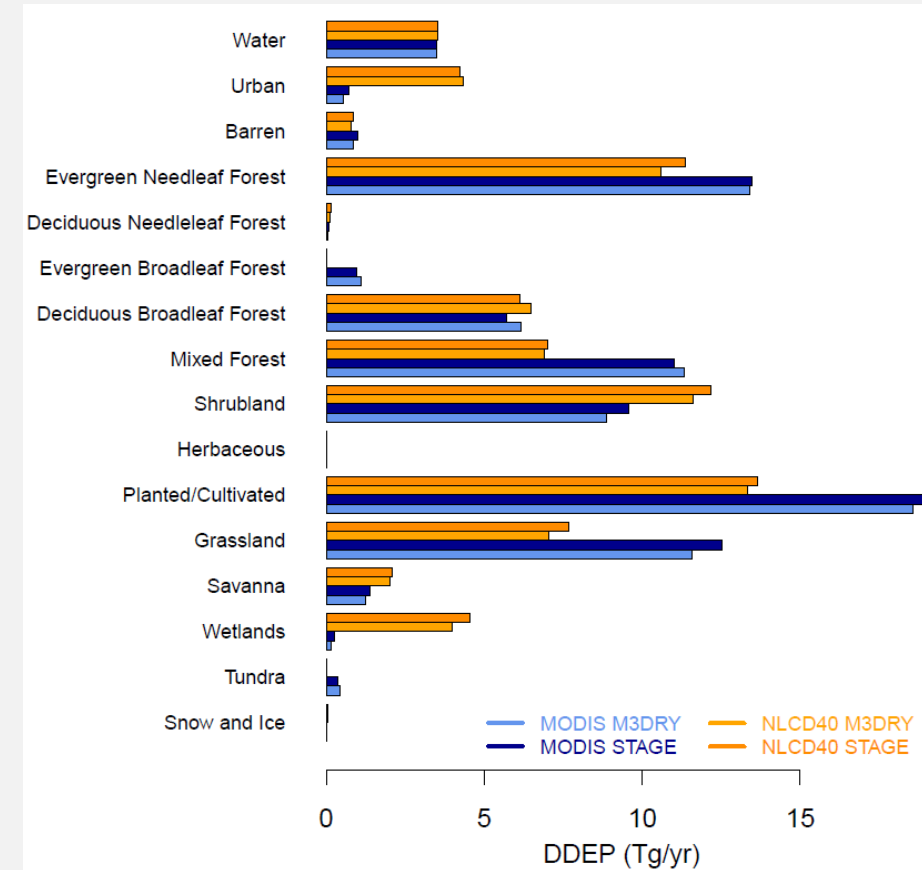
- MODIS has greater fractional coverage for grassland, planted/cultivated, and mixed and evergreen needleleaf forest, and lower coverage for urban and shrubland than NLCD40
- Minor differences in coverage for a given LU scheme between M3DRY and STAGE due to different approaches for representing partial-water grid cells

# Comparison of O<sub>3</sub> Vd and DDEP by LU

Annual Mean Vd for Each AQMEII4 LU Category



Annual Mean DDEP for Each AQMEII4 LU Category



Higher fraction of LU categories with higher Vd (e.g. grassland, planted/cultivated, and forests → slide 10) and lower fractions of LU categories with lower Vd (urban, shrubland → slide 10 ) in the MODIS case result in higher deposition amounts and lower concentrations, both for M3DRY and STAGE

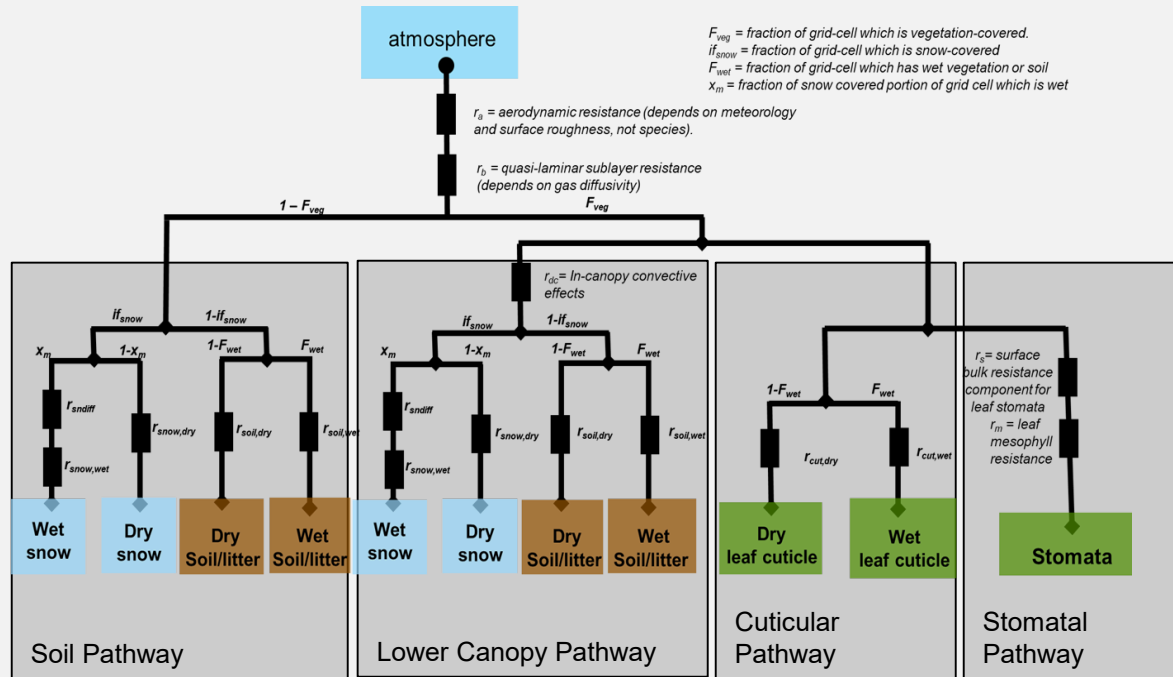
→ the results suggest that the MODIS vs. NLCD40 differences are driven by differences in the fractional coverages of different LU types rather than differences in the specification of LU-specific surface characteristics

# Comparing Dry Deposition Across Different Schemes

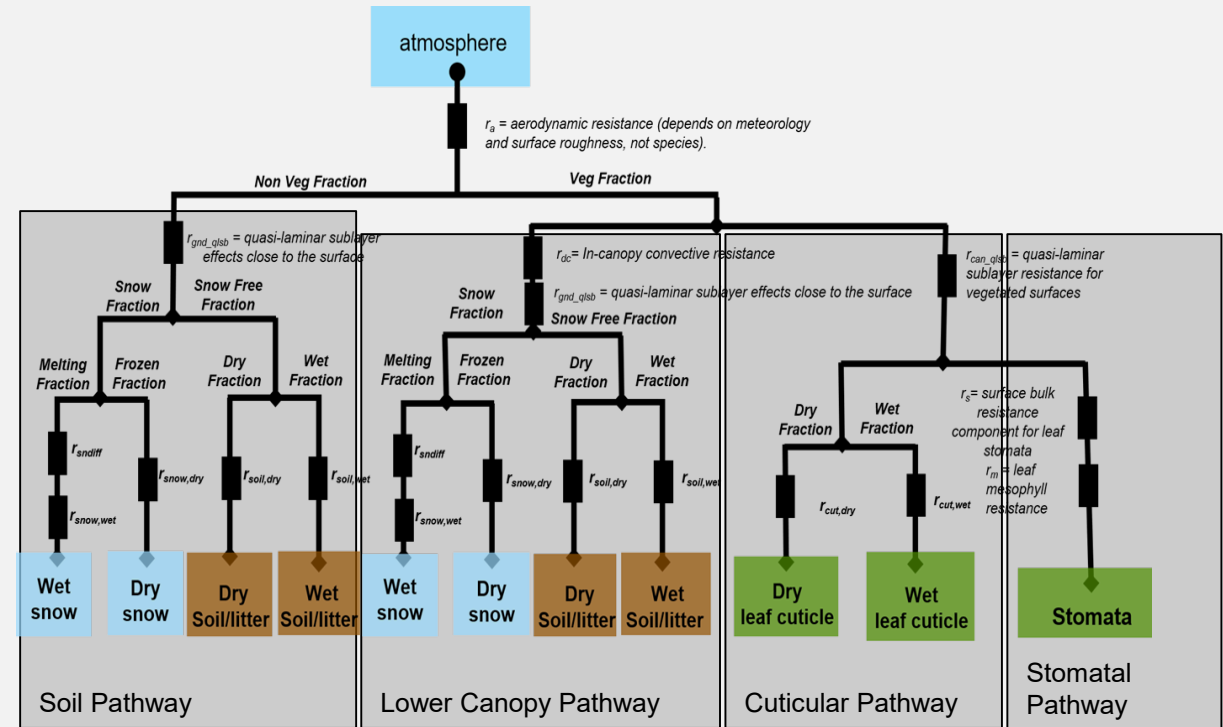
- While dry deposition schemes in regional-scale models have some resistance terms in common, the details vary considerably across models
- Despite these differences between different resistance formulations, common deposition pathways may be compared using the concept of **effective conductance**
- An **effective conductance** is the contribution of a given depositional pathway to  $V_d$ , in the same units as  $V_d$  (Clifton et al., 2020):
  - **Four depositional pathways: soil, lower canopy, cuticle and stomata**
  - For each pathway, the denominator in the equation to calculate the effective conductance is the inverse of the bulk surface resistance  $r_c$ , while the numerator is the inverse of the resistances associated with that pathway in a scheme
  - The formulation of effective conductances thus differs between models, the next slide provides a schematic representation for M3DRY and STAGE
- Once calculated, effective conductances can be used to determine **which deposition pathways** for surface resistance **drive net deposition** and to **characterize** model-to-model, spatial, and temporal **variability in modeled dry deposition**
- This approach is used in AQMEII4 to compare dry deposition across models
- The following slides show the application of this approach to the comparison of CMAQ M3DRY and STAGE

# Schematic Representation of M3DRY and STAGE

## M3DRY



## STAGE

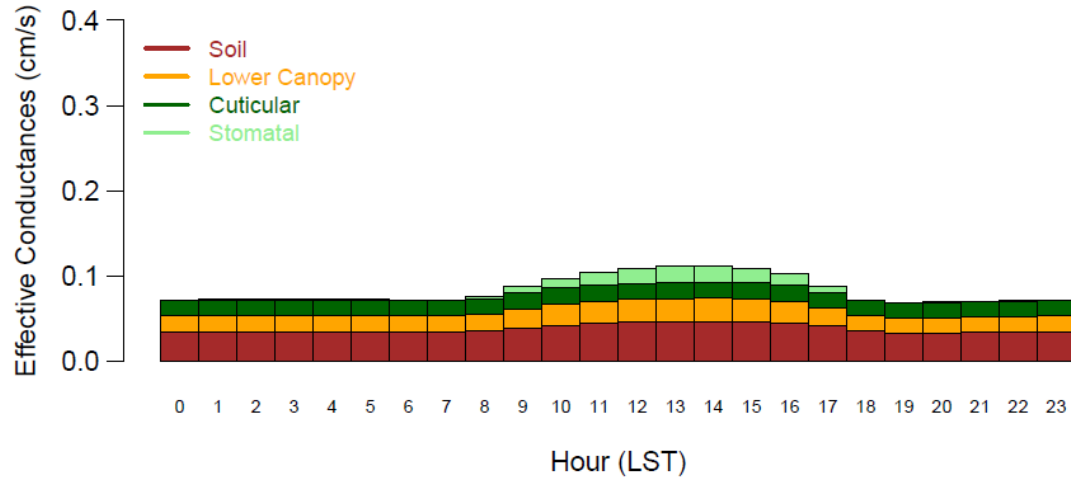


- The main schematic difference is the use of pathway-specific quasi-laminar sublayer resistances in STAGE
- The computation of component resistances (e.g. dry cuticle resistance –  $r_{cut,dry}$  or dry soil resistance –  $r_{soil,dry}$ ) differs between both schemes → in addition to computing the four effective conductances, AQMEII4 participants will also provide key resistance value common to most schemes

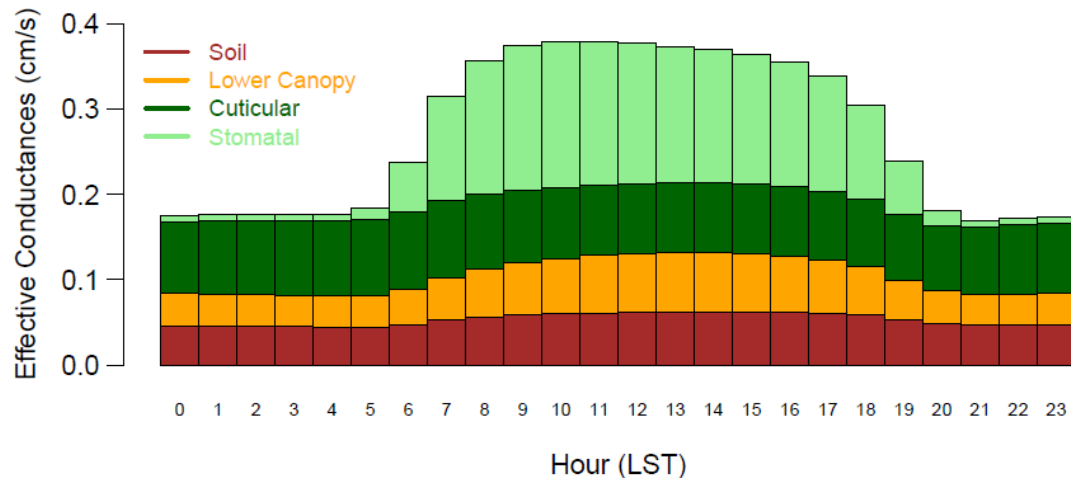


# Spatial and Temporal Variability of Grid-Scale Effective Conductances – Example: MODIS STAGE

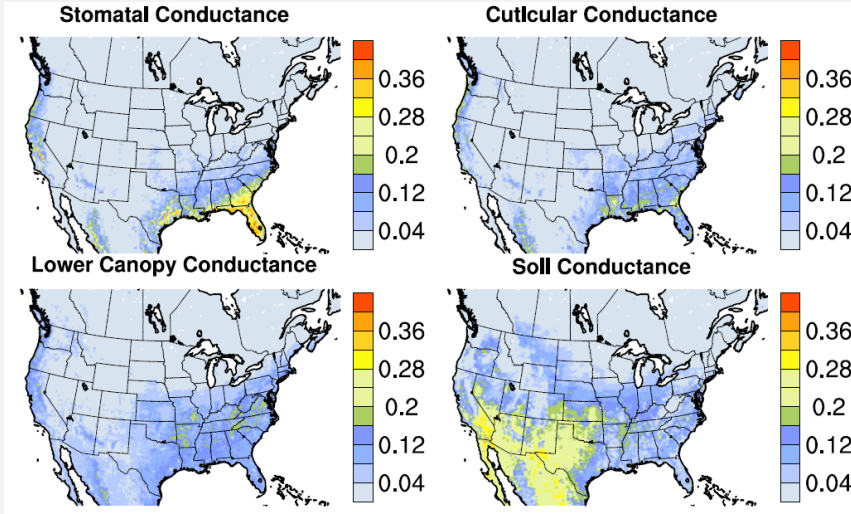
Effective Conductances January



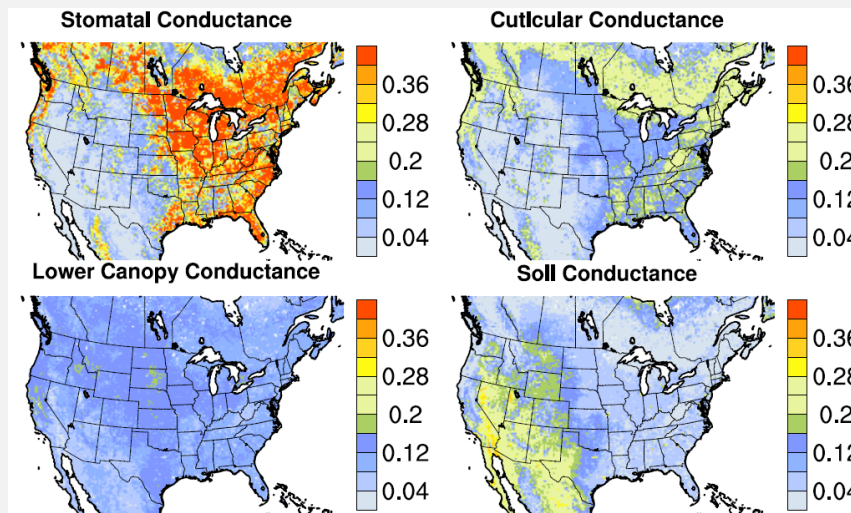
Effective Conductances July



Winter 2 pm (LST) Seasonal Average



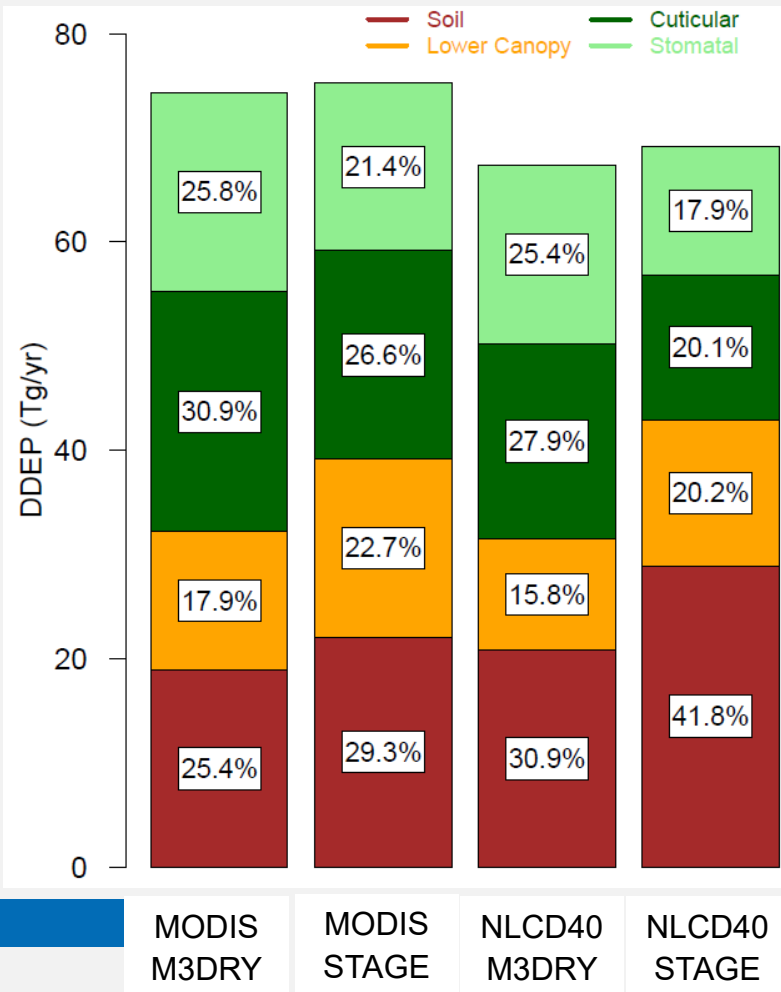
Summer 2 pm (LST) Seasonal Average



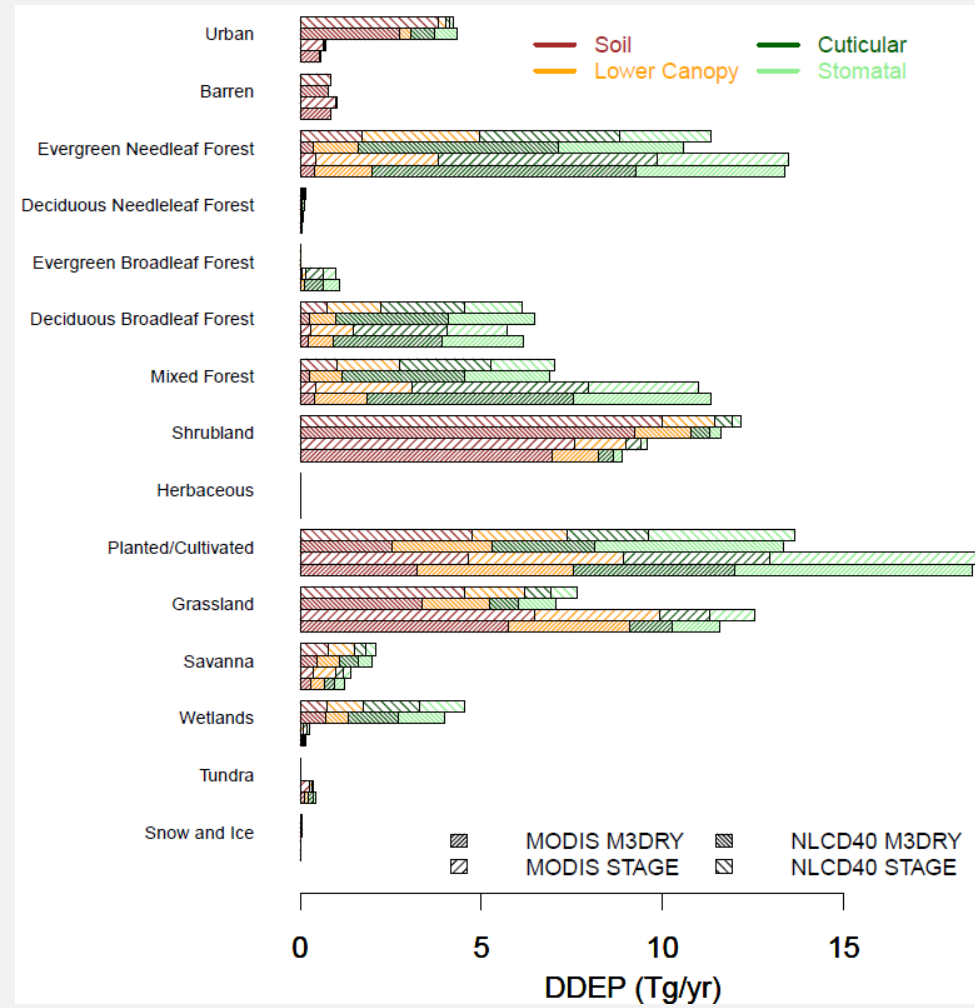
- The magnitudes of the four dry deposition pathways vary diurnally, seasonally, and spatially
- This variation is most pronounced for the stomatal pathway due to its dependence on solar radiation and leaf area
- Similar variability is seen for M3DRY

# Annual Total Grid-Scale and LU-Specific O<sub>3</sub> DDEP by Pathway for All Simulations

Annual Domain-Total O<sub>3</sub> DDEP by Pathway (excl. Water Cells)



Annual Domain-Total O<sub>3</sub> DDEP by Pathway and LU (excl. Water)



- Generally greater contribution to DDEP from stomatal and cuticular pathways and lower contribution from lower canopy and soil pathways in M3DRY compared to STAGE
- As expected, the relative importance of pathways varies by LU type due to variations in vegetation coverage
- Comparing pathway and LU-specific Vd and DDEP across models provides diagnostic insights into model behavior
- Such comparisons performed as part of AQMEII4 are also expected to be useful for informing the use of model output for ecosystem impact assessments such as critical load analyses



# Summary

- In the WRF/CMAQ simulations analyzed here, the effects of MODIS vs. NLCD40 LU classification schemes on  $O_3$  are comparable to the effects of different dry deposition modules (M3DRY vs. STAGE)
  - Systematic differences between LU class distributions affect CMAQ dry deposition fluxes
  - The MODIS setup yields consistently lower  $O_3$  than the NLCD40 setup
- Effects of CMAQ dry deposition module (M3DRY vs. STAGE):
  - Generally higher summer  $O_3$  and lower winter  $O_3$  in STAGE than M3DRY
  - Generally greater contribution to DDEP from stomatal and cuticular pathways and lower contribution from lower canopy and soil pathways in M3DRY compared to STAGE
- Comparing pathway and LU-specific  $V_d$  and DDEP across models provides diagnostic insights into model behavior
- AQMEII4 will expand this type of analysis across several other air quality models and their deposition schemes