

TRANSPORTATION RESEARCH BOARD

TRB Webinar: Air Quality Impact Models for Electric Vehicle Fleets

October 21, 2021

2:00- 3:30 PM Eastern

@NASEMTRB
#TRBwebinar

PDH Certification Information:

- 1.5 Professional Development Hours (PDH) – see follow-up email for instructions
- You must attend the entire webinar to be eligible to receive PDH credits
- Questions? Contact Beth Ewoldsen at Bewoldsen@nas.edu

#TRBwebinar

The Transportation Research Board has met the standards and requirements of the Registered Continuing Education Providers Program. Credit earned on completion of this program will be reported to RCEP. A certificate of completion will be issued to participants that have registered and attended the entire session. As such, it does not include content that may be deemed or construed to be an approval or endorsement by RCEP.



REGISTERED CONTINUING EDUCATION PROGRAM

Learning Objectives

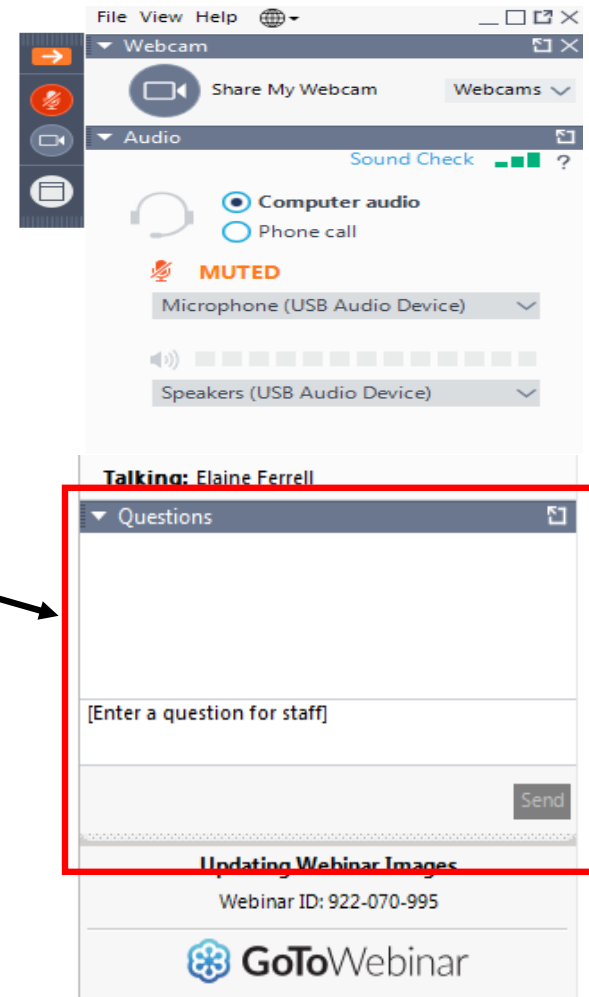
- Determine modeling load requirements and energy consumption of EVs with varying driving behavior
- Identify renewable and non-renewable generation of electricity and supplying to grids

#TRBwebinar



Questions and Answers

- Please type your questions into your webinar control panel
- We will read your questions out loud, and answer as many as time allows



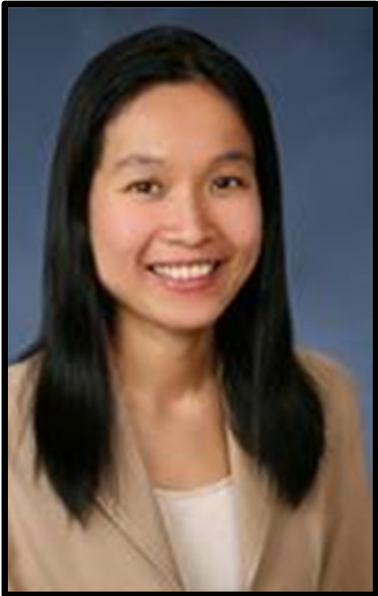
#TRBwebinar



Thomas
Bradley
thomas.bradley@colostate.edu
*Colorado State
University*



Marcus
Alexander
malexander@epri.com
*Electric Power
Research Institute*



Uarporn
Nopmongcol
unopmongcol@ramboll.com
Ramboll



Eladio Knipping
eknipping@epri.com
*Electric Power
Research Institute*

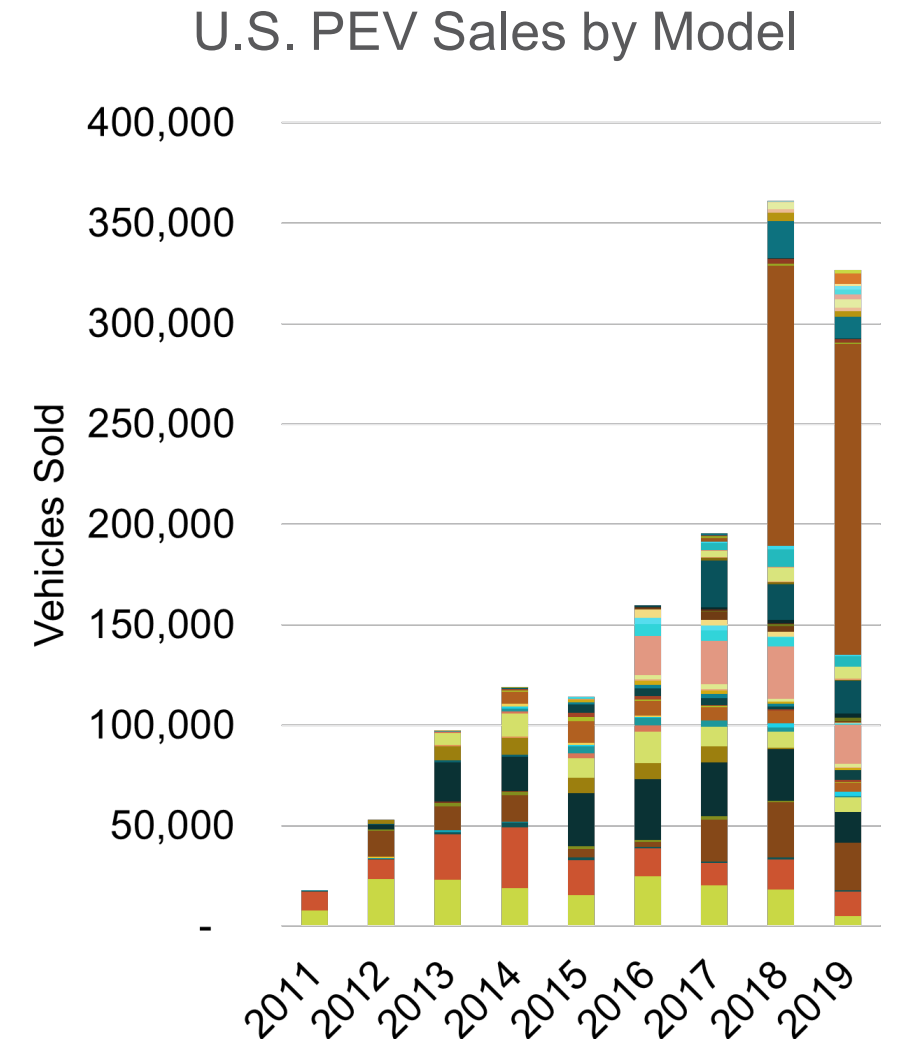
Understanding electric vehicle operation for air quality modeling

Thomas Bradley, thb@colostate.edu

www.engr.colostate.edu/se

Background on Electric Vehicles

- The US is undergoing a transition towards a full electrification of the personal and commercial transportation fleet
- Driven by:
 - Consumer Preference
 - Supply-side Policy (driven by Air Quality and GHG Emissions consideration)
 - Personal and Commercial Economics
 - Sustainability



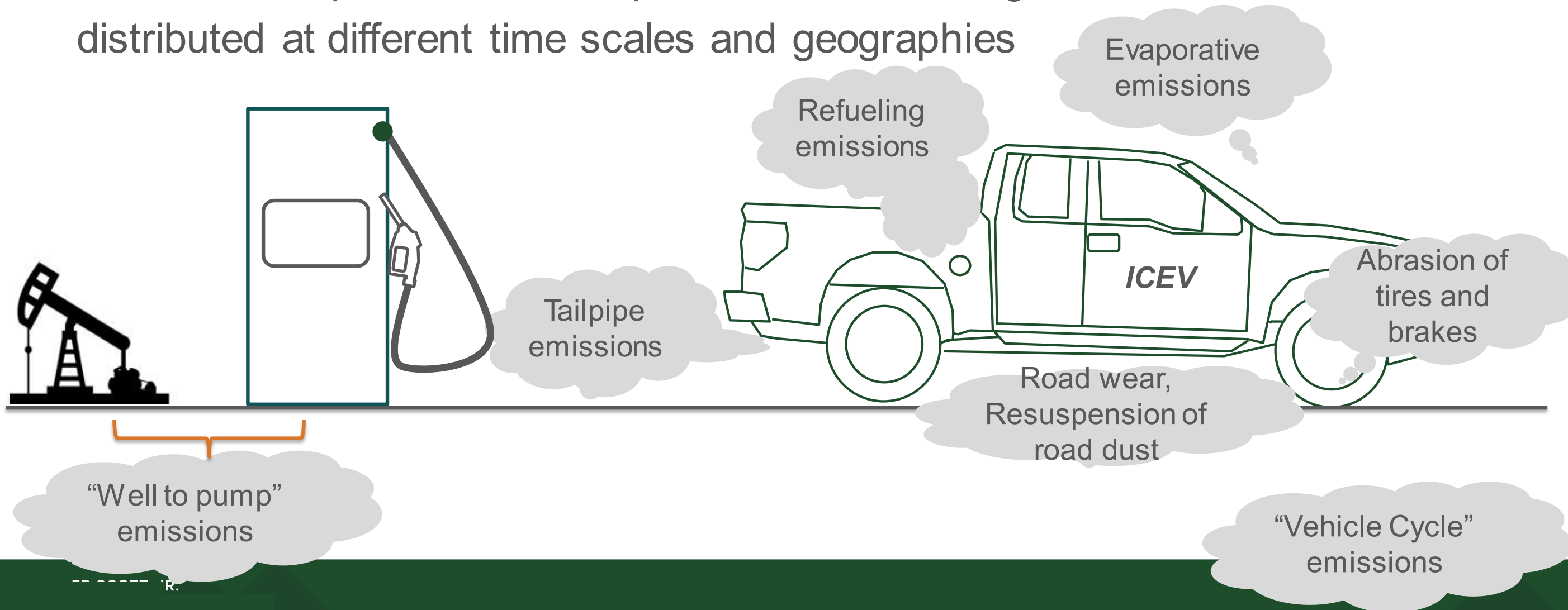
Understanding electric vehicle operation for air quality modeling

Discussion points for this presentation:

- Characterizing Battery Electric Vehicle and Plug-in Hybrid Electric Vehicle operational emissions
- The personal and commercial fleet makeup limits the rate and “end-state” of the transportation system transition

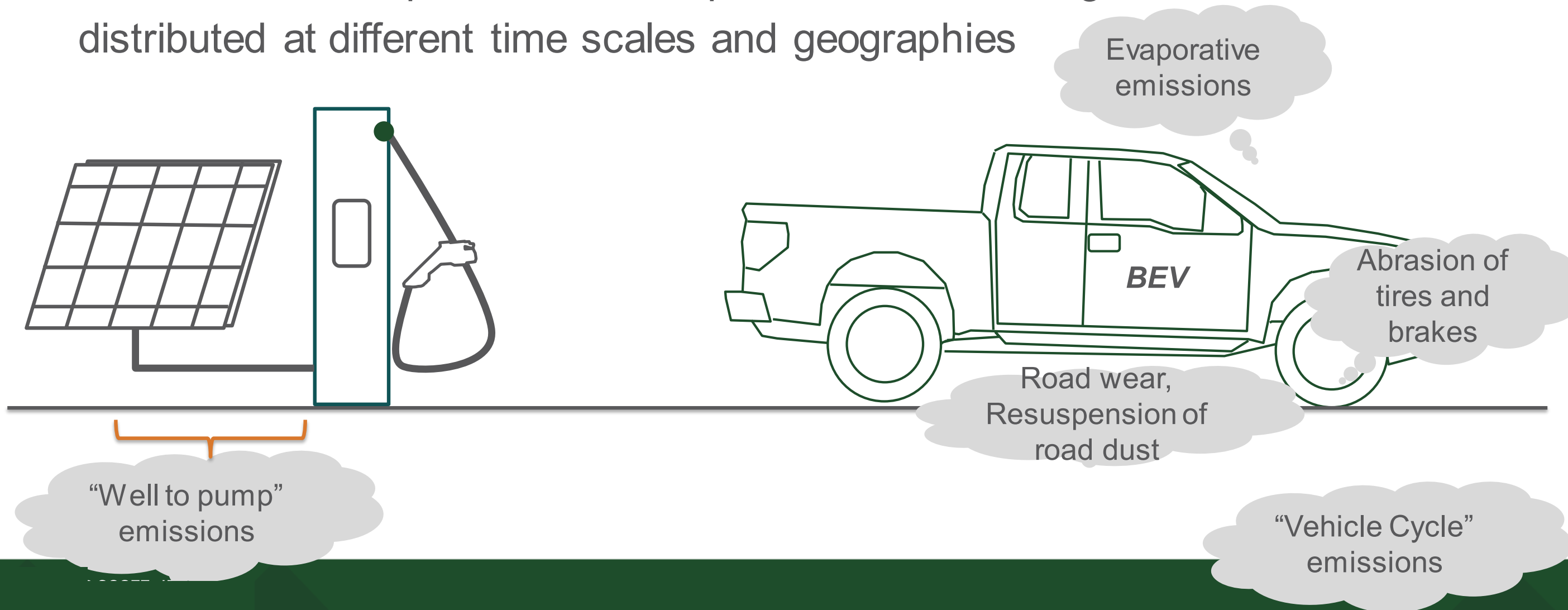
Characterizing BEV and PHEV emissions in operation

- ICEVs have operational and upstream emissions, generated and distributed at different time scales and geographies



Characterizing BEV and PHEV emissions in operation

- BEVs also have operational and upstream emissions, generated and distributed at different time scales and geographies



Characterizing BEV and PHEV emissions in operation

- *Later talks will emphasize the impacts of the electricity fuel-cycle
- Many of the sources of operational emissions are controlled and modeled by regulatory limits
 - Tailpipe emissions, evaporative emissions, refueling emissions
- Vehicle cycle emissions are the subject of considerable debate, especially in modeling many of the novel and lower-quantity components of BEVs (batteries, motors)
 - https://doi.org/10.1007/978-3-319-48768-7_11 , <https://doi.org/10.3390/batteries5020048>

Characterizing BEV and PHEV emissions in operation

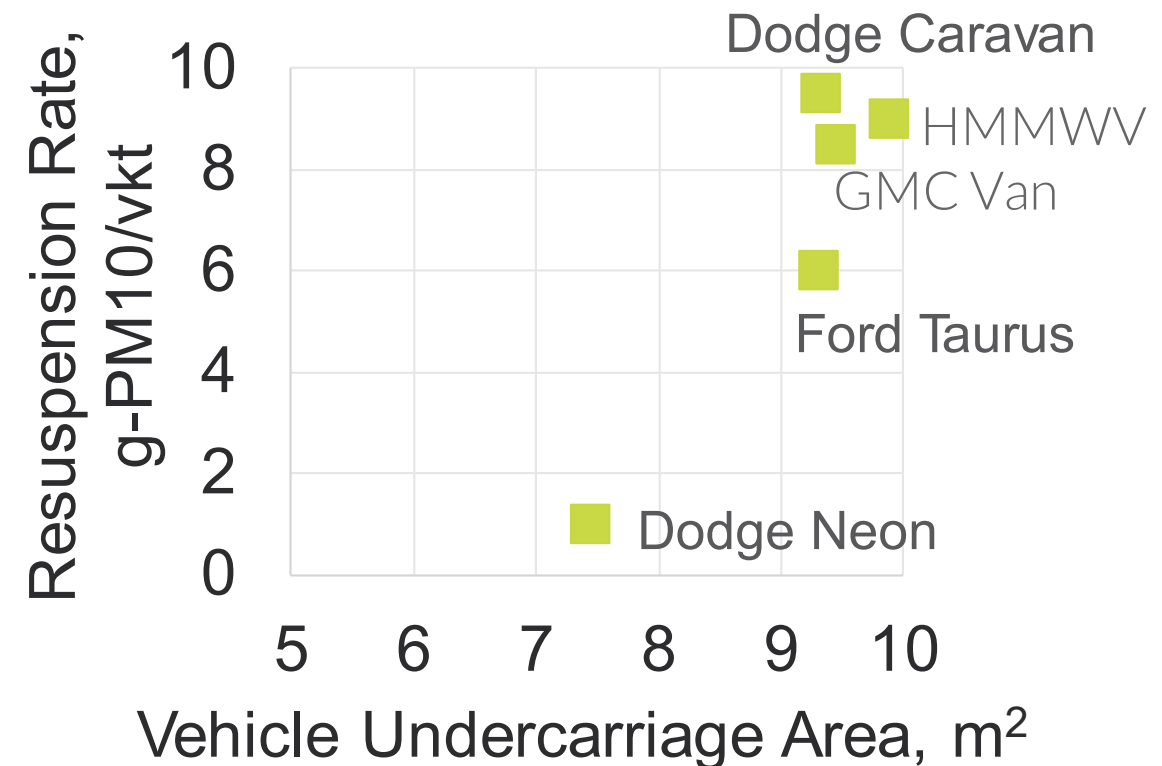
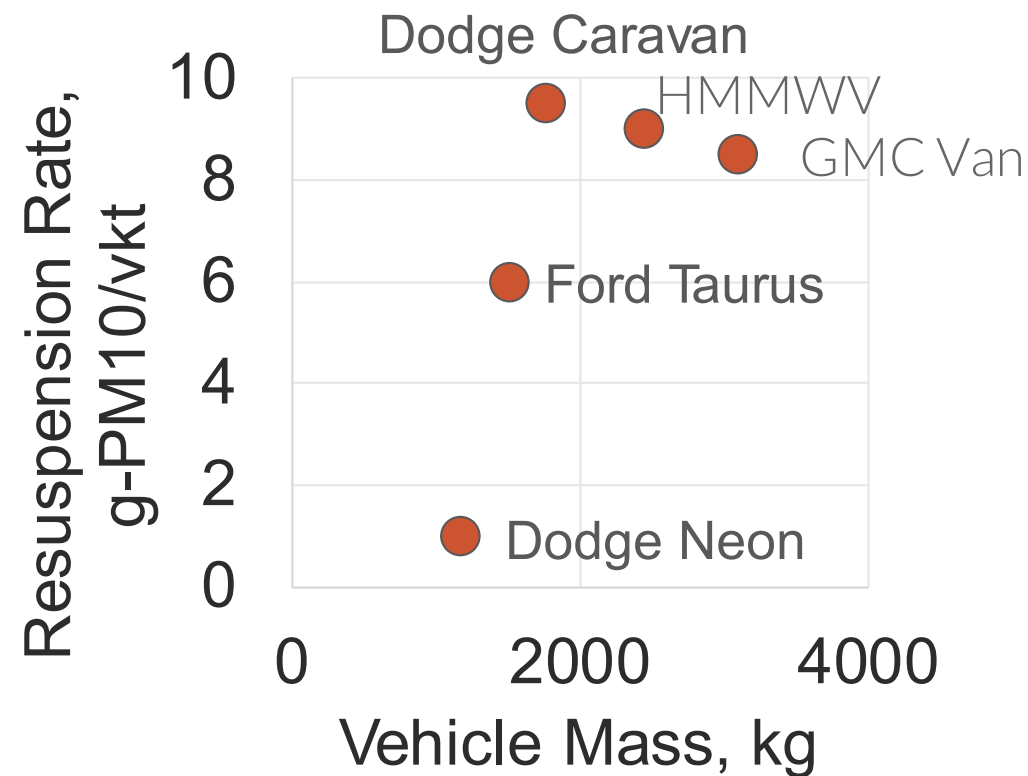
- Brake abrasion is a source of PM2.5, PM10
 - BEVs and PHEVs both have two sources of braking on board the vehicle, regenerative braking and friction braking
 - All data available today are estimates, but typical estimates are that BEV/HEV brakes wear at 35% - 50% of the rate of ICEVs [link](#), [link](#)
- Tire/road abrasion is a source of PM2.5, PM10
 - Tire/Road abrasion emissions are driven by vehicle mass, [link](#)
 - Early PHEVs/BEVs were heavier than ICEV analogues
 - Weight difference will reduce with XEV-centric platforms
 - MachE is only 15% heavier than Mustang



BEV conversions are 25% heavier (curb weight)

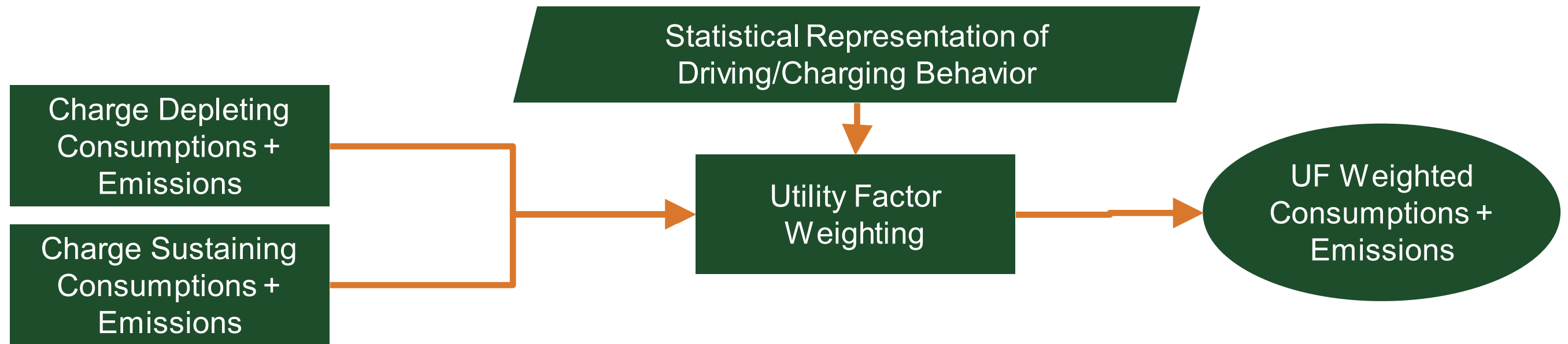
Characterizing BEV and PHEV emissions in operation

- Resuspension
 - BEVs are often allocated increased resuspension emissions due to increased mass, but cited relations are weak within relevant ranges of mass (data from [link](#))



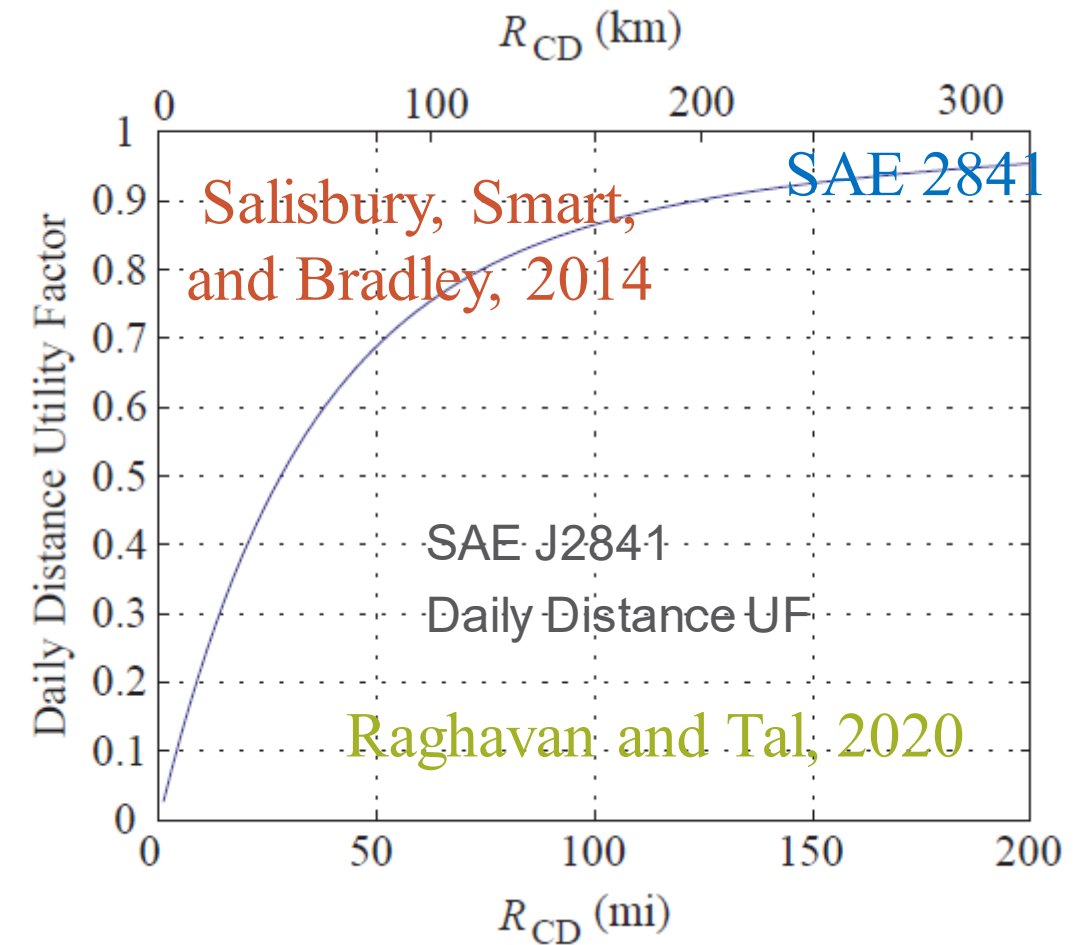
Characterizing BEV and PHEV emissions in operation

- PHEVs projected to make up to ~20% of the PEV vehicle fleet until 2035
- PHEVs are plug in electric vehicles that can operate in both an all-electric mode for a limited distance (R_{CD}), or as a hybrid (ICE-powered mode)



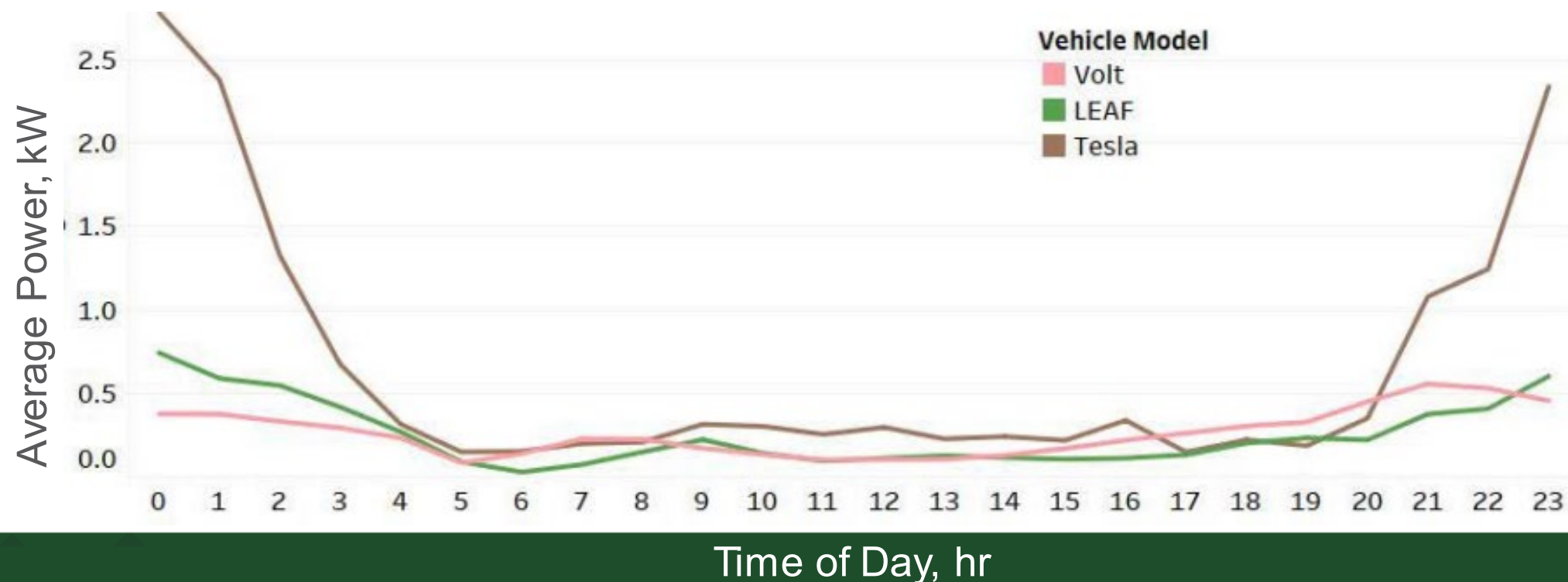
Characterizing BEV and PHEV emissions in operation

- There are standards for UF weighting based on survey
- There are UFs calculatable from real-world operation data
 - UFs (and thereby PHEV emissions and consumptions) are sensitive to assumptions of
 - Charging, vehicle age, number of vehicles in the household, etc.



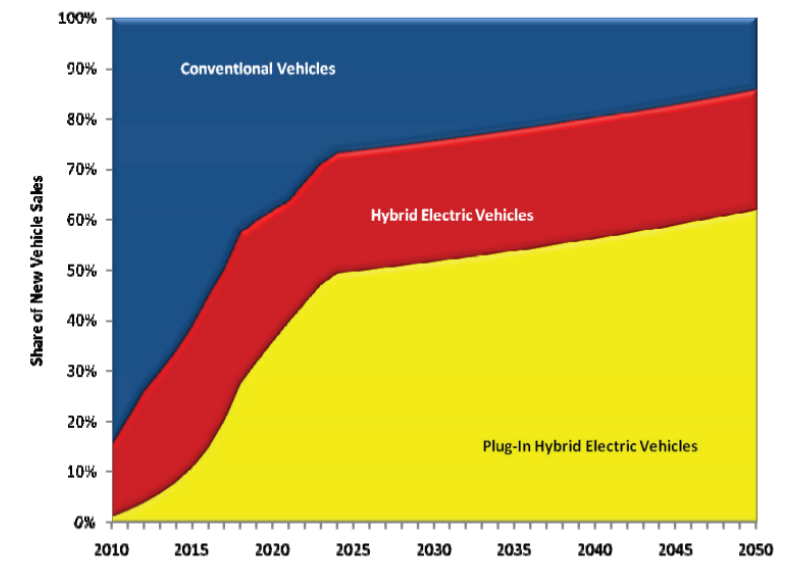
Characterizing BEV and PHEV emissions in operation

- The result is that uncontrolled BEVs and PHEVs use electricity at particular times of the day, times of the week ([link](#))
 - Might be controllable through TOU rates, managed charging, education, etc.

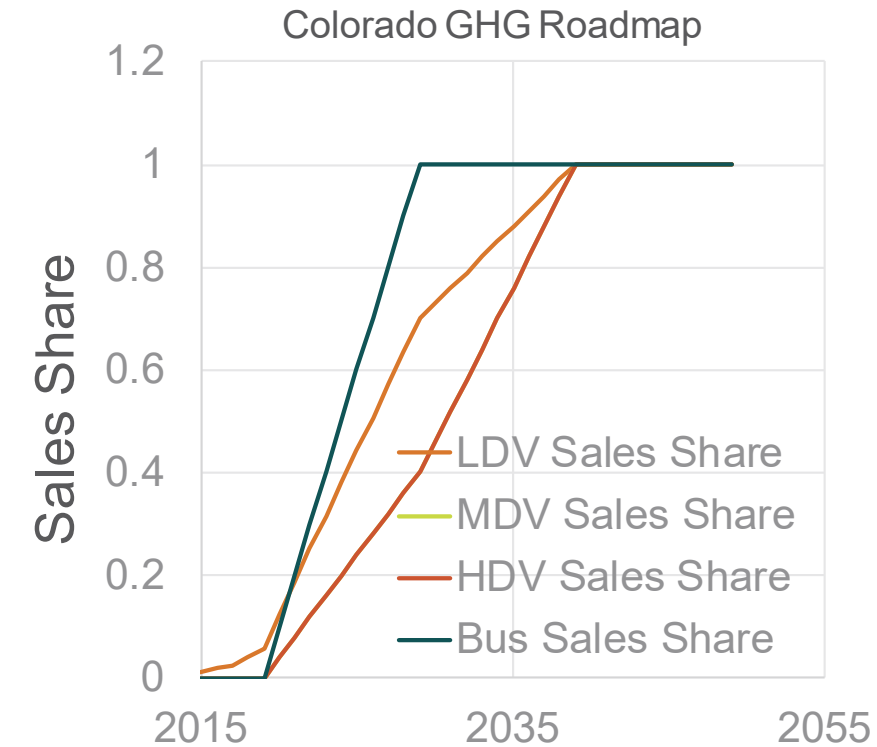


The Transitions to PEVs

- We often think about transportation's transition to electrification as being “a” transition ([link](#), [link](#))
- In reality, it is going to be a series of transitions that will occur:
 - in all sectors of the transportation fleet, and
 - at different times for different parts of the US



Assumed new car market share for the Medium PHEV scenario for conventional vehicles, hybrid electric vehicles, and plug-in hybrid electric vehicles for each vehicle category



The Transitions to PEVs

- Electric vehicle sales are not evenly distributed geographically across the US ([link](#))
- Regions with policy incentives, charging infrastructure investments, education and awareness programs are early adopters
- Customers with roof-top solar, or energy storage are early adopters

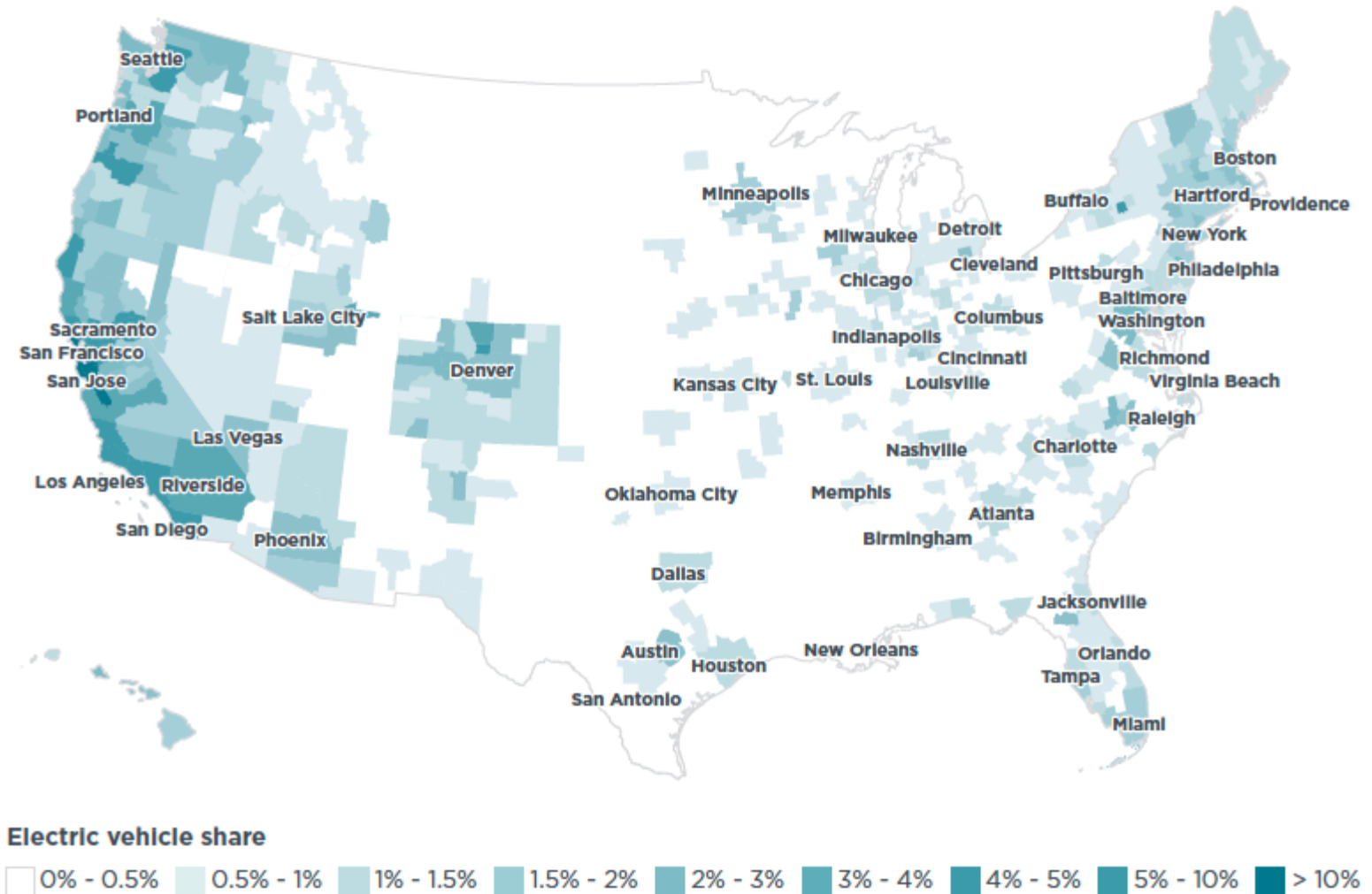
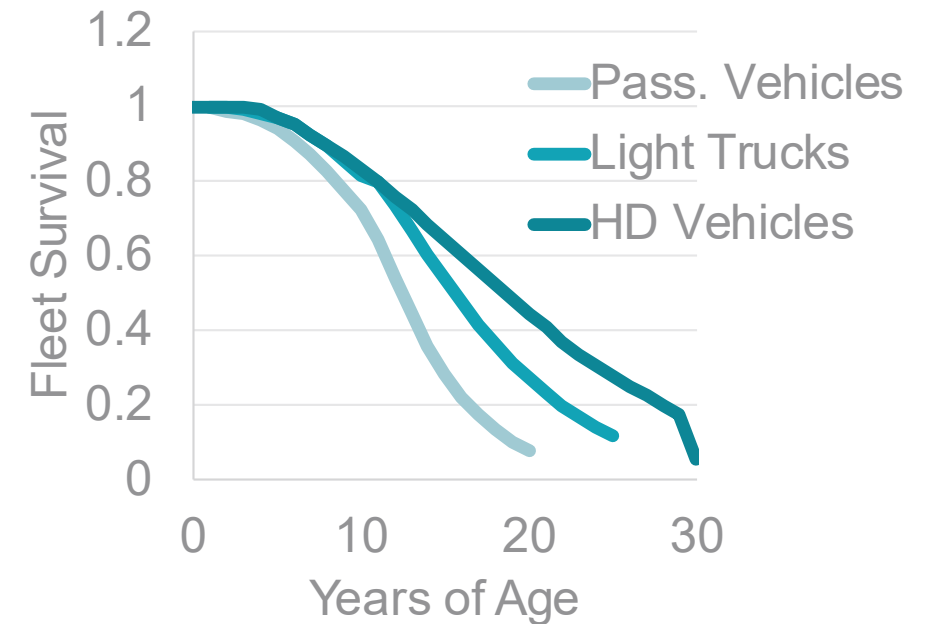


Figure 3. Electric vehicle shares of new 2019 vehicle registrations by metropolitan area. New vehicle registration data are from IHS Markit.

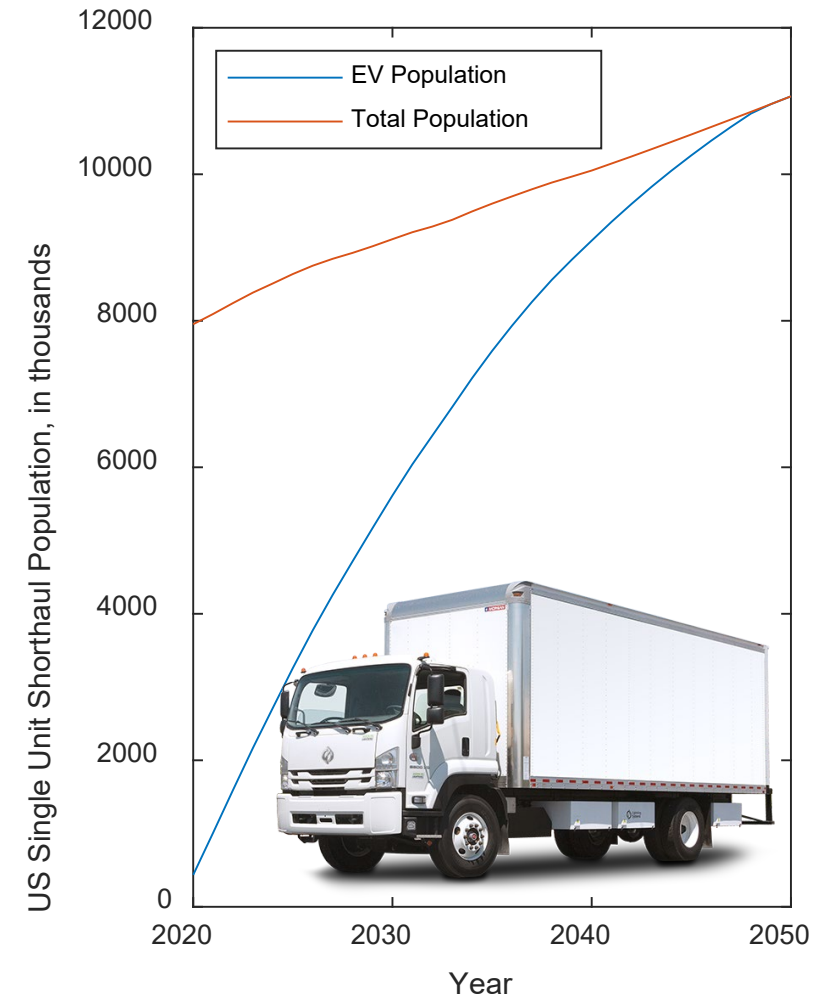
The Transitions to PEVs

- PEV transition is limited by the rate of retirement of the vehicles in the fleet
 - In 2021, 10% of vehicles sold in CA are PEVs, but less than 2% of the fleet are PEVs
 - Trucks and HD Vehicles last even longer ([link](#), [link](#))
- 50% of today's passenger vehicles will be on the road in 2031
- 50% of today's HDVs will be on the road in 2040



The Transitions to PEVs

- Consider the example of the Short Haul Combination Truck
 - A near-term application for HD BEVs
 - 150 mi Range can perform 95% of trips now
 - <5 year payback period in 2020 with incentives
- If sales are 100% of a growing market, it still takes till 2040 to achieve 90% electrification



Understanding electric vehicle operation for air quality modeling

Discussion points for this presentation:

- Characterizing Battery Electric Vehicle and Plug-in Hybrid Electric Vehicle operational emissions
- The personal and commercial fleet makeup limits the rate and “end-state” of the transportation system transition

Thank you



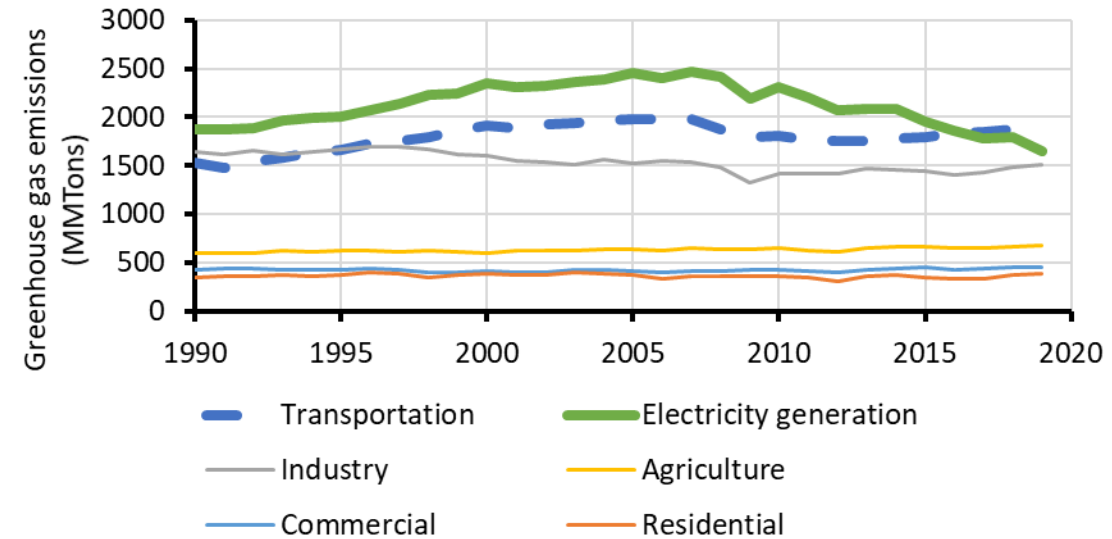
Modeling the effects of added load to the grid

Marcus Alexander

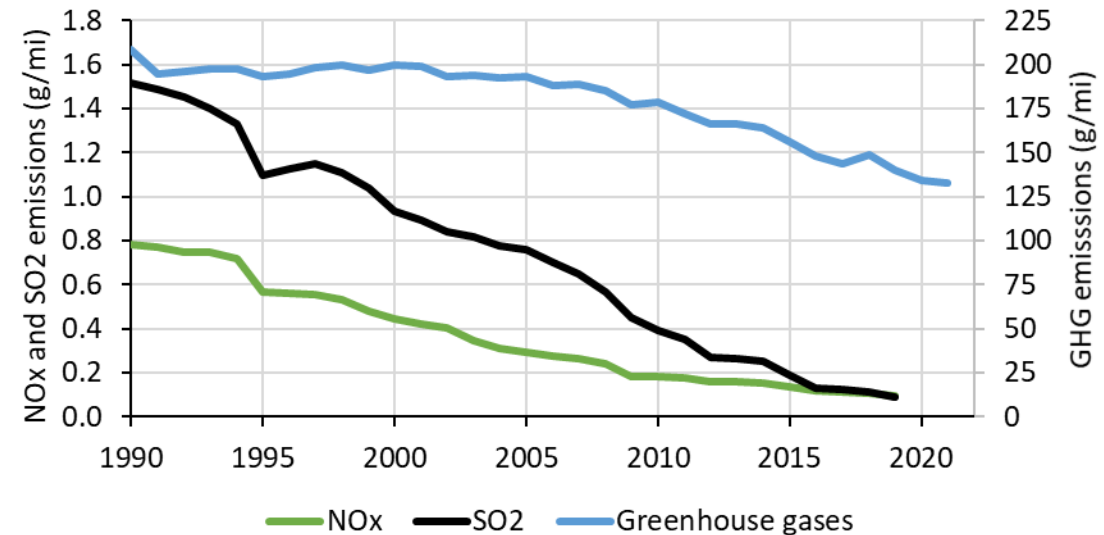
Electric Power Research Institute

Overview

- Electricity has tremendous potential as a low greenhouse gas emitting fuel
- Also has potential for air quality co-benefits due to the lack of local emissions
- However, exactly what the benefits are requires careful analysis
- This presentation discusses work done by EPRI, NRDC, and Ramboll for a previous investigation of transportation electrification



Source: EPRI analysis of EPA data



Source: EPRI analysis of EPA and EIA data

How are the transportation and electricity sectors different?

Emissions regulation regimes

Transportation

- Emissions regulations typically only apply to new vehicles (although there are usually checks to ensure continued compliance)
- Fleet emissions improve through turnover as older vehicles retire

Emissions regulation regimes

Transportation

- Emissions regulations typically only apply to new vehicles (although there are usually checks to ensure continued compliance)
- Fleet emissions improve through turnover as older vehicles retire

Electricity generators

- Emissions regulations apply to both new plants and older plants
- Emissions are often regulated based on the *total quantity* of pollutants; these caps can be at the plant, state, or region level
- There are often additional regulations on the grid mix, such as renewable portfolio standards
- Fleet emissions improve through both turnover and in-service reductions

Emissions regulation regimes

- All of this means that to a first approximation additional miles in existing vehicles will result in additional emissions, but additional generation may not lead to more emissions at the *system level*
- Regulations like renewable portfolio standards will have to be complied with regardless of load

How should we calculate grid emissions?

How should we calculate grid emissions?

- There are at least three major ways:
 - Average
 - Small-scale marginal (intensive marginal)
 - Large-scale marginal

How should we calculate grid emissions?

- Average
 - Emissions intensity for new loads is (implicitly) assumed to be proportional to the current emissions intensity

$$Rate = \frac{\sum emissions}{\sum generation}$$

How should we calculate grid emissions?

- Small-scale marginal
 - Emissions intensity for new loads is calculated from the emissions for a small amount of new load

Rate = rate for very small increase in generation

How should we calculate grid emissions?

- Large-scale marginal
 - Emissions intensity for new loads is modeled based on adding new load to the system in a high-fidelity grid model

$$Rate = \int \sum \prod \textit{it's complicated}$$


Large-scale marginal

- Run a full grid model over the applicable timeframe for the base case
- Add electric transportation load
- Run the full grid model again with the new combined load
- Subtract the differences in emissions and the differences in load



Example

- Let's say that we have a simplified system with the following characteristics:
 - Renewable Portfolio Standard of 33%, so 33% of energy served must come from renewable generation
 - Coal is the lowest-cost dispatchable resource, and there is enough to serve 33% of the load
 - Natural gas meets the remaining load
- What's the grid mix?




Example

Average	1/3 renewable (by policy) 1/3 coal (lowest cost) 1/3 natural gas (remainder)	 <ul data-bbox="2099 472 2275 608" style="list-style-type: none">■ Renewable■ Natural gas■ Coal

Example

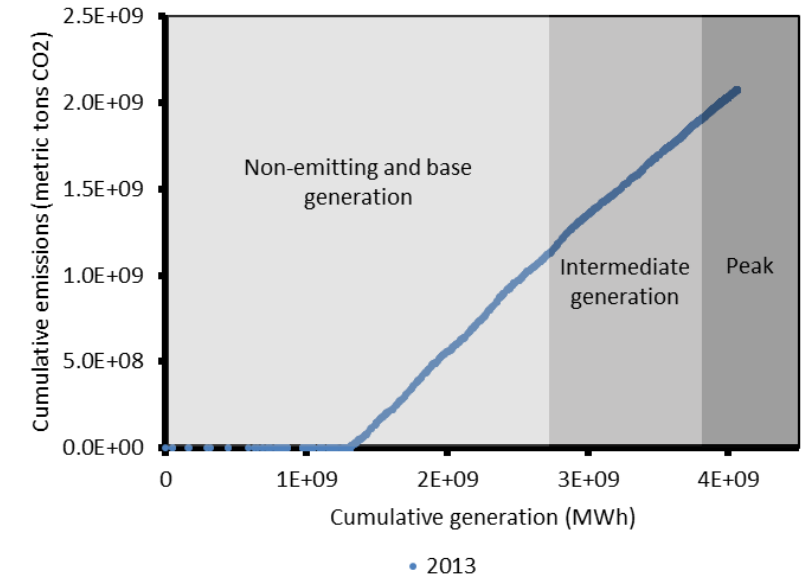
Average	1/3 renewable (by policy) 1/3 coal (lowest cost) 1/3 natural gas (remainder)	 <ul data-bbox="2102 471 2280 606" style="list-style-type: none">■ Renewable■ Natural gas■ Coal
Small-scale marginal	All natural gas (meets remaining load)	 <ul data-bbox="2102 799 2280 935" style="list-style-type: none">■ Renewable■ Natural gas■ Coal

Example

Average	1/3 renewable (by policy) 1/3 coal (lowest cost) 1/3 natural gas (remainder)	 <ul data-bbox="2102 471 2280 606" style="list-style-type: none">■ Renewable■ Natural gas■ Coal
Small-scale marginal	All natural gas (meets remaining load)	 <ul data-bbox="2102 799 2280 935" style="list-style-type: none">■ Renewable■ Natural gas■ Coal
Large-scale marginal	1/3 renewable (by policy) 2/3 natural gas (meets remaining load)	 <ul data-bbox="2102 1120 2280 1256" style="list-style-type: none">■ Renewable■ Natural gas■ Coal

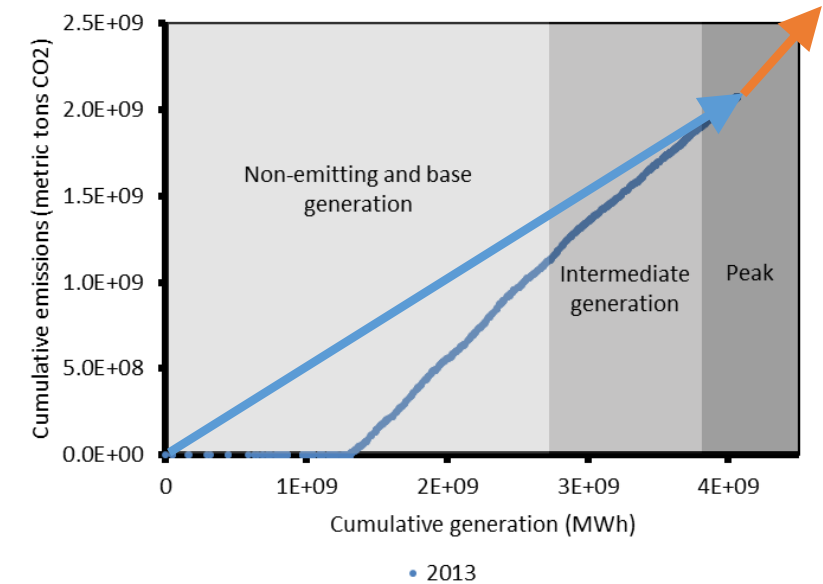
What does real life look like?

- The top chart shows cumulative emissions relative to cumulative generation for all plants in the US for 2013, ordered by CO₂ emissions intensity



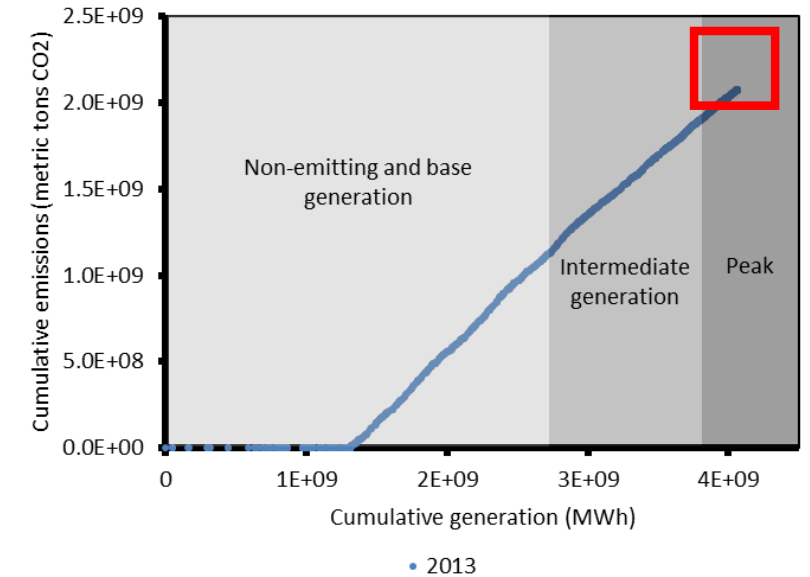
What does real life look like?

- The top chart shows cumulative emissions relative to cumulative generation for all plants in the US for 2013, ordered by CO₂ emissions intensity



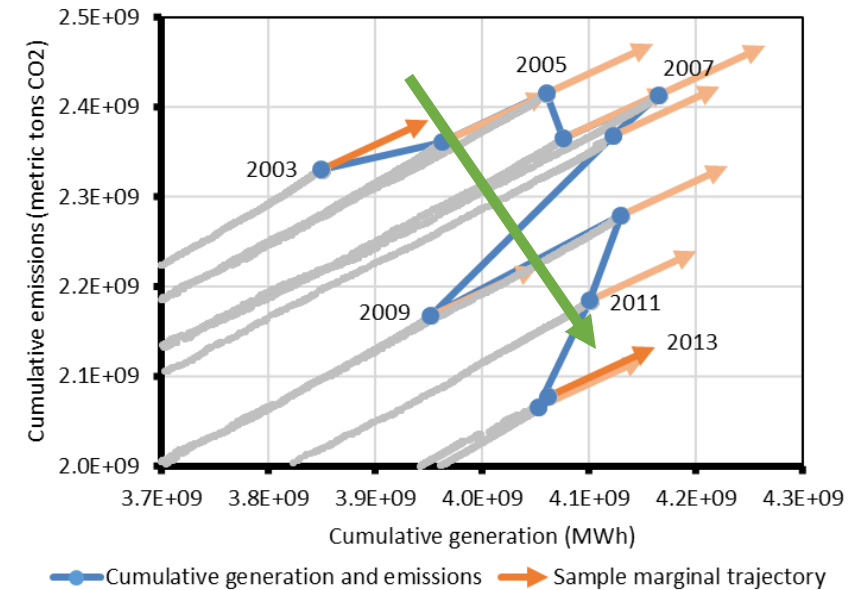
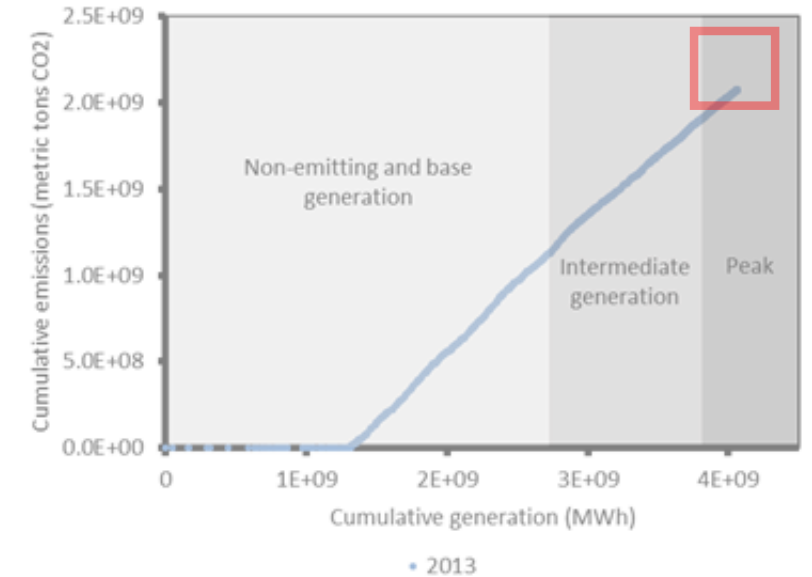
What does real life look like?

- The top chart shows cumulative emissions relative to cumulative generation for all plants in the US for 2013, ordered by CO₂ emissions intensity



What does real life look like?

- The top chart shows cumulative emissions relative to cumulative generation for all plants in the US for 2013, ordered by CO₂ emissions intensity
- The bottom chart shows the zoomed in red area, but for many years
- The trend does not follow a simple linear extrapolation; policy appears to be more important



Source: EPRI analysis of EPA and EIA data

Best practices for modeling grid
emissions for electric
transportation

EPRI grid modeling

- EPRI uses the US-REGEN model for grid modeling; it:
 - Is economy wide
 - Has high spatial and temporal resolution
 - Has a comprehensive set of policies affecting grid emissions
 - Has endogenous capacity expansion and retirement
 - Projects capacity and generation over time using EPRI's understanding of generation costs
 - Allows for exploration of a variety of policy and resource scenarios
- <https://eea.epri.com/models.html#us-regen> for more information

Rate of load introduction

- High enough to cause a real response to the system
- Low enough to be realistic

Rate of load introduction

- High enough to cause a real response to the system
- Low enough to be realistic
- The 2 million vehicles placed on the road in the last decade require about **6 TWh/year** of electricity

Rate of load introduction

- High enough to cause a real response to the system
- Low enough to be realistic
- The 2 million vehicles placed on the road in the U.S. the last decade require about **6 TWh/year** of electricity
- Total U.S. electricity use is about **4000 TWh/year**

Emissions scope

- To the extent possible, all emissions related to fuel acquisition and processing should be included
- Non-exhaust vehicle emissions are becoming increasingly important and should be included

More information

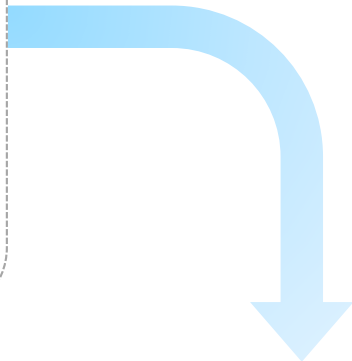
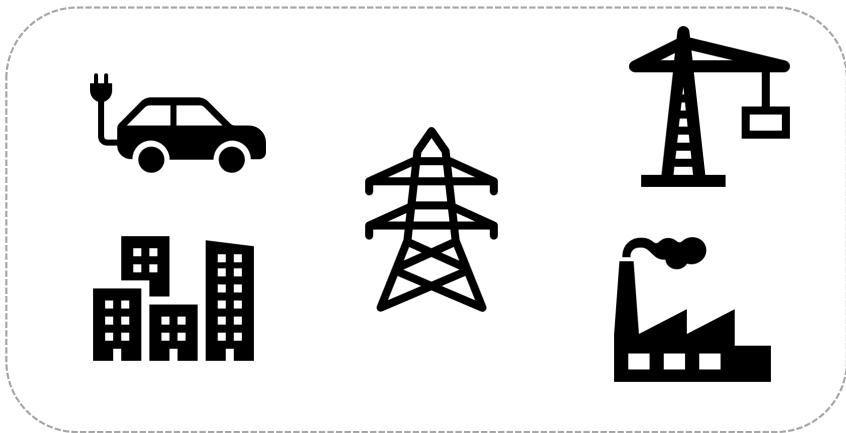
More information

- **Environmental Assessment of a Full Electric Transportation Portfolio, Volume 1: Background, Methodology, and Best Practices**
 - <https://www.epri.com/research/products/000000003002006875>
- Volume 2: Greenhouse Gas Emissions
 - <https://www.epri.com/research/products/000000003002006876>
- Volume 3: Air Quality Impacts
 - <https://www.epri.com/research/products/000000003002006880>
- Marcus Alexander; malexander@epri.com

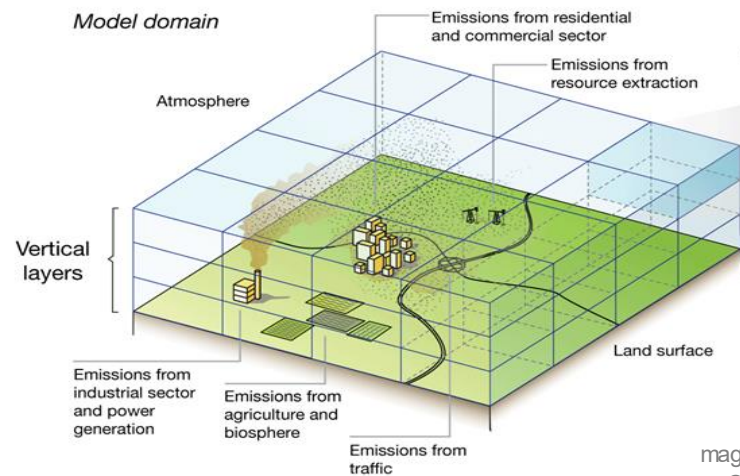
Air Quality Modeling for Electric Vehicle Fleets

Uarporn (Ou) Nopmongcol
Ramboll

Assessing Emission Impacts through Air Quality Modeling



Use a Photochemical Grid Model for Ozone and PM_{2.5}

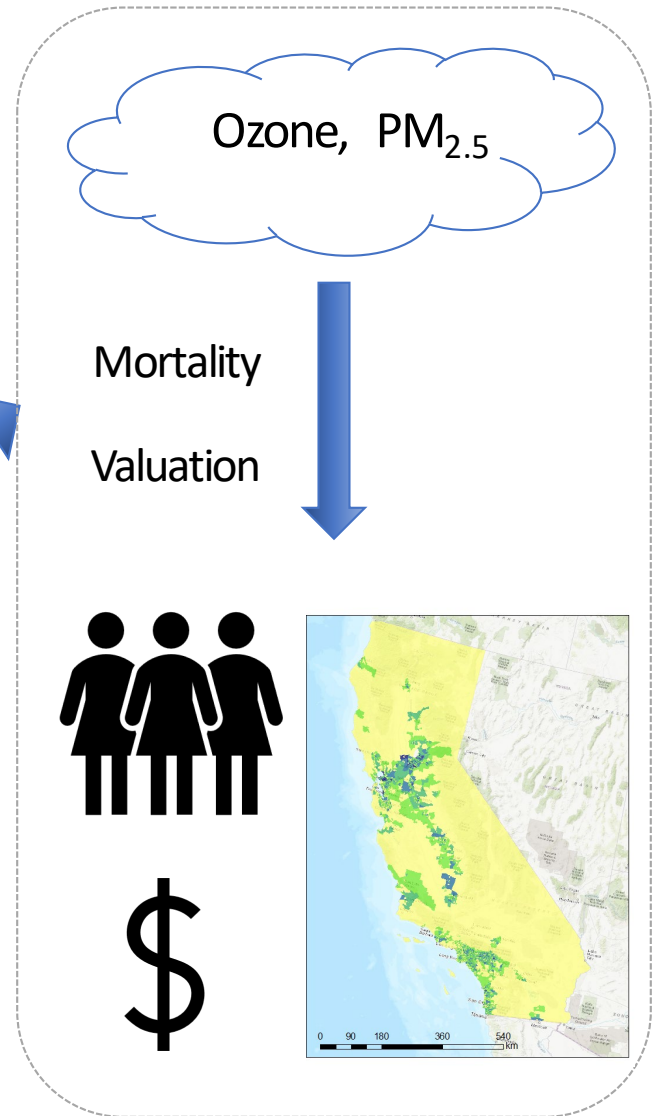


Grid cell

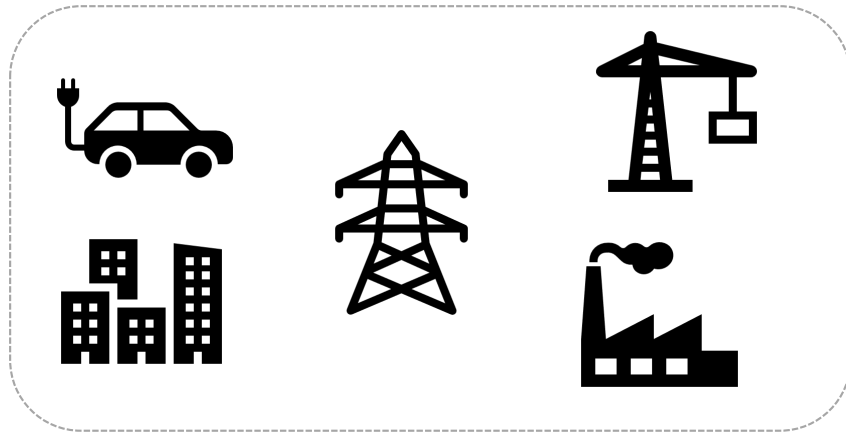
$$\frac{\partial C}{\partial t} = -\nabla \cdot vC + \nabla \cdot KC$$

$$\frac{d[\text{NO}_2]}{dt} = k[\text{NO}_2] - J[\text{O}_3]$$

From AWMA Environmental Manager magazine, July 2012 issue on AQMEI: Douw Steyn, Peter Buitjes, Martijn Schaap, Greg Yarwood



Holistic look across all Emitting sources



Changes from direct and indirect sources

- Direct (electrifiable sources and electric grids)
 - Transportation, off-road
 - Residential & commercial
 - Industrial boilers
- Indirect (impacted by changes in demand)
 - Petroleum upstream (exploration, production, and shipping)
- Increasing emission from economic and activity growth
 - Industrial sectors
 - Dust from more activities, e.g., miles traveled
- Carbon pricing also a key factor

Recent Continental US study: Model and Scenarios

US-REGEN Economic/Energy Emission Inventory

- Criteria air pollutants from all anthropogenic emission sources
- Continental US (CONUS)
- 2015–2050 period in 5-year increments

Basis

- Baseline emissions: EPA's 2014 National Emission Inventory
- Forecast: Economic activity, technology, and emissions controls

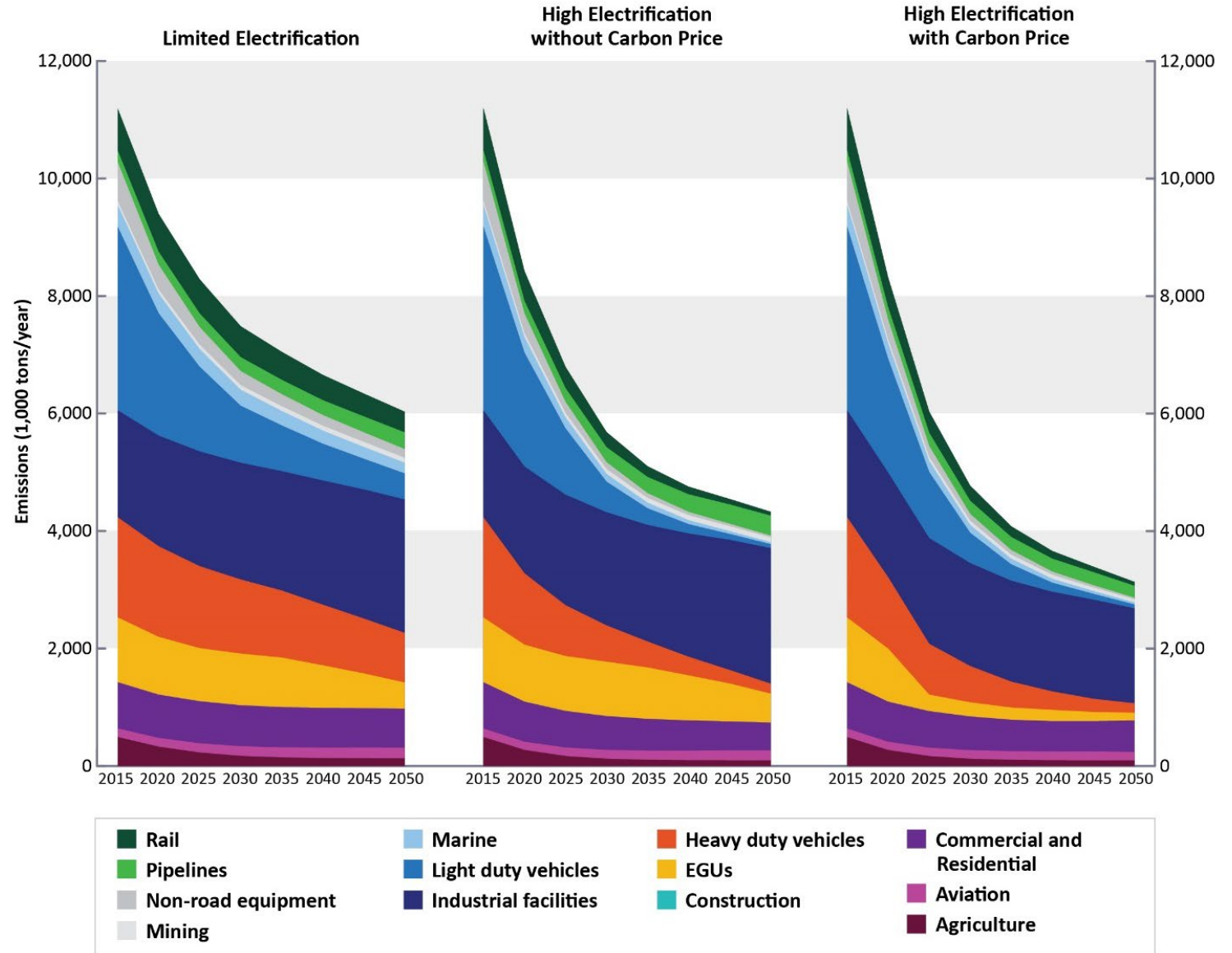
Scenarios

- Limited Electrification (Reference case)
- High Electrification without Carbon price
- High Electrification with Carbon price

NOx Emissions

High Elec scenarios have substantially greater emission reductions for on-road vehicles, rail, buildings, and non-road equipment

High w/ carbon price scenario has greater emission reductions for industrial facilities, EGUs, and pipelines

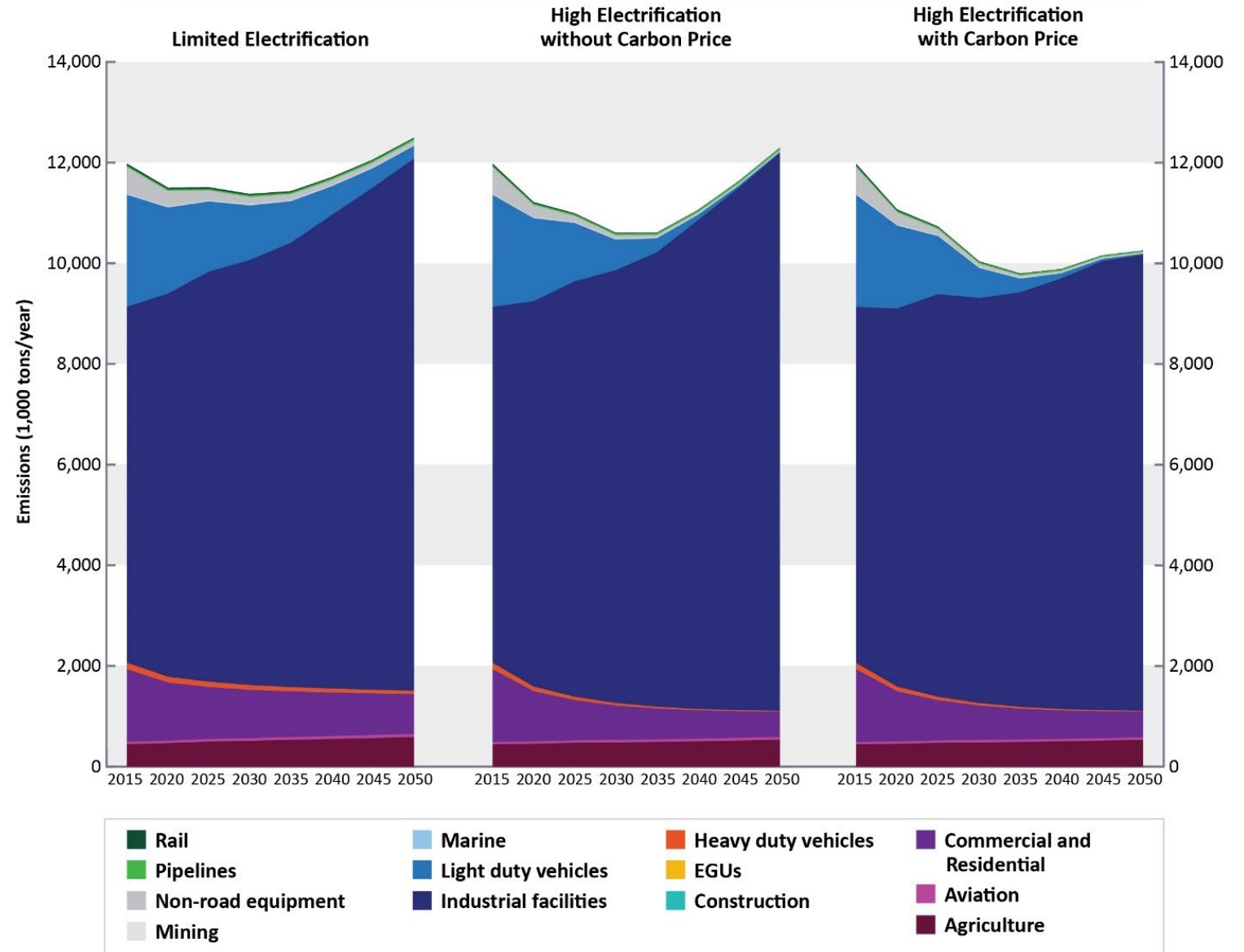


VOC Emissions

Upstream Oil & Gas (industrial facilities) is key driver

- **Upward trend** in Limited and High w/o carbon price scenarios
- **Downward trend** High w/ carbon price scenario

Higher emissions for Limited scenario due to commercial & residential and vehicles



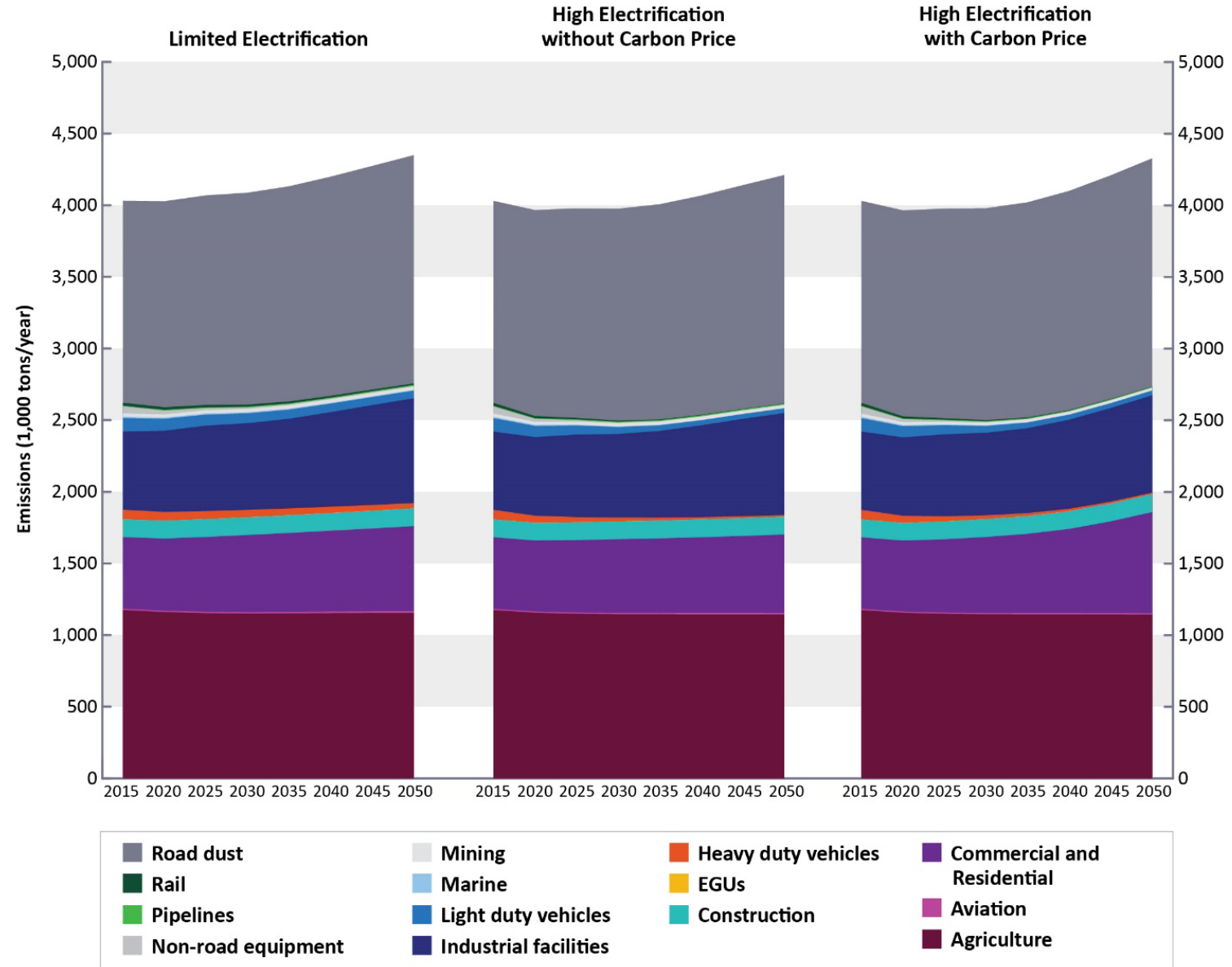
Primary PM_{2.5} Emissions

Fugitive dust dominates

- Agriculture, road, construction

Lower for High Elec due to vehicles and non-road equipment

Slightly higher for High Elec w/ C price due to commercial & residential

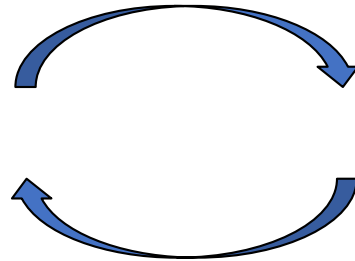


REGEN Emissions Development and Integration into Air Quality Modeling

Typical EPA / Air Quality Modeling Format

- Geographic
 - County (nonpoint)
 - Facility and unit (point)
- Source Classification
 - 5500+ NEI SCCs
 - 1000+ NAICS

REGEN Emission Model Development



REGEN end-use emission output integration into Air Quality Modeling

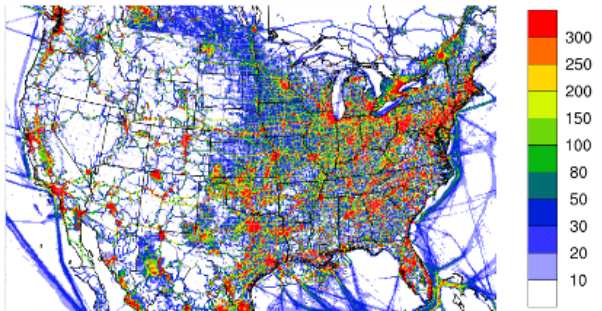
REGEN Format

- Geographic
 - State or multi-state region
- Source Classification
 - 31 Sectors
 - 12 Sources
 - 11 Fuels

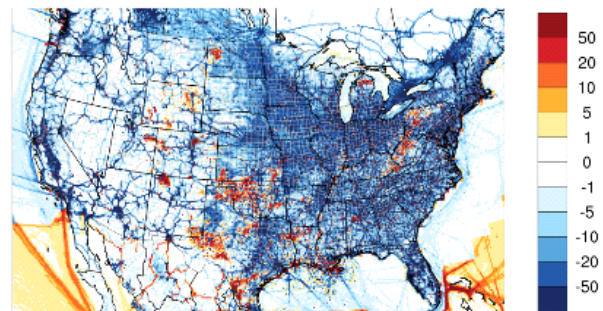
Handshake between REGEN and Air Quality Model

Spatial Distribution of NOx Emissions

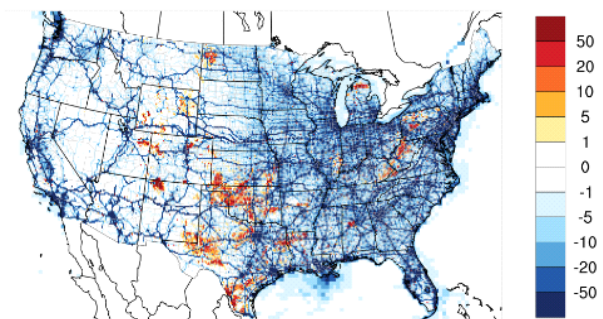
2016 Baseline



**Delta
(2035 Limited Elec - 2016 Base)**

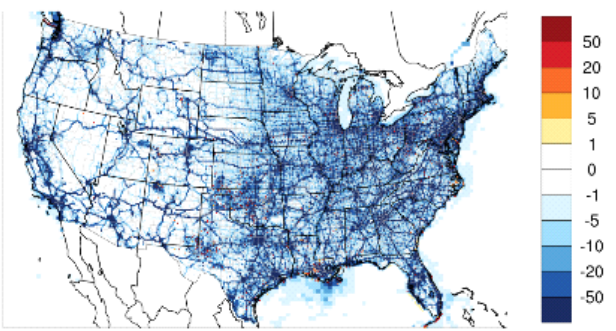


**Delta
(2035 High w/o C price - 2035 Limited Elec)**

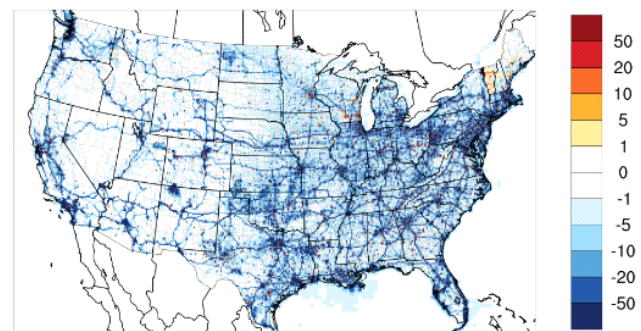


Declining on-road and non-road NOx emissions but increasing oil & gas NOx emissions

**Delta
(2035 High w/ C price - 2035 Limited Elec)**



**Delta
(2050 High Elec w/ C price - 2035 High Elec w/ C price)**



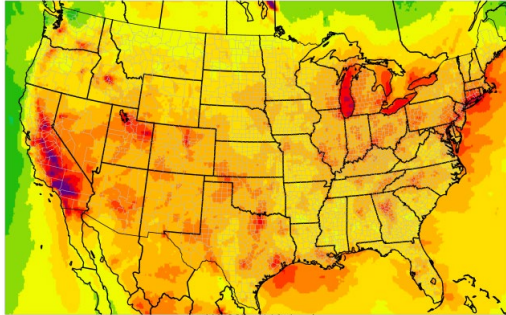
Carbon pricing reduces NOx emissions out to 2050

Air Quality Analysis

Ozone and PM_{2.5}

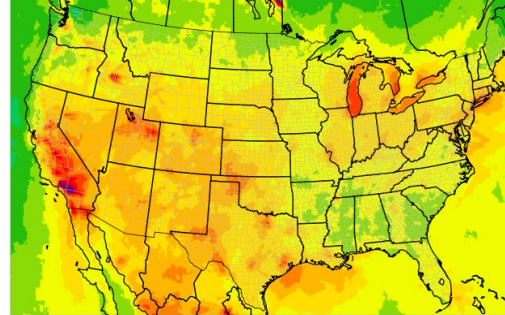
Ozone Impacts

2016



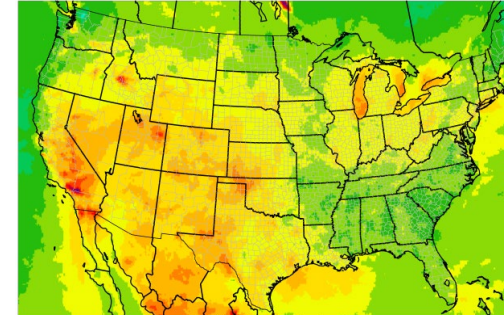
max(48,99) = 110.4 ppb
min(6,155) = 39.7 ppb

2035 Limited



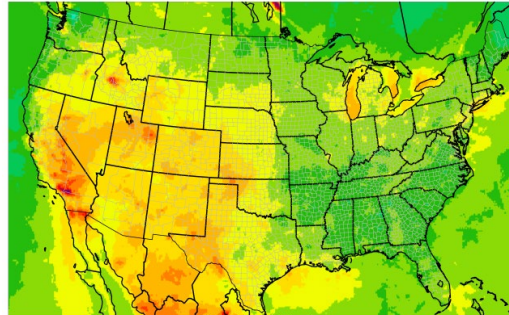
max(48,99) = 102.8 ppb
min(52,235) = 36.1 ppb

2035 High w/o Carbon Price



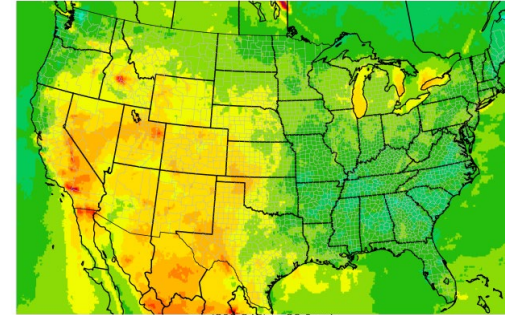
max(45,99) = 91.7 ppb
min(52,235) = 33.8 ppb

2035 High w Carbon Price

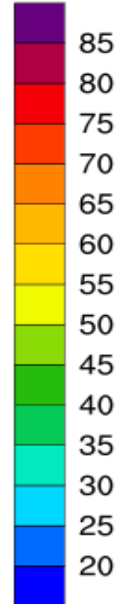


max(45,99) = 90.9 ppb
min(389,242) = 33.5 ppb

2050 High w Carbon Price

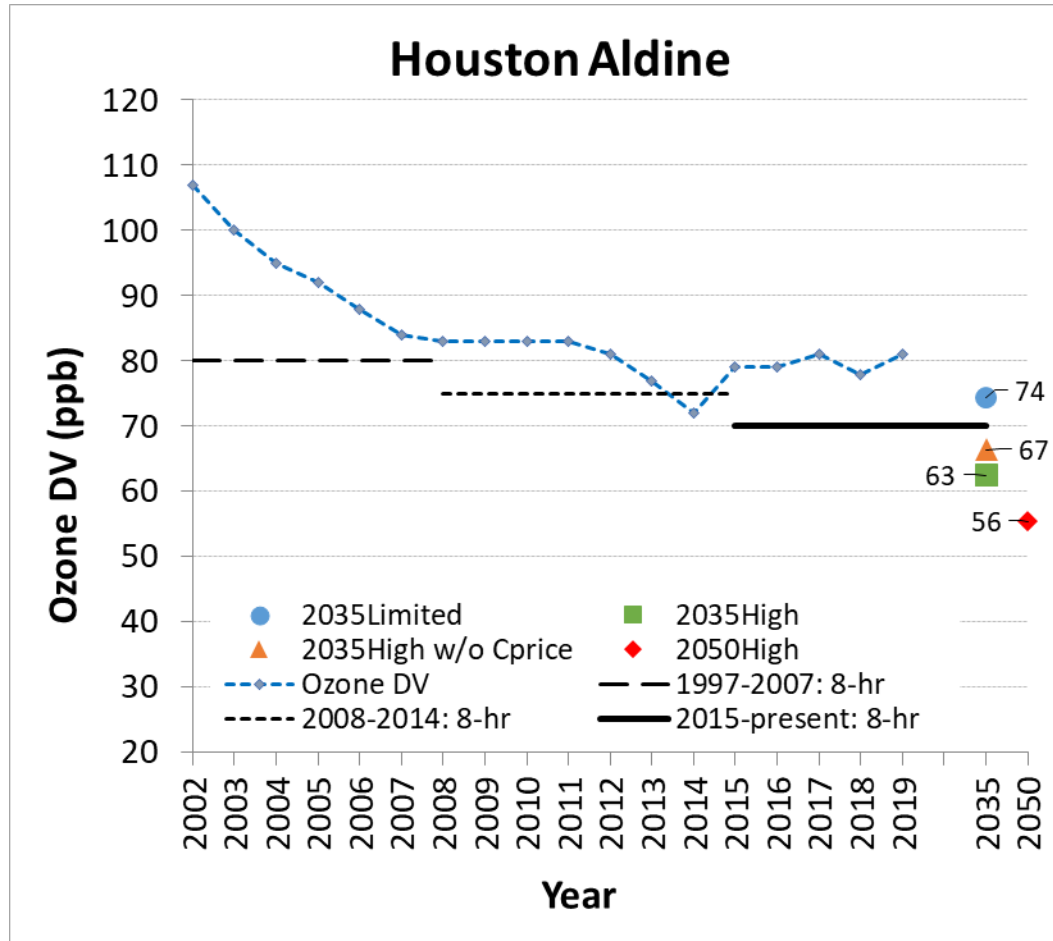


max(209,245) = 86.0 ppb
min(396,242) = 31.5 ppb



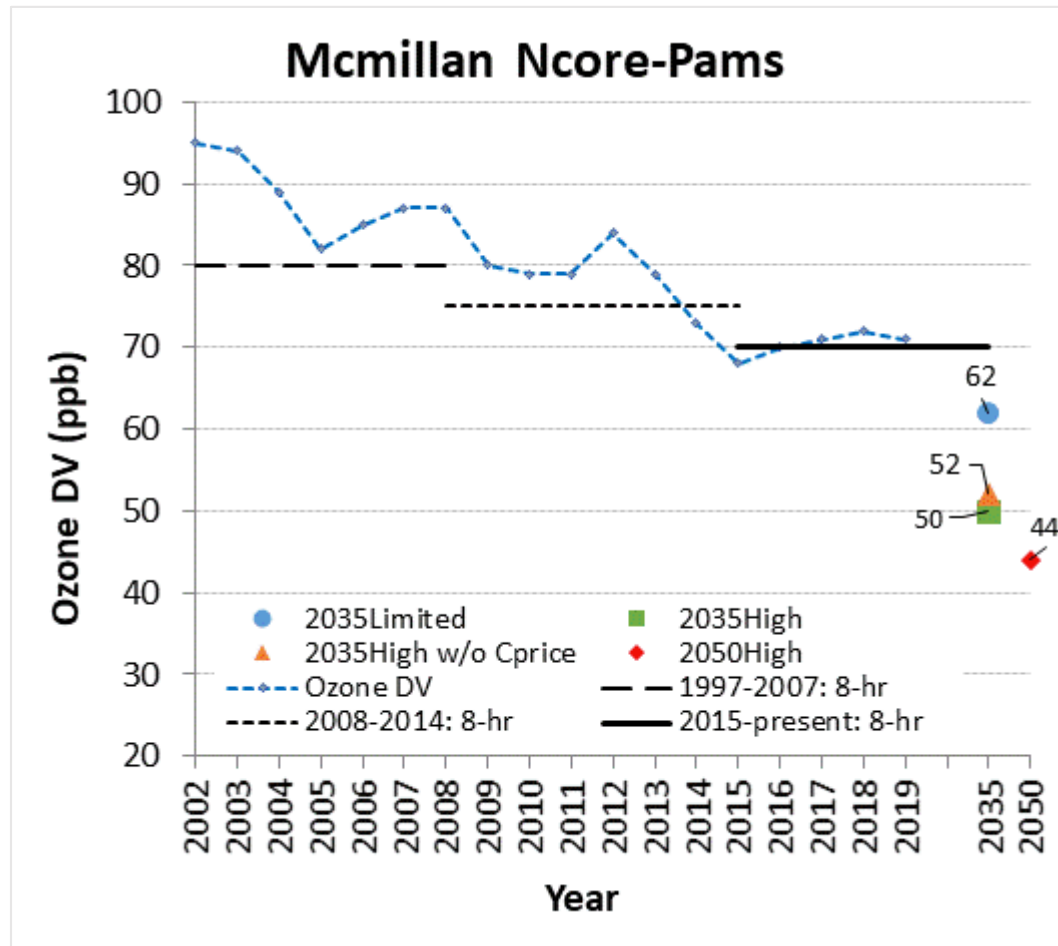
Deep NOx emission reductions lead to striking ozone reduction across the country especially in the eastern US

Case study: Houston Ozone Trend



- 2019 ozone design value (DV) of 81 ppb
- Downward ozone trend until 2014; flat since
- Complex air quality due to mix of pollution sources plus local circulation
- Fleet turnover is not sufficient to meet NAAQS in the 2035 Limited Electrification scenario
- Electrification will help extend downward trend and assure attainment

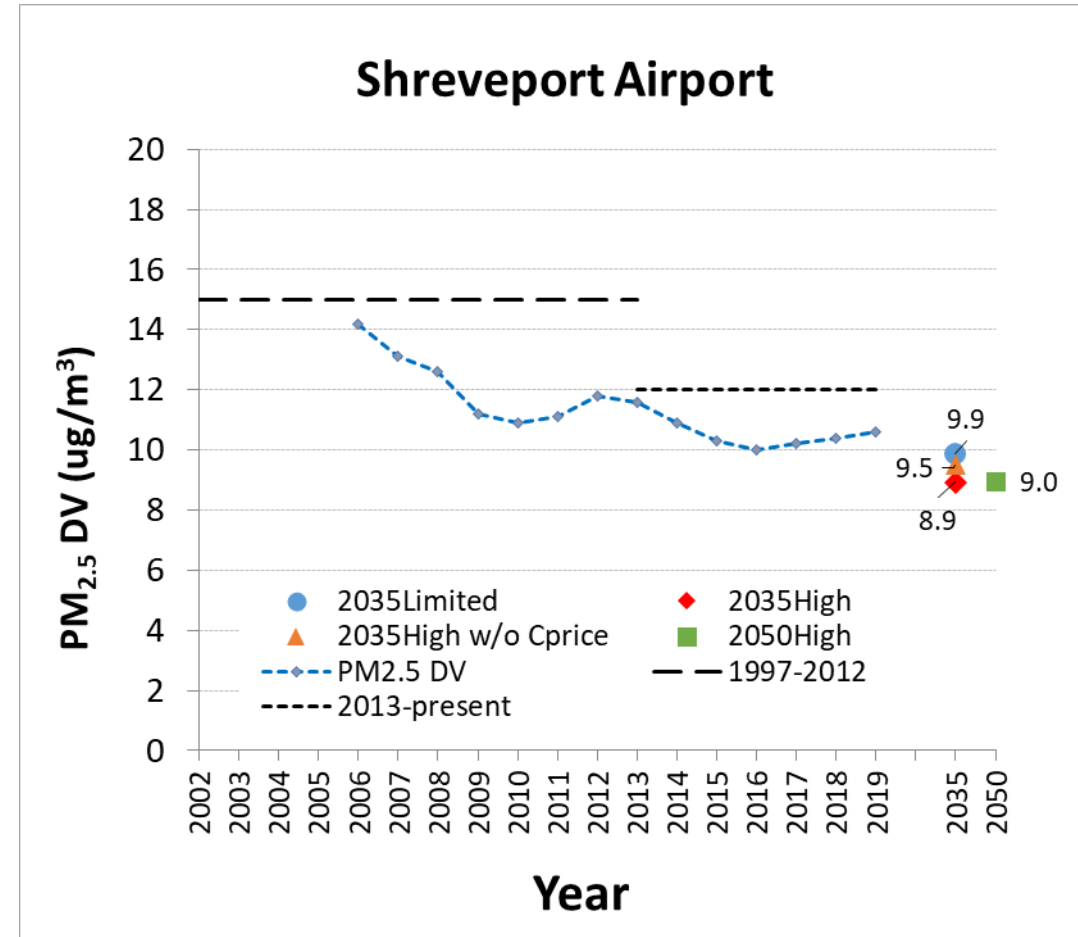
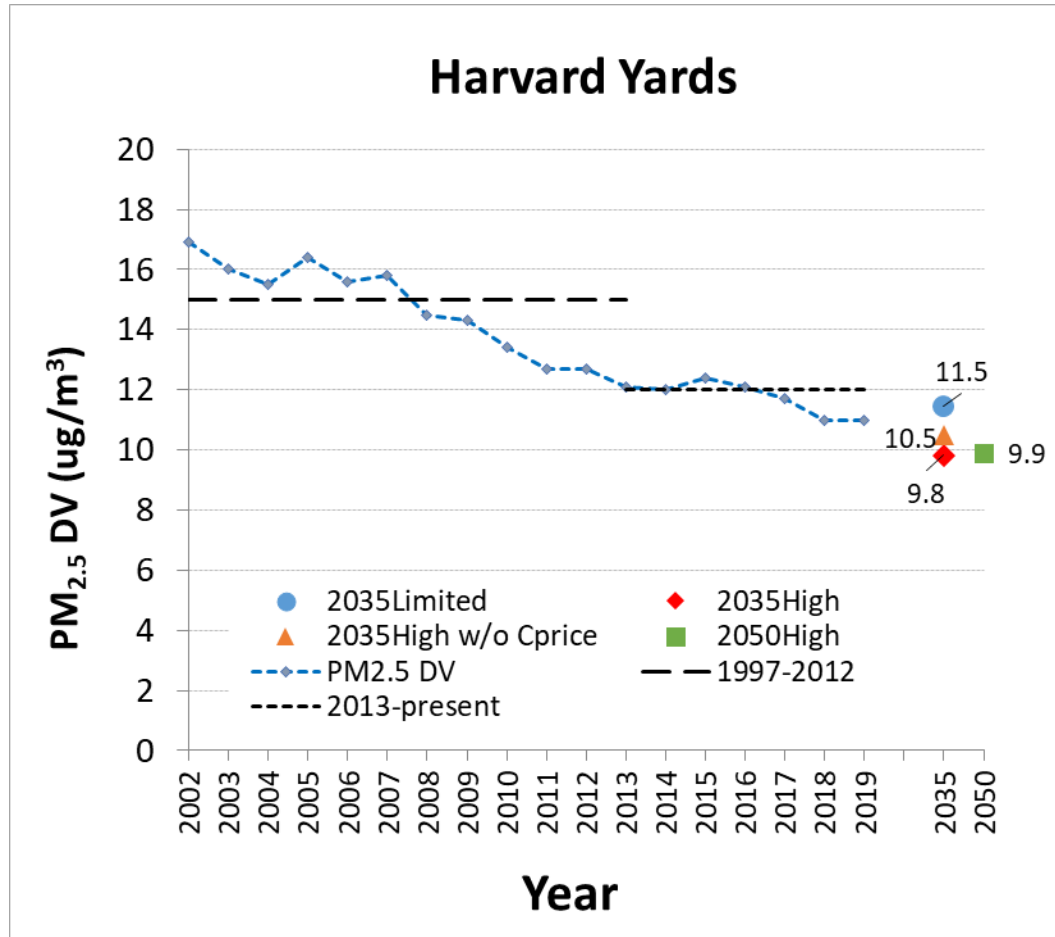
Case study: DC Ozone Trend



- Multistate metropolitan area
Washington-Arlington-Alexandria Core Based Statistical Area (CBSA)
- Downward since 2002 but further emission reduction is necessary
- Electrification can double ozone benefit by 2035

Case study: Ohio and Louisiana PM_{2.5} Trend

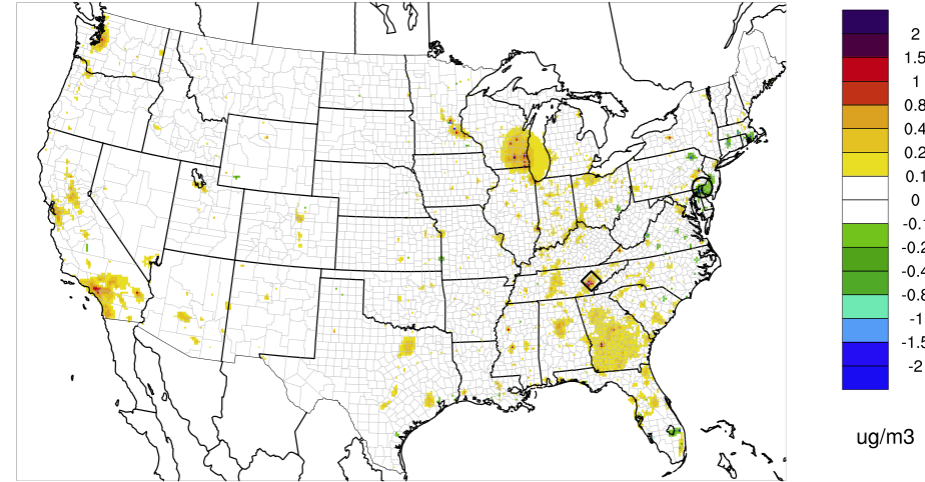
Impacts of electrification less dramatic than for ozone



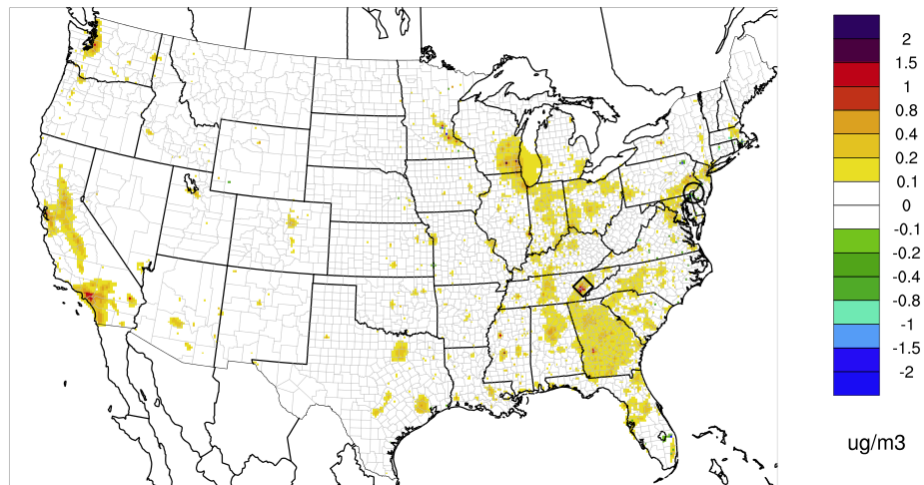
Primary vs Secondary

- Increase total PM_{2.5} in 2050 from 2035 driven by primary PM_{2.5}

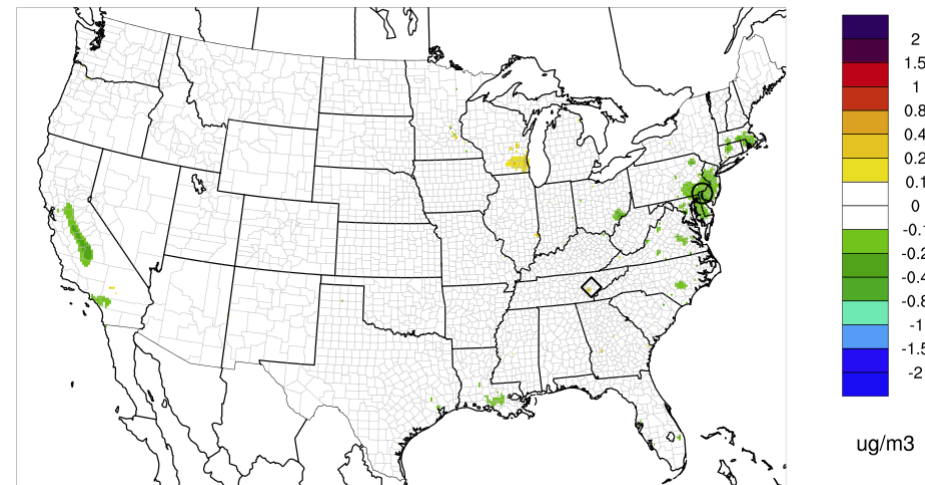
Total PM_{2.5} mass



Primary PM_{2.5} : primary organic aerosol, dust



Secondary PM_{2.5} : nitrate, sulfate, SOA



Other studies

EPRI-NRDC 2015 Report



Electrifying Transportation Reduces Greenhouse Gases and Improves Air Quality: Executive Summary

The Electric Power Research Institute (EPRI) and the Natural Resources Defense Council (NRDC) produced the Environmental Assessment of a Full Electric Transportation Portfolio to provide in-depth analysis of the environmental impact of electrifying a range of vehicles, including U.S. light-duty and medium-duty transportation and industrial equipment such as forklifts.

CONUS Vehicles + Equipment (2017)



Article

pubs.acs.org/est

Air Quality Impacts of Electrifying Vehicles and Equipment Across the United States

Uarpom Nopmongkol,^{*,†} John Grant,[†] Eladio Knipping,[‡] Mark Alexander,^{*,‡} Rob Schurhoff,[§] David Young,[‡] Jaegun Jung,[†] Tejas Shah,[†] and Greg Yarwood[†]

California focused (CEC, 2019)

Energy Research and Development Division
FINAL PROJECT REPORT

Air Quality Implications of an Energy Scenario for California Using High Levels of Electrification

California Energy Commission

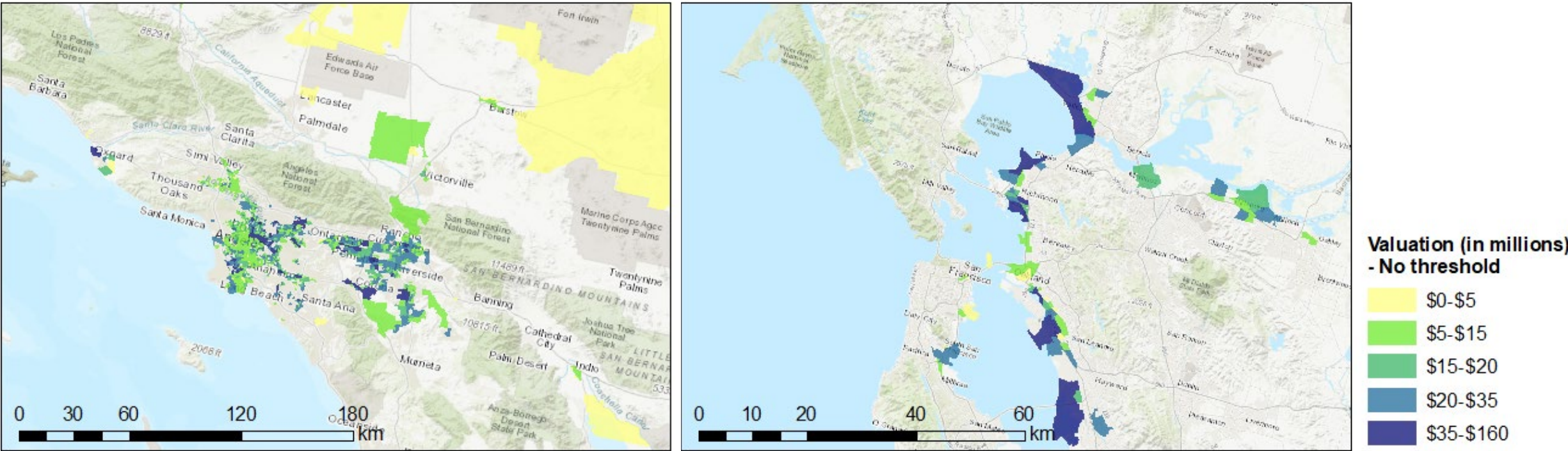
Gavin Newsom, Governor

June 2019 | CEC-500-2019-049



Valuation of Avoid Mortality from PM_{2.5} changes

California Case Study: Benefits across disadvantaged communities



Key Takeaways

- Downward trends in ozone and PM_{2.5} recently **stalled or even reversed** at important locations
- “On-the-books” strategies may be insufficient for some states to meet the NAAQS
- **Electrification is key** to resuming and extending these downward pollution trends

Ozone improvements mostly doubled from 2016 in High Electrification scenarios (approaching background in 2050) due mainly to **lower NOx emissions from on-road and nonroad**

PM_{2.5} improvements due mostly to lower NOx and SO₂ emissions from on-road, non-road, and EGUs

Key Takeaways

- ➔ PM_{2.5} improvements stall from 2035 to 2050 because secondary PM_{2.5} precursor (NO_x, SO₂) emission reductions are offset by growing primary PM_{2.5} emissions

States may need to consider emissions from several activities that may not be traditionally included in emission mitigation strategy

- ➔ Air quality benefits of carbon pricing can be significant near oil & gas sources

- ➔ Interstate transport can affect attainment status and may require demonstration of “Good Neighbor” provisions

Broad adoption of electrification benefits regional as well as local air quality

More information

- EPRI-NRDC, 2015. Environmental Assessment of a Full Electric Transportation Portfolio, Volume 3: Air Quality Impacts
 - <https://www.epri.com/research/products/000000003002006880>
- EPRI-Ramboll, 2017. Air Quality Impacts of Electrifying Vehicles and Equipment Across the United States. ES&T
 - <https://pubs.acs.org/doi/10.1021/acs.est.6b04868>
- CEC, 2019. Air Quality Implications of an Energy Scenario for California Using High Levels of Electrification
 - <https://www.energy.ca.gov/sites/default/files/2021-06/CEC-500-2019-049.pdf>

Uarporn (Ou) Nopmongcol
unopmongcol@ramboll.com



Thomas
Bradley
thomas.bradley@colostate.edu



Colorado State University



Uarporn
Nopmongcol
unopmongcol@ramboll.com

RAMBOLL



Marcus Alexander
malexander@epri.com

EPRI

Eladio Knipping
eknipping@epri.com



#TRBwebinar

Other TRB events for you

- *October 25-28: Electric Vehicles Workshop (Assessment of Technologies for Improving Fuel Economy of Light-Duty Vehicles-Phase 3)*
- *November 1: Building Information Modeling for Infrastructure*

<https://www.nationalacademies.org/trb/events>

TRB Weekly

- Subscribe to the newsletter for the most recent TRB news & research

<https://bit.ly/ResubscribeTRBWeekly>

Register for TRB's Annual Meeting!



Register now for our January meeting! *There will be no onsite registration this year.*

<https://bit.ly/TRBAM2022registration>

#TRBAM

TRB's Podcast!

- Have you heard TRB's Transportation Explorers?
- Listen on [our website](#) or subscribe wherever you listen to podcasts!

#TRBExplorers



Get involved with TRB

- Receive emails about upcoming webinars:
<https://mailchi.mp/nas.edu/trbwebinars>
- Find upcoming conferences:
<https://www.nationalacademies.org/trb/events>

#TRBWebinar



Get Involved with TRB

Getting involved is free!

Be a Friend of a Committee bit.ly/TRBcommittees

- Networking opportunities
- May provide a path to Standing Committee membership

Join a Standing Committee bit.ly/TRBstandingcommittee

Work with CRP <https://bit.ly/TRB-crp>

Update your information www.mytrb.org