

# Air Quality Benefit from Accelerated EV Penetration in Southern California: A Case Study in the Interstate 710 Corridor

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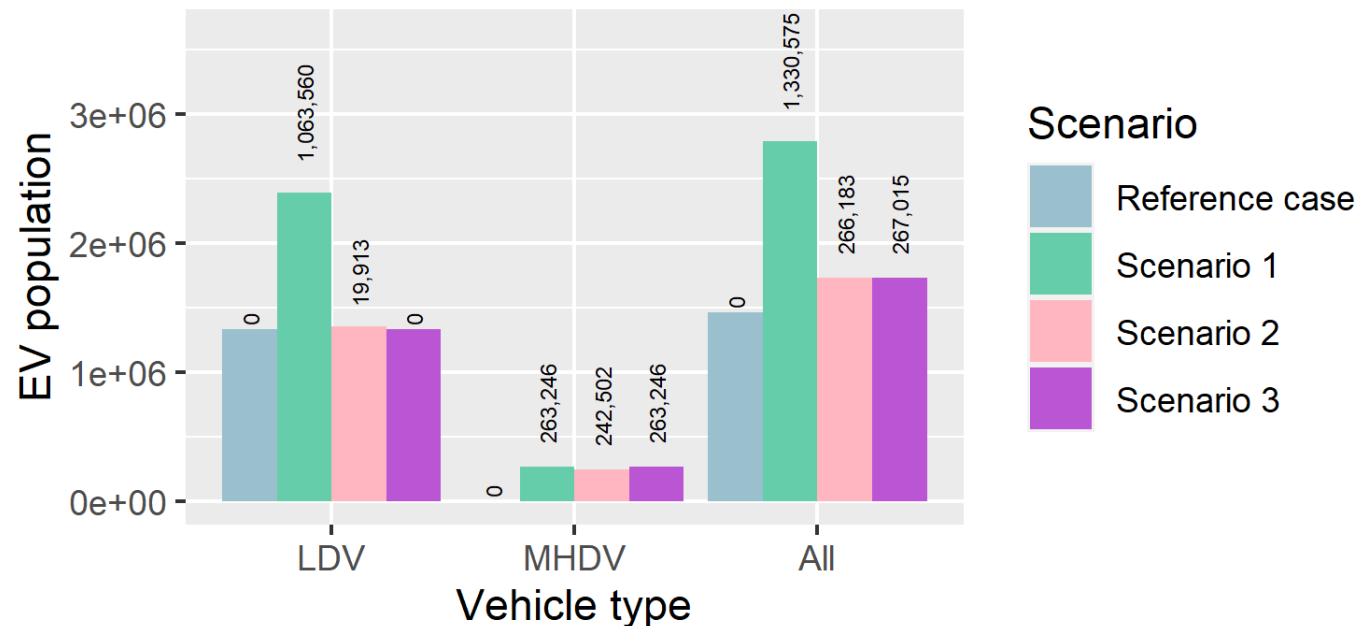
For the 2021 CMAS conference

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# Outline

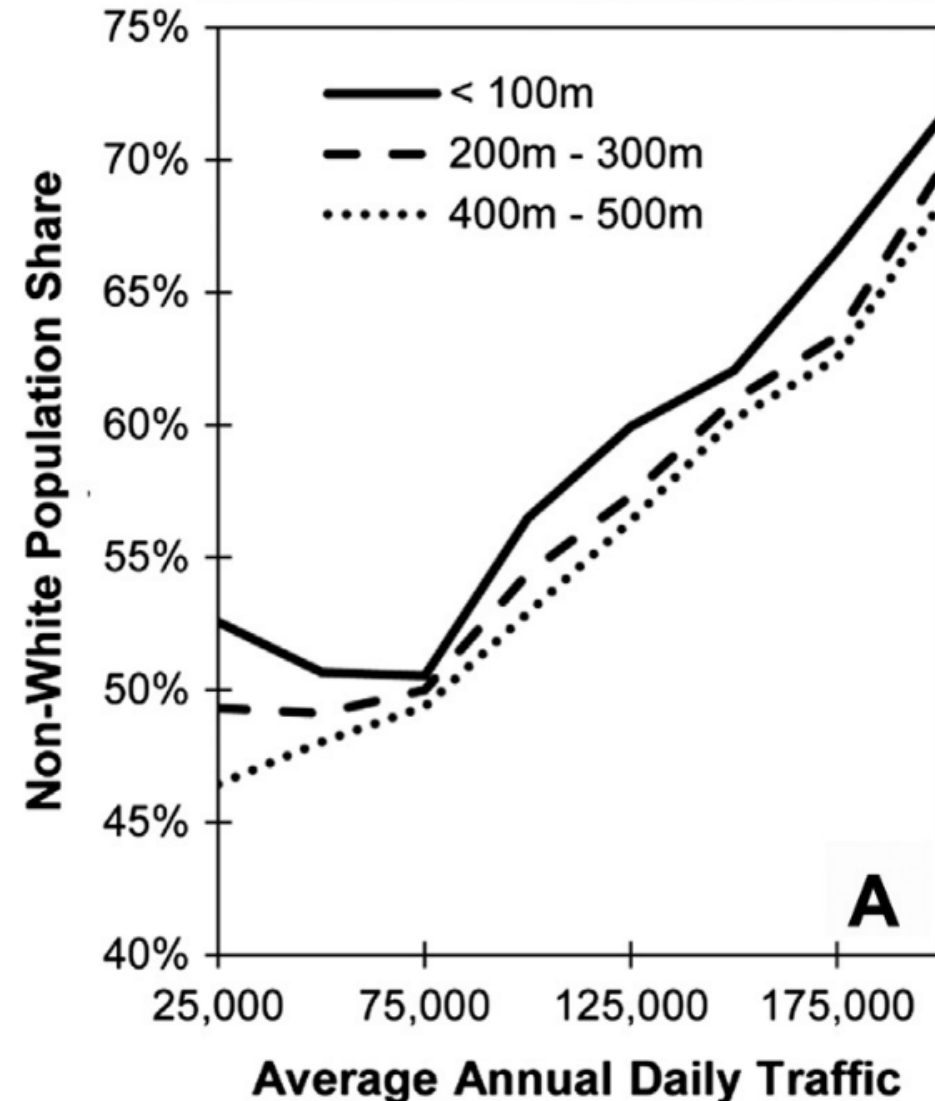
- Introduction
- Study design and domain
- Method
- Emission modeling results
- Summary

Projected electric vehicle (EV) population in the South Coast region of California in 2040



# Air Quality and Environmental Justice (EJ)

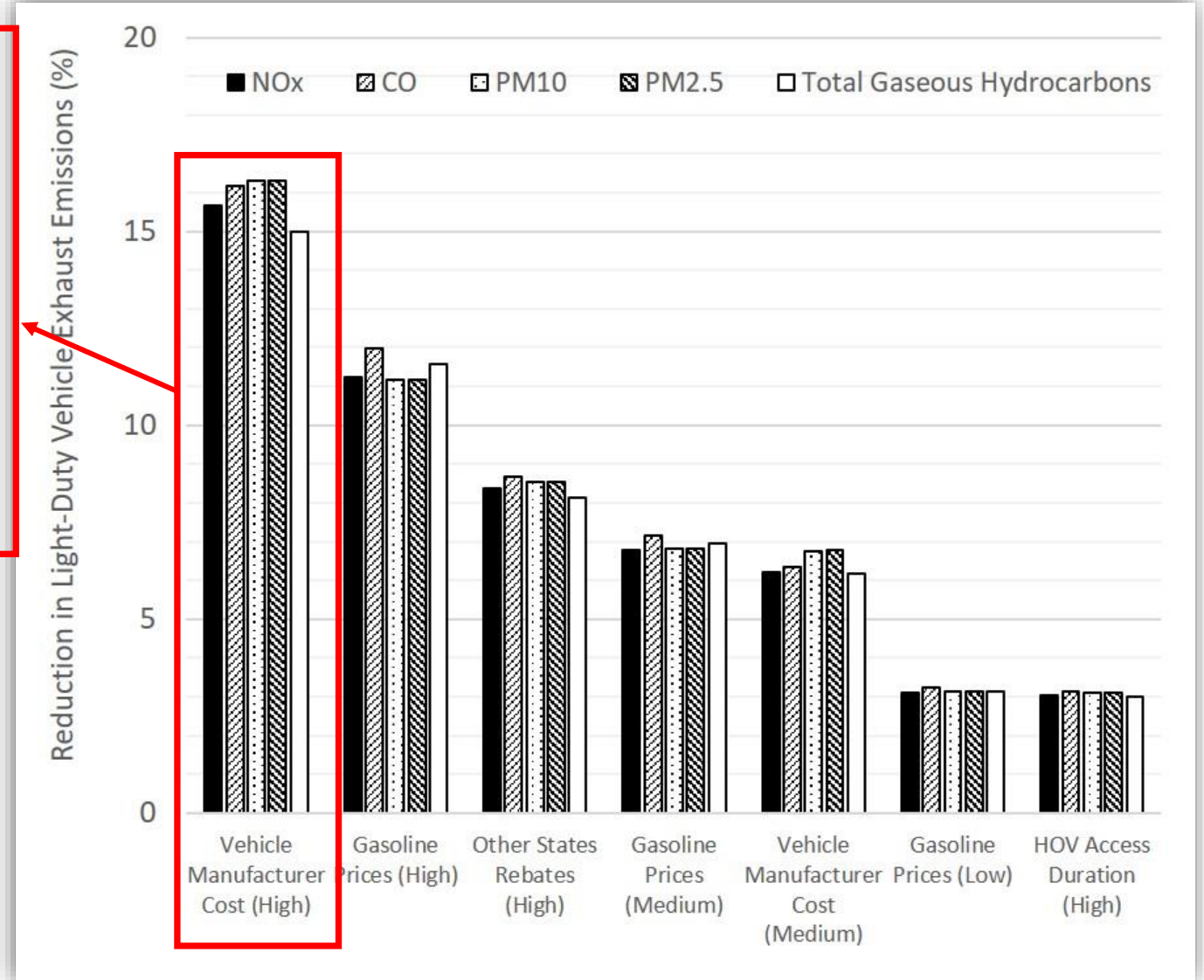
- Approximately 19% of the U.S. population lives near high-traffic volume roads
- Previous studies found that living near major roadways is associated with respiratory diseases
- Nationally, greater traffic volume and density are associated with larger numbers of non-white residents and lower median household incomes



Source: Rowangould, *Transport Research Part D*, 2013

# Penetration of Electric Vehicles: Example Forecasted Impacts

- Penetration of 38% electric vehicles (EVs) in the light-duty vehicle (LDV) fleet could reduce  $\text{NO}_x$  and  $\text{PM}_{2.5}$  emissions by up to 16% for the light-duty vehicle fleet by 2040 (Erdakos et al. 2019)
- California Air Resource Board (CARB) estimated 15%  $\text{NO}_x$  and  $\text{PM}_{2.5}$  emissions reductions for the medium- and heavy-duty vehicle fleet by 2040 under the Advance Clean Truck (ACT) regulation



Source: <http://www.trb.org/Main/Blurbs/180232.aspx>

# Motivation

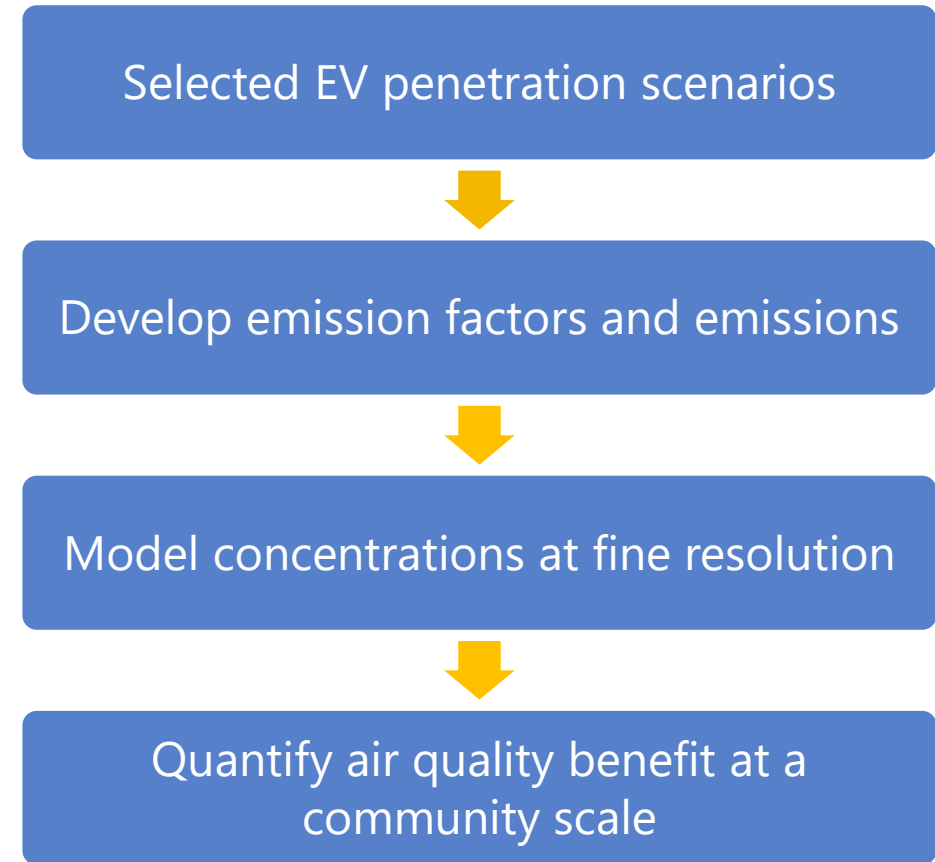
- Substantial penetration of electric vehicles (EVs) is expected to reduce GHG emissions and yield important public health benefits
- There is, however, an ongoing need to quantify EJ community impacts from EV use
- This study evaluates EV penetration scenarios and resulting air quality benefits
- A key goal was to quantify and contrast outcomes for communities with and without EJ concerns



# Study Design

- Identify a series of EV penetration scenarios for:
  - Light-duty vehicle (LDV) fleet
  - Medium- and heavy- duty vehicle (MHDV) fleet
- Estimate on-road mobile source emission factors and emissions for each scenario
- Model NO<sub>x</sub> and PM<sub>2.5</sub> concentrations from on-road vehicles at census block group\* centroids
- Quantify and contrast benefits between communities with and without EJ concerns for 2040

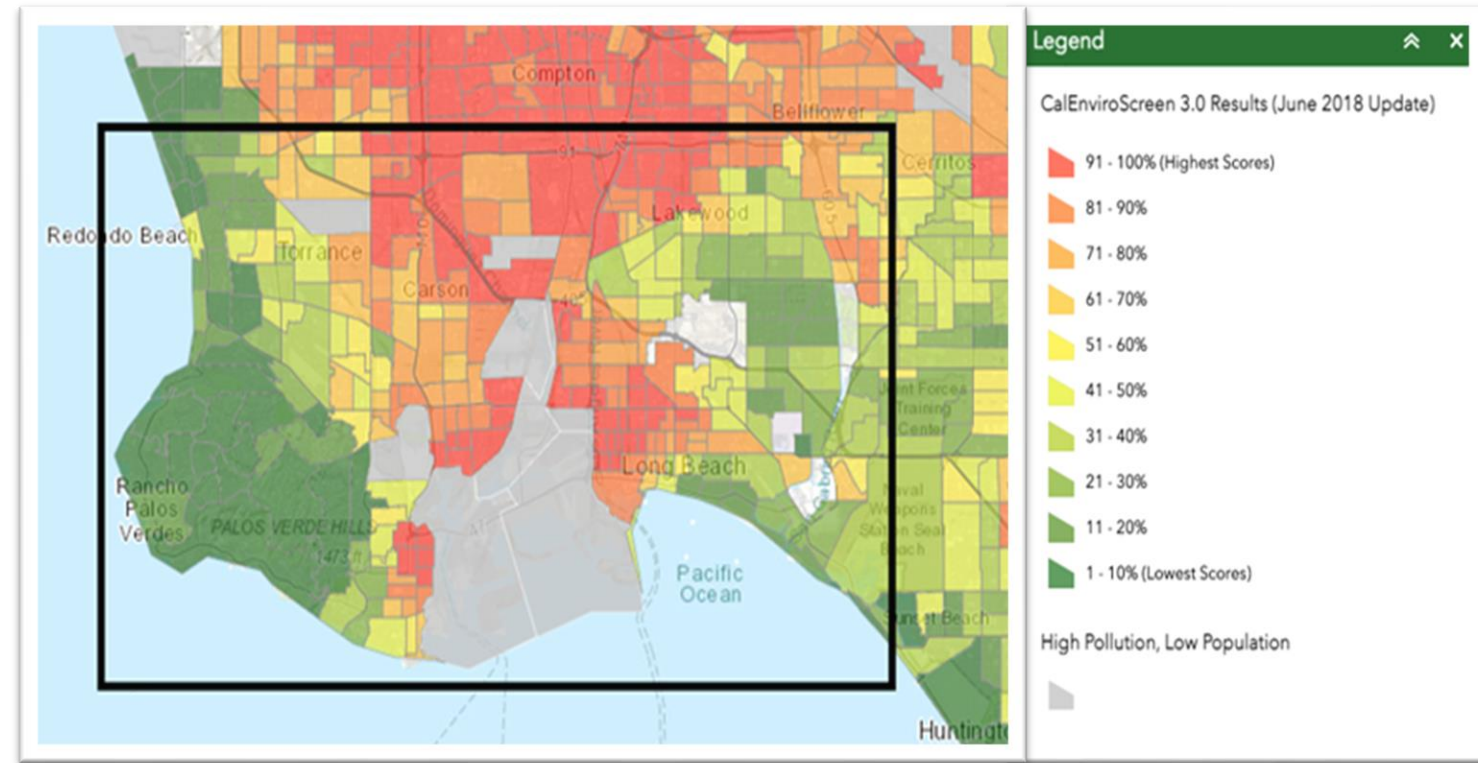
\*A Census Block Group is a geographical unit used by the United States Census Bureau which is between the Census Tract and the Census Block.





# Study Domain

- Includes the area that covers the I-710 corridor and the Port of Long Beach, as well as neighboring communities.
  - High truck volume (up to 16% of annual average daily traffic in 2019)
  - Covers communities with and without EJ concerns
- In 2017, a near-road monitor within this domain had:
  - The highest  $PM_{2.5}$  levels in the nation (Mukherjee et al., 2020)
  - The second highest near-road  $PM_{2.5}$  increments (i.e., contributions from on-road vehicles) (Mukherjee et al., 2020)



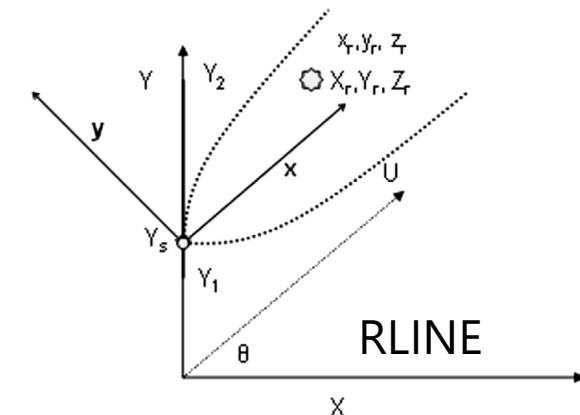
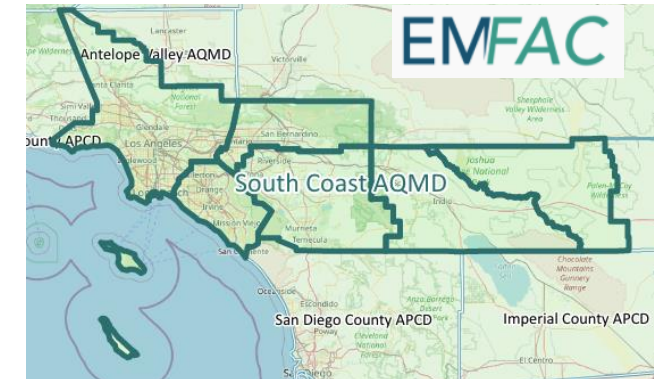
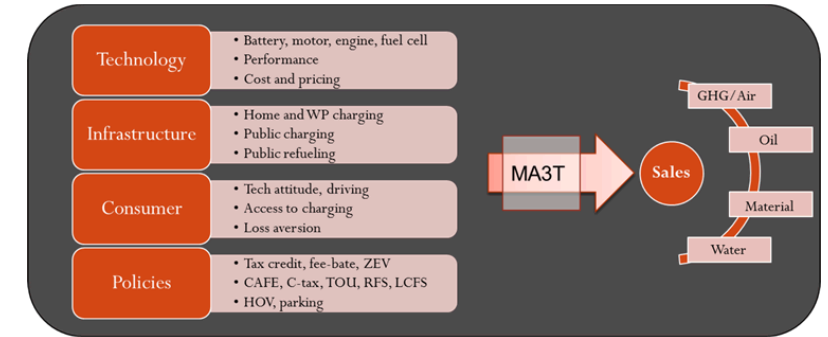
The census tracts in red represent potential communities with EJ concerns

Source: <https://oehha.ca.gov/calenviroscreen/report/calenviroscreen-30>

# Method Overview

- **EV population modeling**

- Light duty vehicle (LDV) fleet:
  - Tool: Market Acceptance of Advanced Automotive Technologies (MA<sup>3</sup>T)
  - Only consider battery electric vehicles (BEVs)
- Medium- and heavy-duty vehicle (MHDV) fleet:
  - Advance Clean Truck (ACT): CARB's policy analysis spreadsheet of regulations that will accelerate EV penetration in medium and heavy-duty fleet
  - Advance Clean Fleet (ACF): CARB's presentation using South Coast as an example





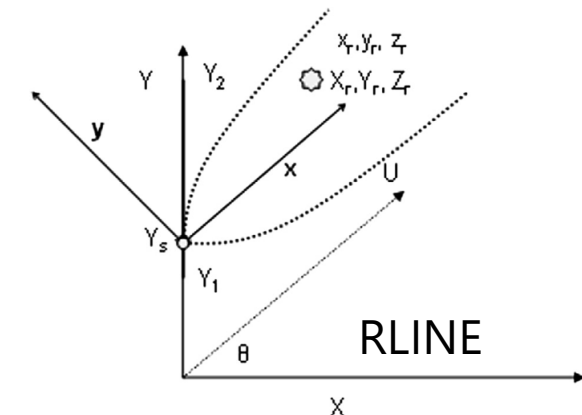
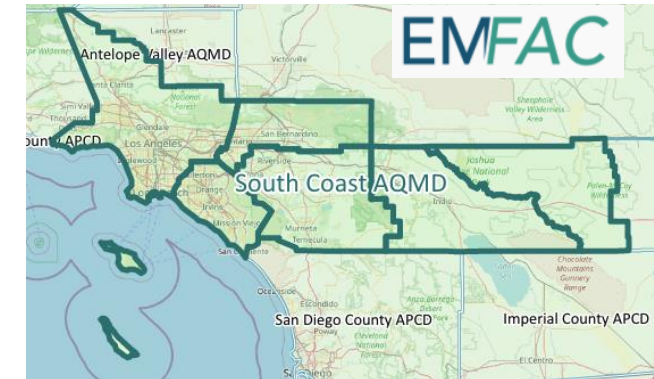
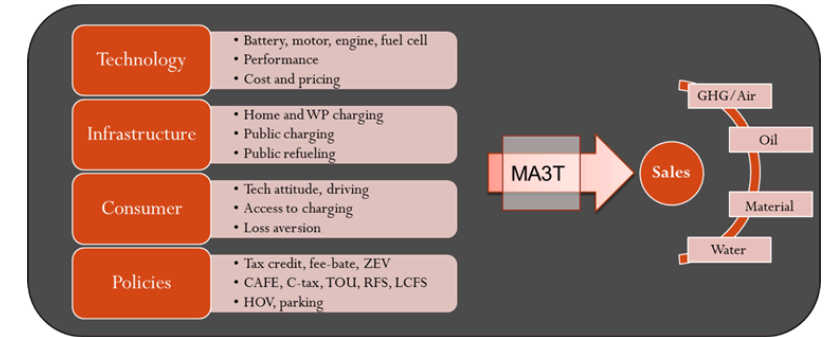
# Method Overview

## • Emissions modeling

- CARB's Emission FACtor (EMFAC) for area under South Coast Air Quality Management District (AQMD) jurisdiction
- EMFAC postprocessing to adopt additional EV penetration from each scenario
  - For brake wear, the emissions from EVs are half of those from ICE vehicles due to regenerative braking

## • Air Quality modeling

- Urban background: Inverse distance weighting (IDW) using AirNow monitoring data
- Concentration from on-road source: Research LINE (RLINE) source model (Snyder et al., 2013)



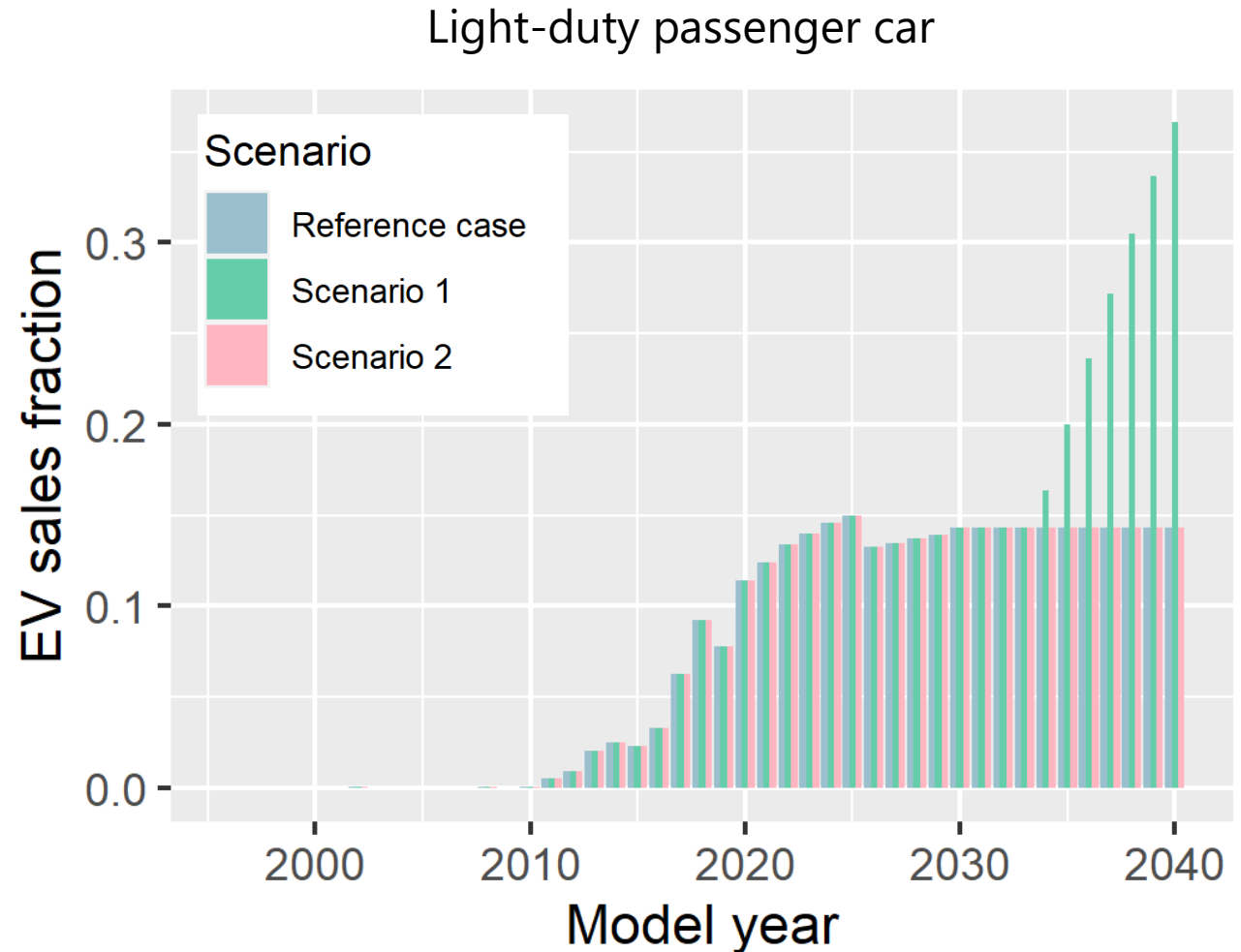
# EV Penetration Scenarios

Scenario	Policies that Impact Light-Duty Fleet	Policies that Impact Medium- and Heavy-Duty Fleet
<b>0. Reference case*</b>	No further policies to accelerate EV penetration	No further policies to accelerate EV penetration
<b>1. High emissions reduction</b>	The cost to manufacture light-duty EVs is comparable to internal combustion conventional vehicles starting in 2030	Advanced Clean Truck (ACT) and Advanced Clean Fleet (ACF) regulations
<b>2. Medium emissions reduction</b>	Medium gasoline price increases \$0.07 per gallon a year beginning in 2019	ACT regulation
<b>3. Emission reduction for MHDVs only</b>	No further policies to accelerate EV penetration	ACT and ACF regulations

\*The reference case includes adopted policies that are embedded in EMFAC 2017 with updated light-duty EV population based on EMFAC2021 light-duty EV sales fraction. EMFAC 2021 includes the ACT policy and therefore is not suitable for establishing the reference case.

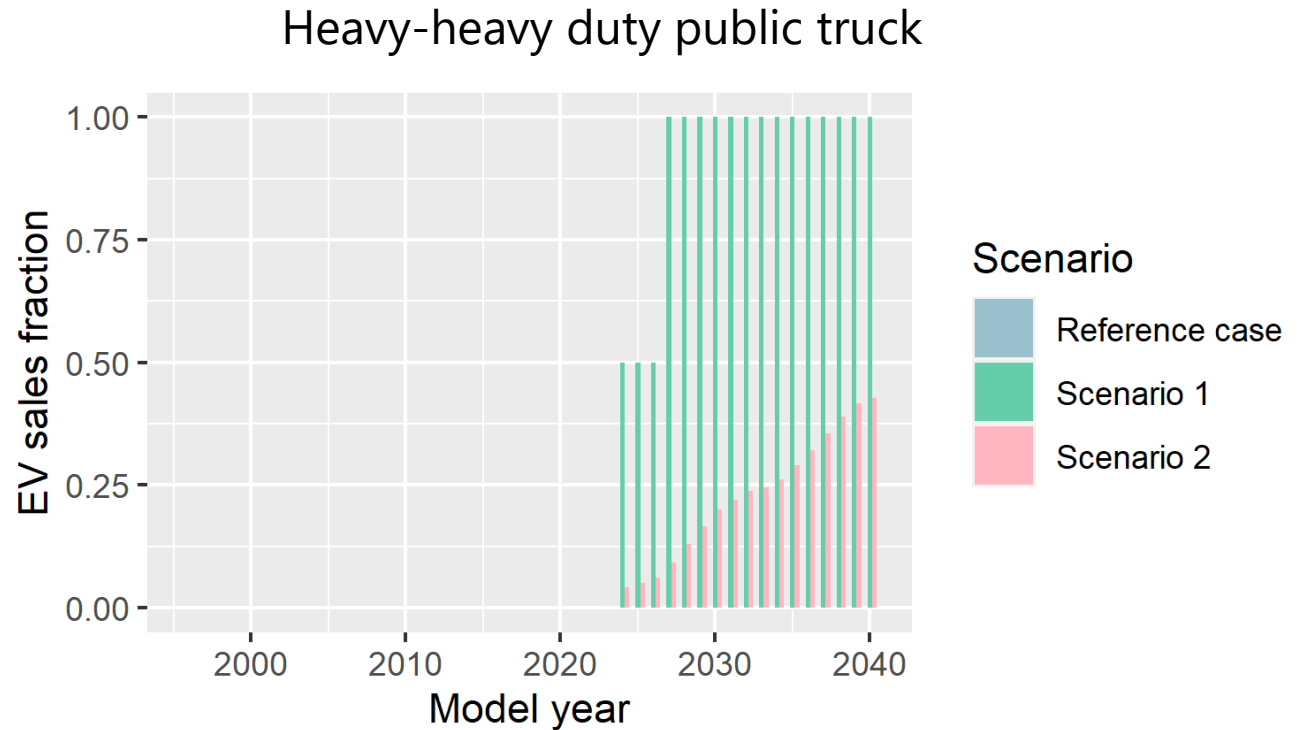
# EV Penetration Modeling for Calendar Year 2040

- Scenario specific EV % by model year is calculated from:
  - MA<sup>3</sup>T for LDV fleet
  - ACT and ACF regulations for medium- and heavy- duty fleet
- If the modeled EV % is less than EMFAC default EV %, no additional EV penetrated the fleet
- Example of EV penetration modeling: light duty passenger car



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- If the modeled EV % is less than EMFAC default EV %, no additional EV penetrated the fleet
- Example of EV penetration modeling: heavy-heavy duty public truck (one out of 29 EMFAC medium- and heavy-duty trucks)
  - High EV penetration with ACT + ACF regulation

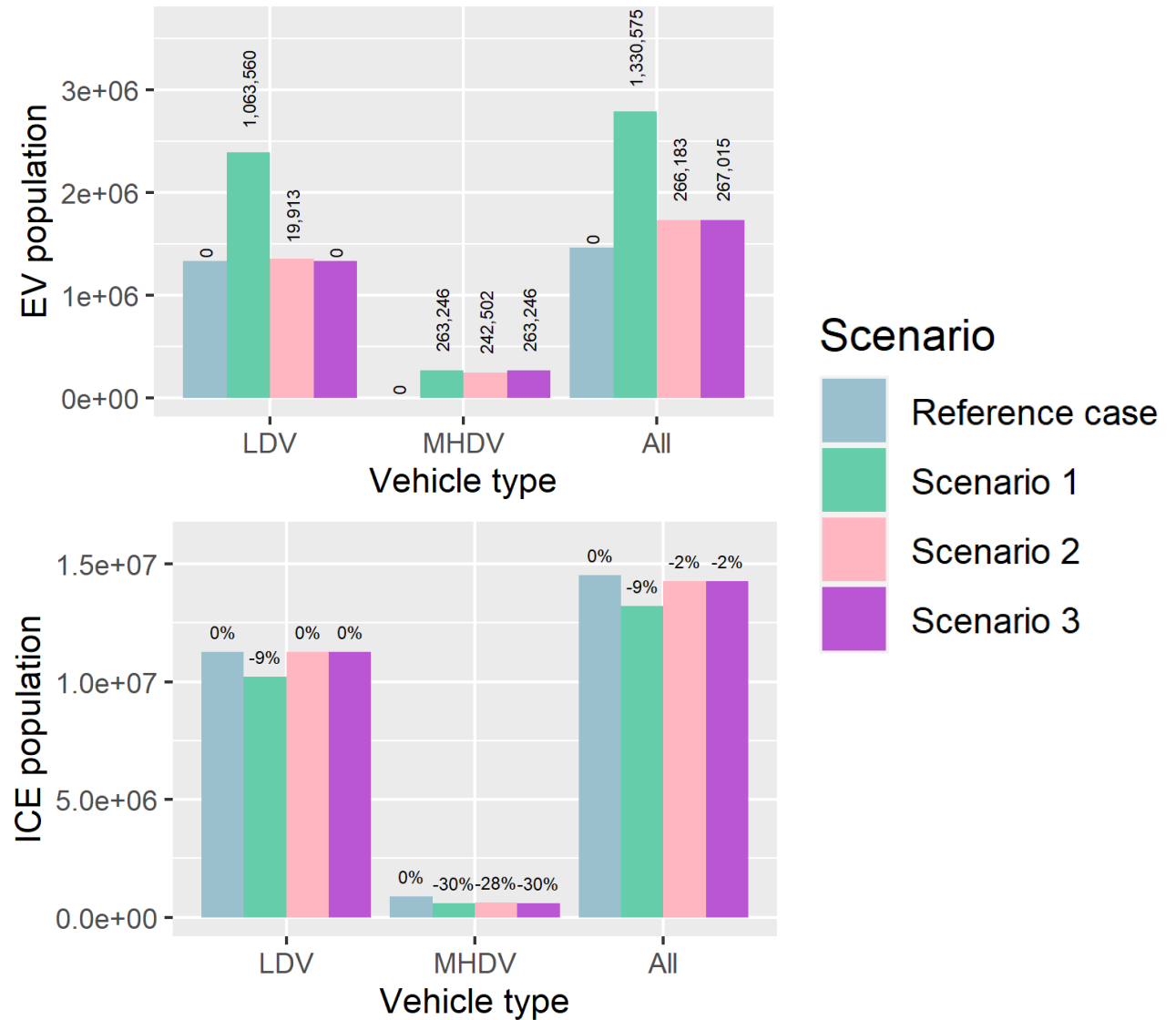


Heavy-heavy duty: gross vehicle weight rating (GVWR) > 33,000 lbs  
Public truck: ARB defines "public trucks" as trucks owned by California state or local government



# EV Penetration in 2040 by Scenario for South Coast Fleet

- For LDV fleet:
  - Scenario 1 replaced 9% of total on-road ICE (1 million) vehicles in the LDV fleet with EVs
  - Scenario 2 replaced 0.1% of total on-road ICE (19k) vehicles in the LDV fleet with EVs
- For MHDV fleet:
  - Scenario 1 replaced 30% of total on-road ICE (260k) vehicles in the MHDV fleet with EVs
  - Scenario 2 replaced 28% of total on-road ICE (240k) vehicles in the MHDV fleet with EVs
  - ACF replaced an additional 2% of total on-road ICE in MHDV fleet with EVs



\*ICE: Internal combustion engine

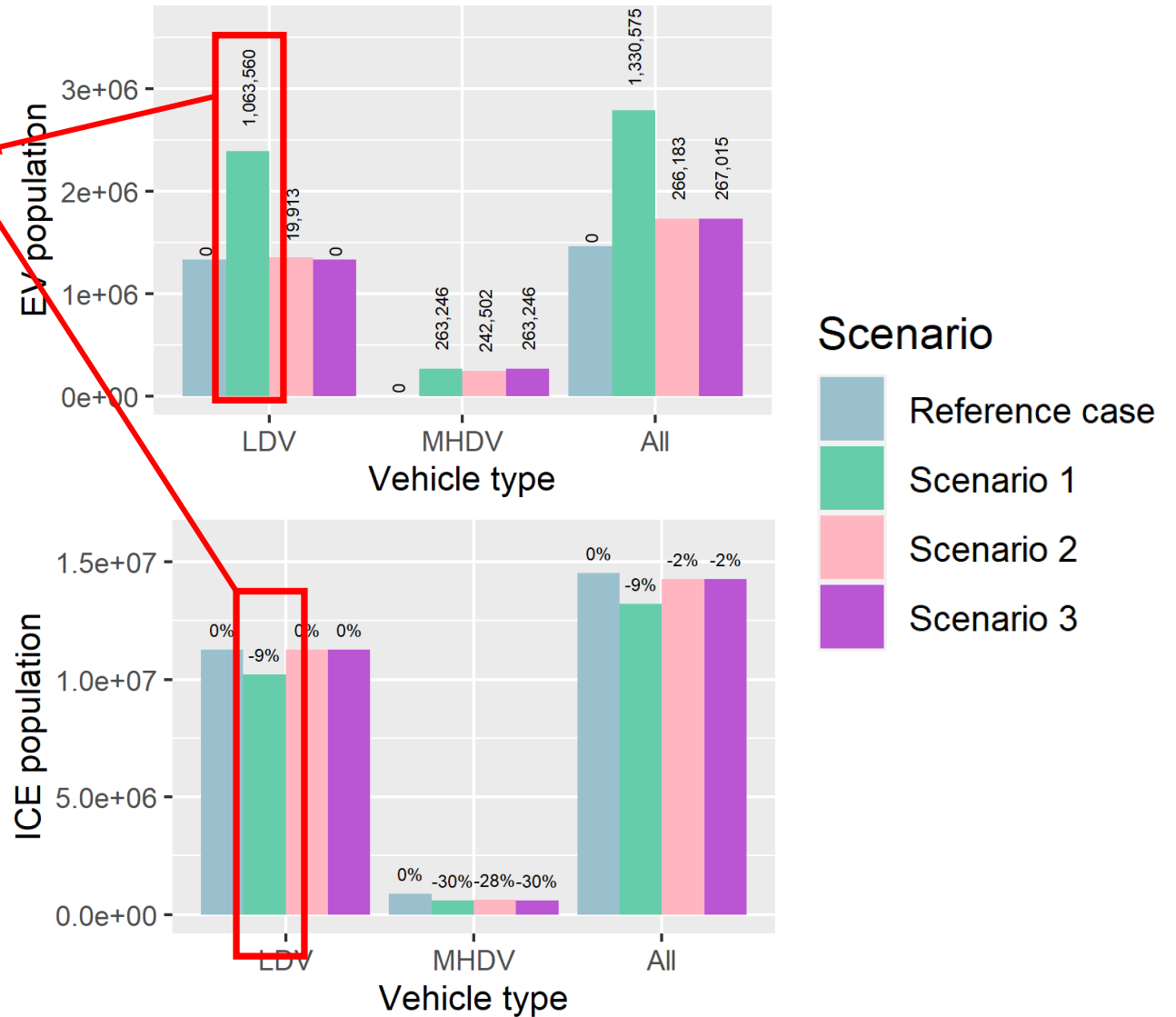
# EV Penetration in 20240 by Scenario for South Coast Fleet

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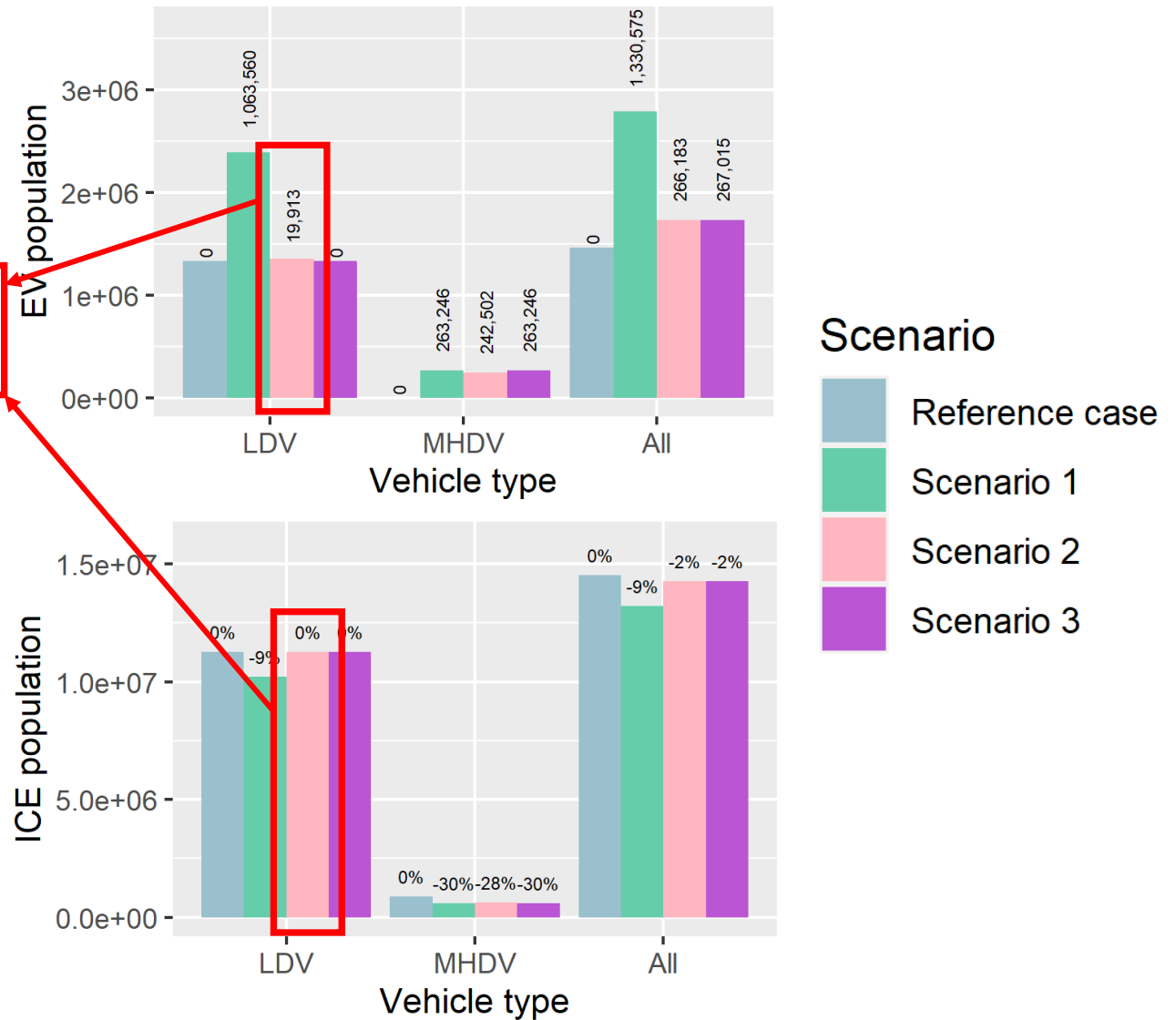
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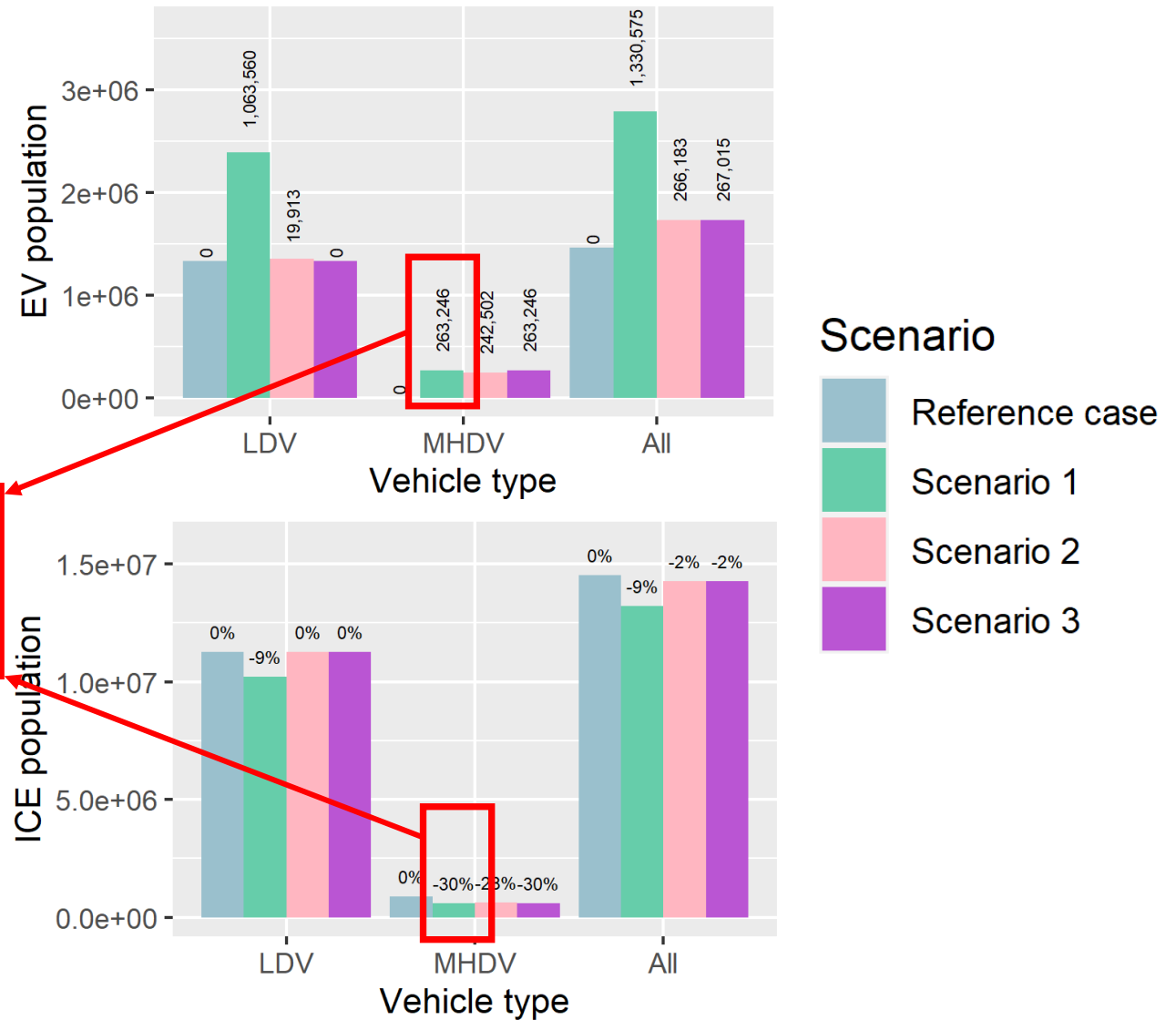
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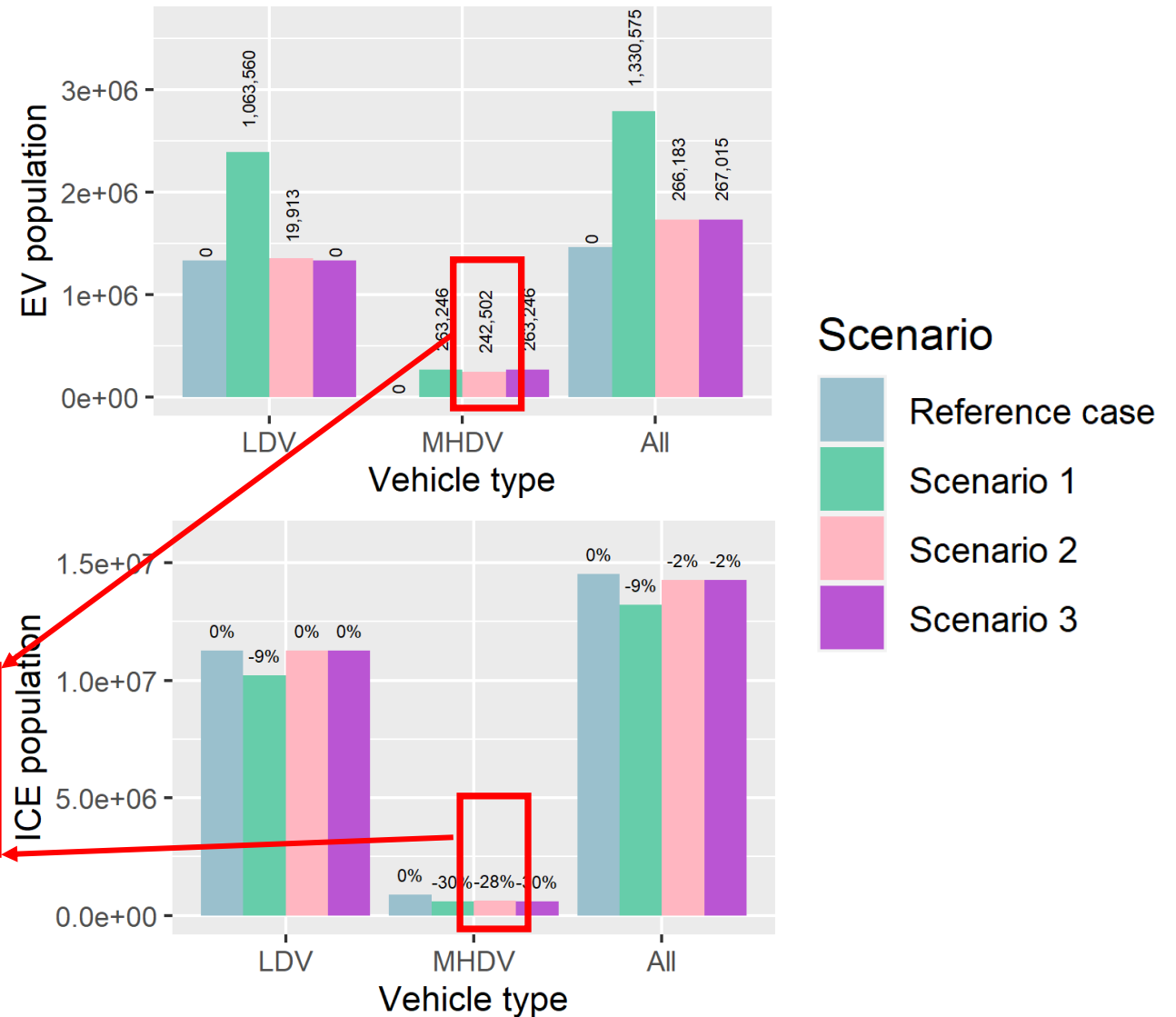
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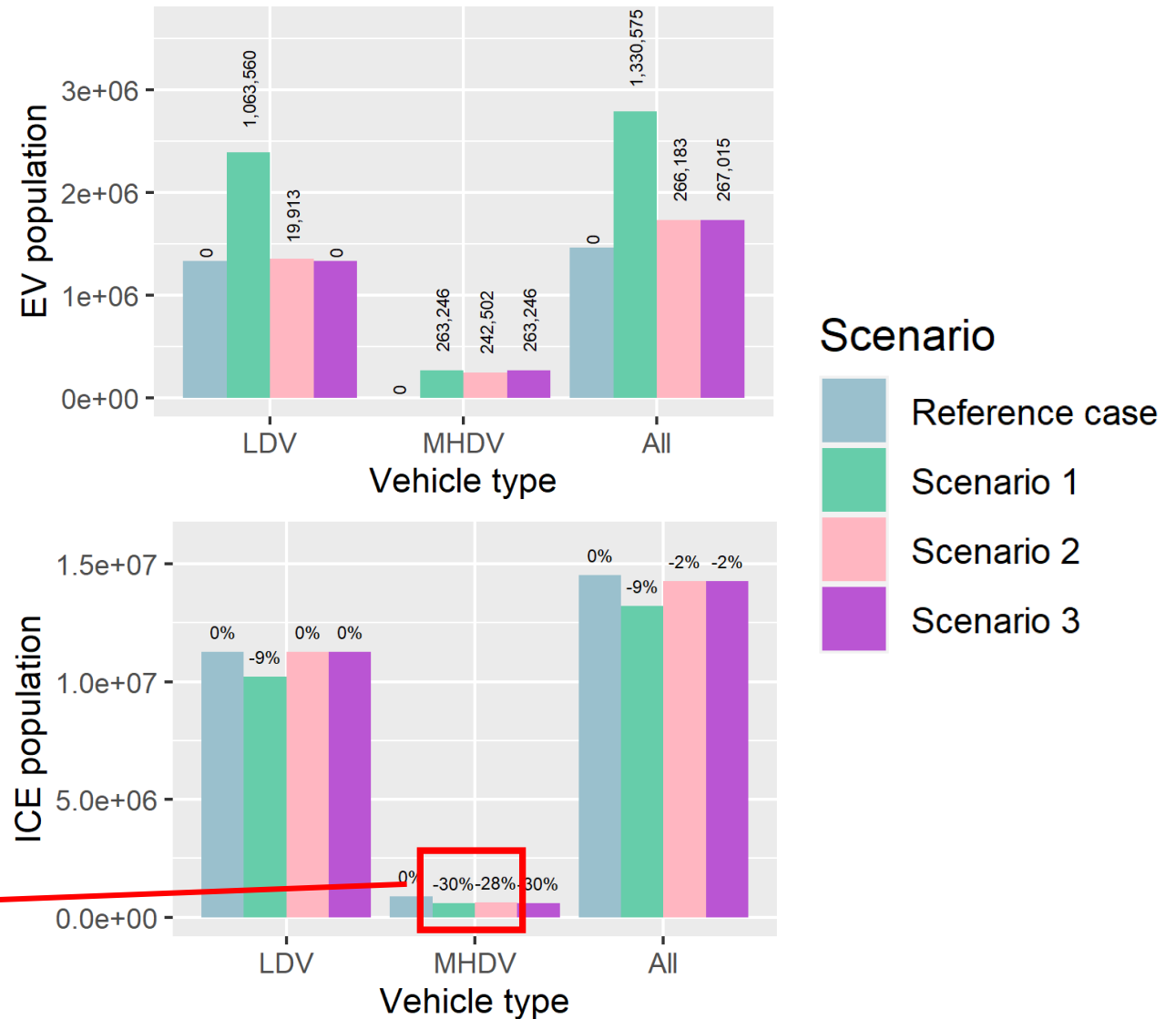
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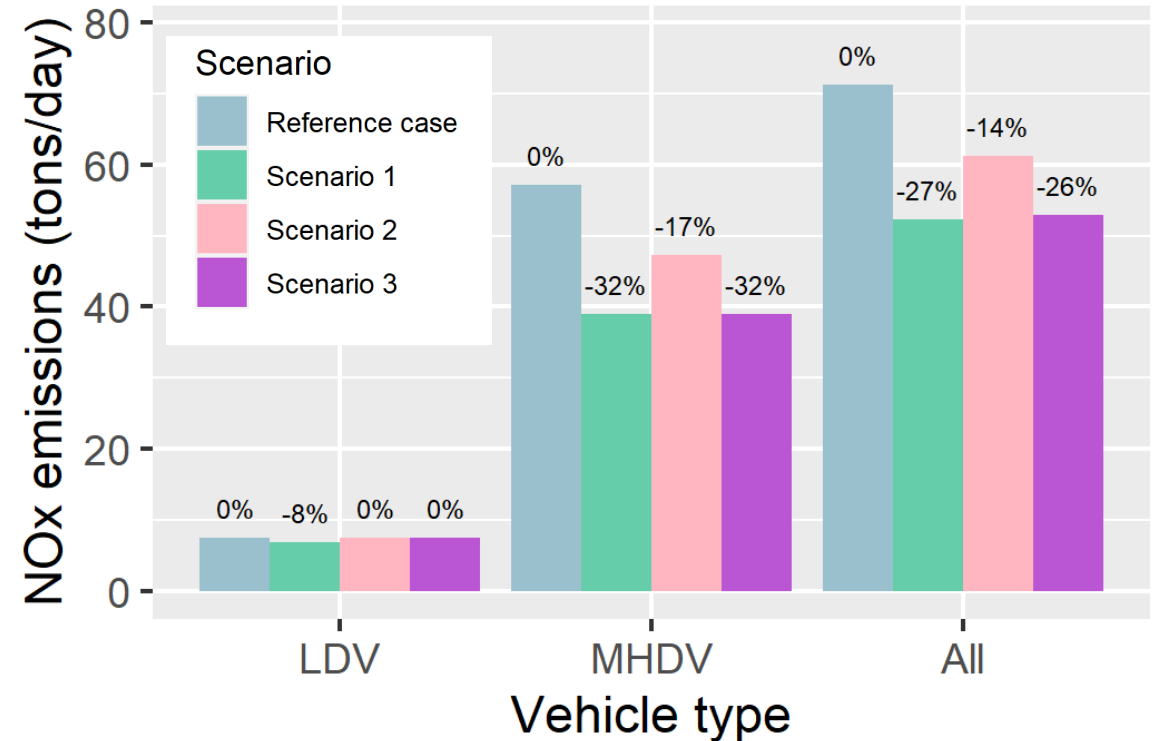
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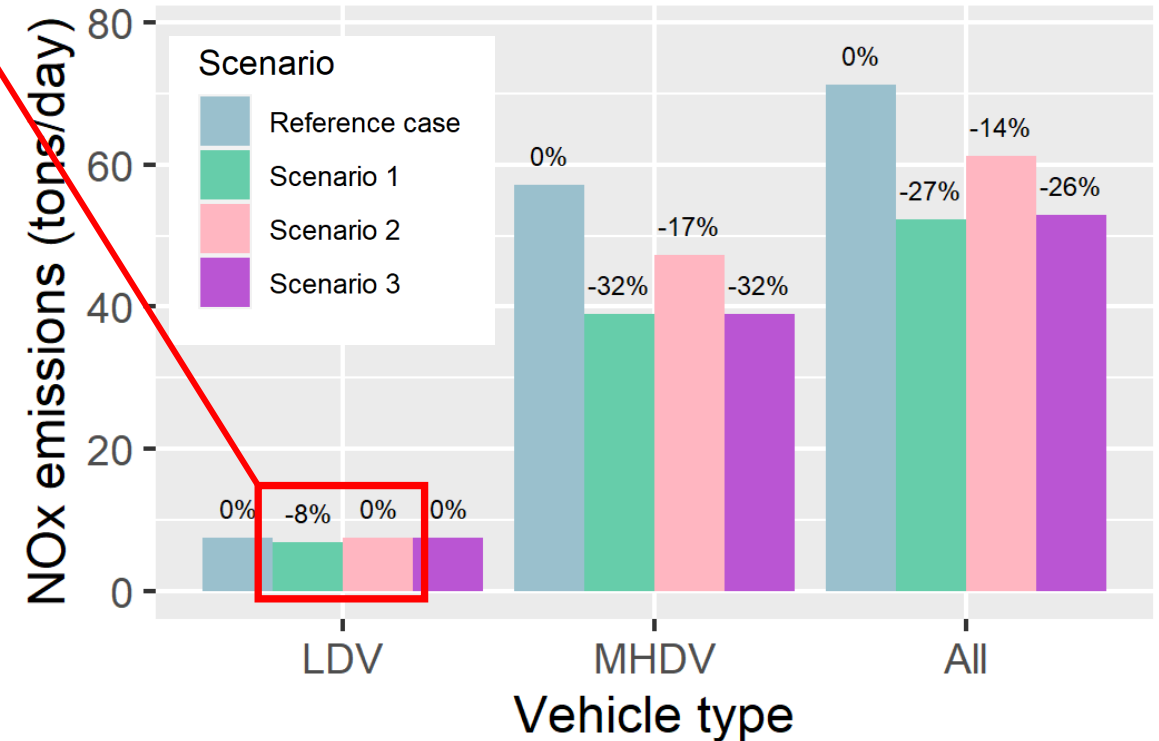
# NO<sub>x</sub> Emission (Tons/Day) in 2040 by Scenario for South Coast Fleet

- For LDV fleet:
  - Scenario 1 reduced LDV NO<sub>x</sub> emissions by 8%
  - Scenario 2 reduced LDV NO<sub>x</sub> emissions by 0.3%
  - Policies that affect earlier model years gain more emissions benefits because earlier model-year vehicles emit more pollutants
- For MHDV fleet:
  - Scenario 1 (ACT + ACF) reduced MHDV NO<sub>x</sub> emissions by 32%
  - Scenario 2 (ACT only) reduced MHDV NO<sub>x</sub> emissions by 17%
  - The additional 2% of ICE replaced with ACF resulted in an additional 15% NO<sub>x</sub> emissions reduction
- Because on-road NO<sub>x</sub> emissions are dominated by the MHDV fleet, EV penetration into the LDV fleet has less impact on NO<sub>x</sub> emissions reduction



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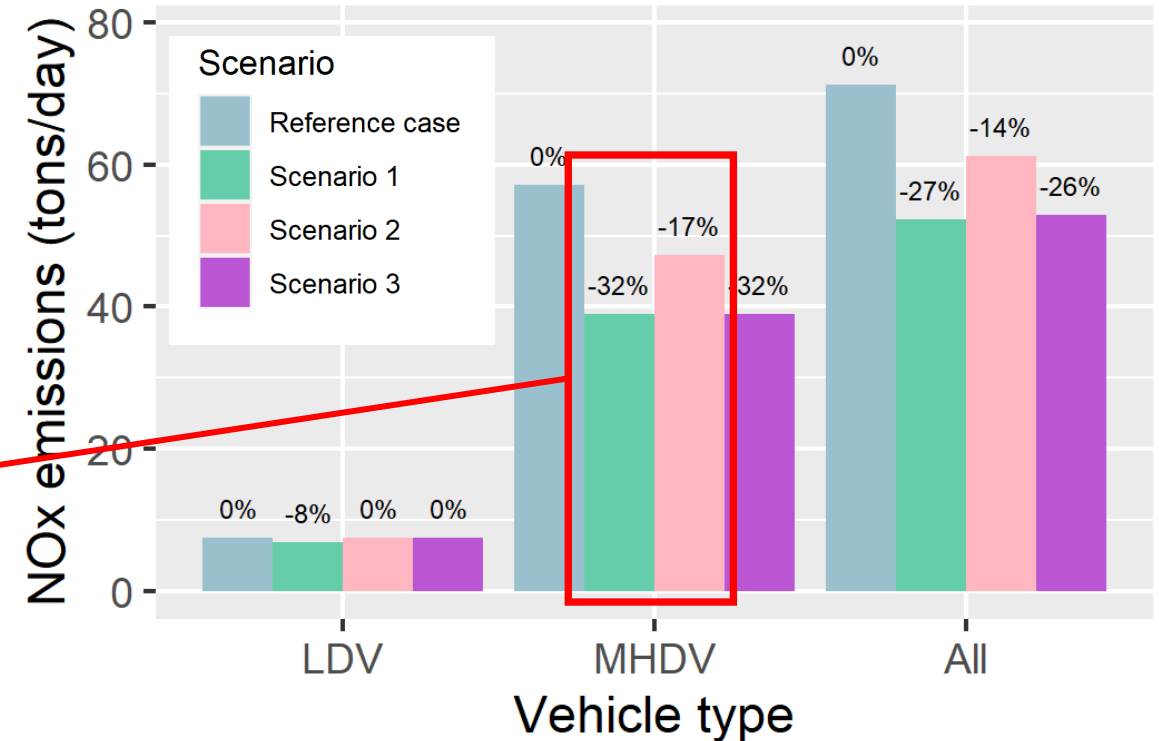
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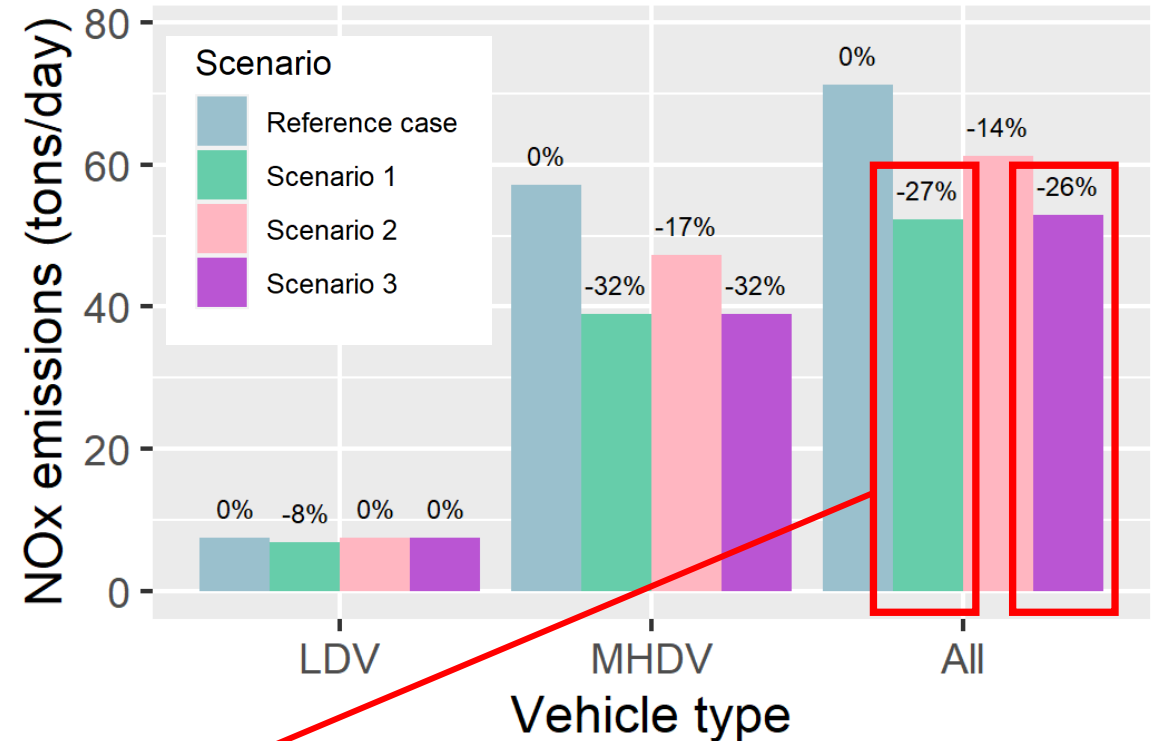
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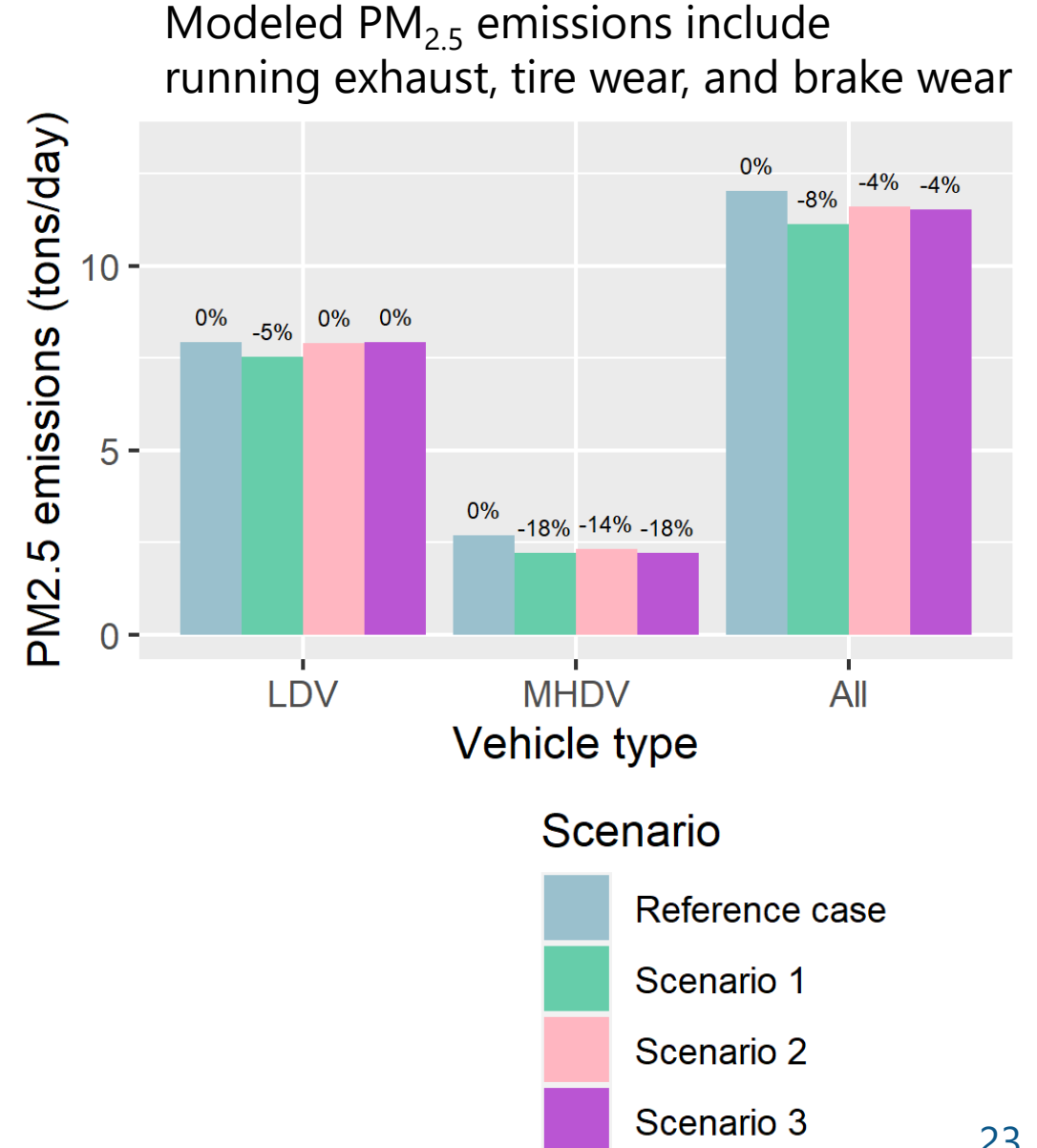
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  - The additional 2% of ICE replaced with ACF resulted in an additional 15% NO<sub>x</sub> emissions reduction
- Because on-road NO<sub>x</sub> emissions are dominated by the MHDV fleet, EV penetration into the LDV fleet has less impact on NO<sub>x</sub> emissions reduction



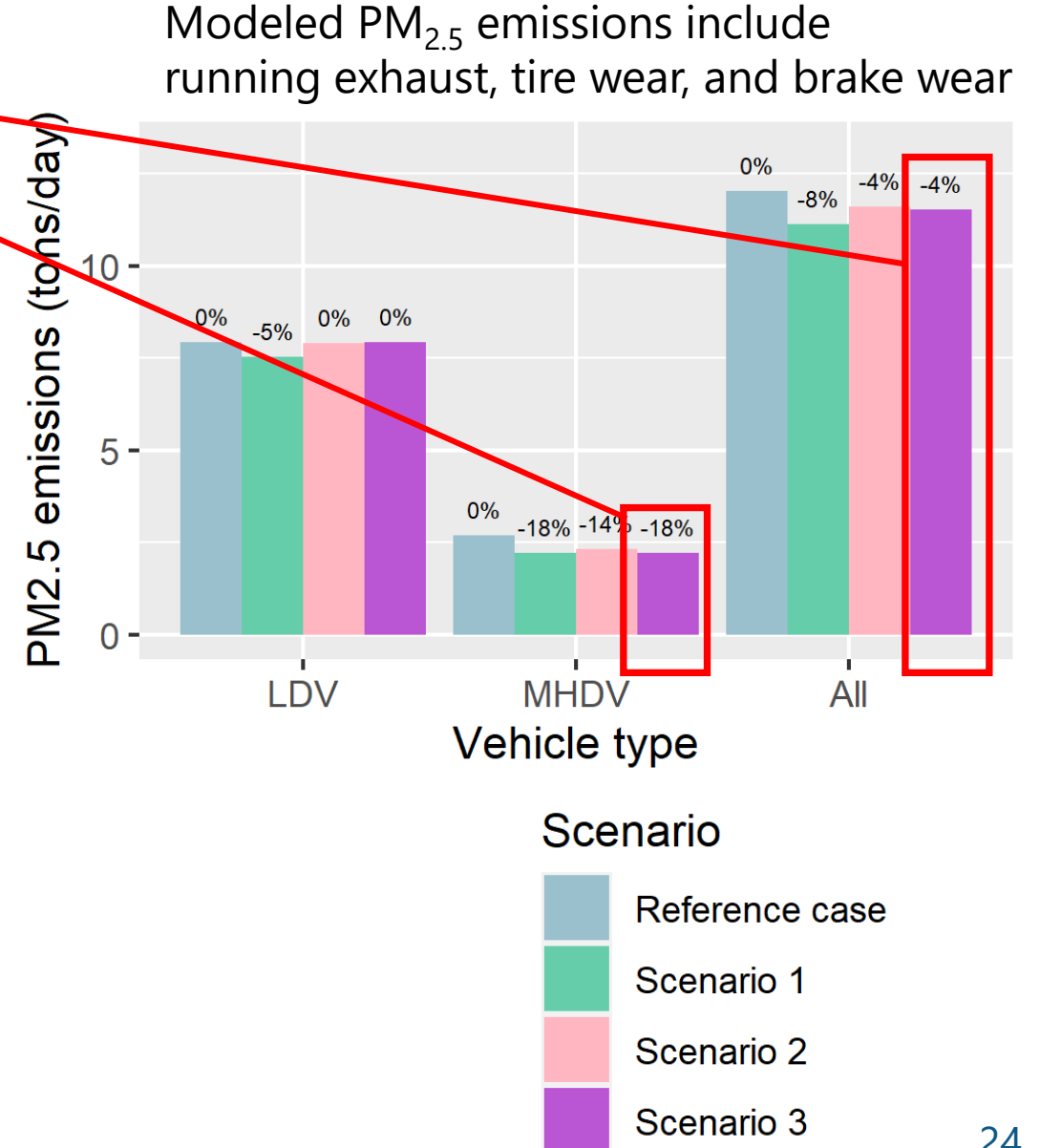
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- In contrast to NO<sub>x</sub> emissions, by 2040, LDVs contribute most of the on-road PM<sub>2.5</sub> emissions, making the benefits of electric MHDVs less impactful
- By 2040, brake wear is the major emission process contributing to on-road PM<sub>2.5</sub> (Reid et al. 2016)
- Embedded EMFAC assumptions key to analysis findings
  - EV penetration does not affect tire-wear emissions
  - EV brake wear emissions are half of ICE brake wear emissions
  - EV penetration significantly reduces running exhaust emissions



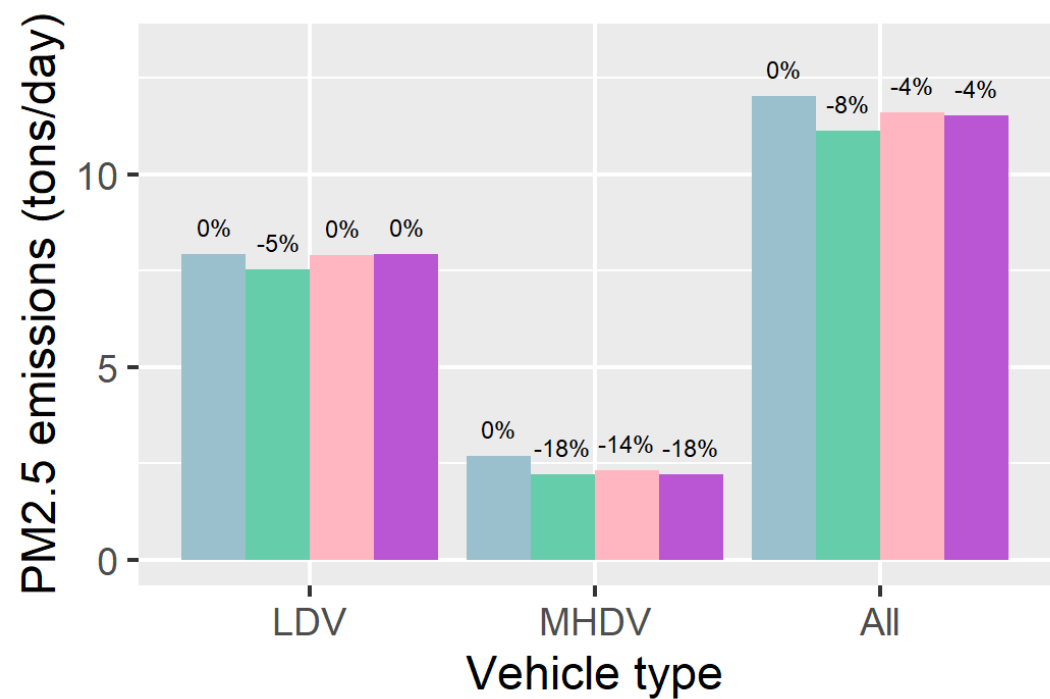
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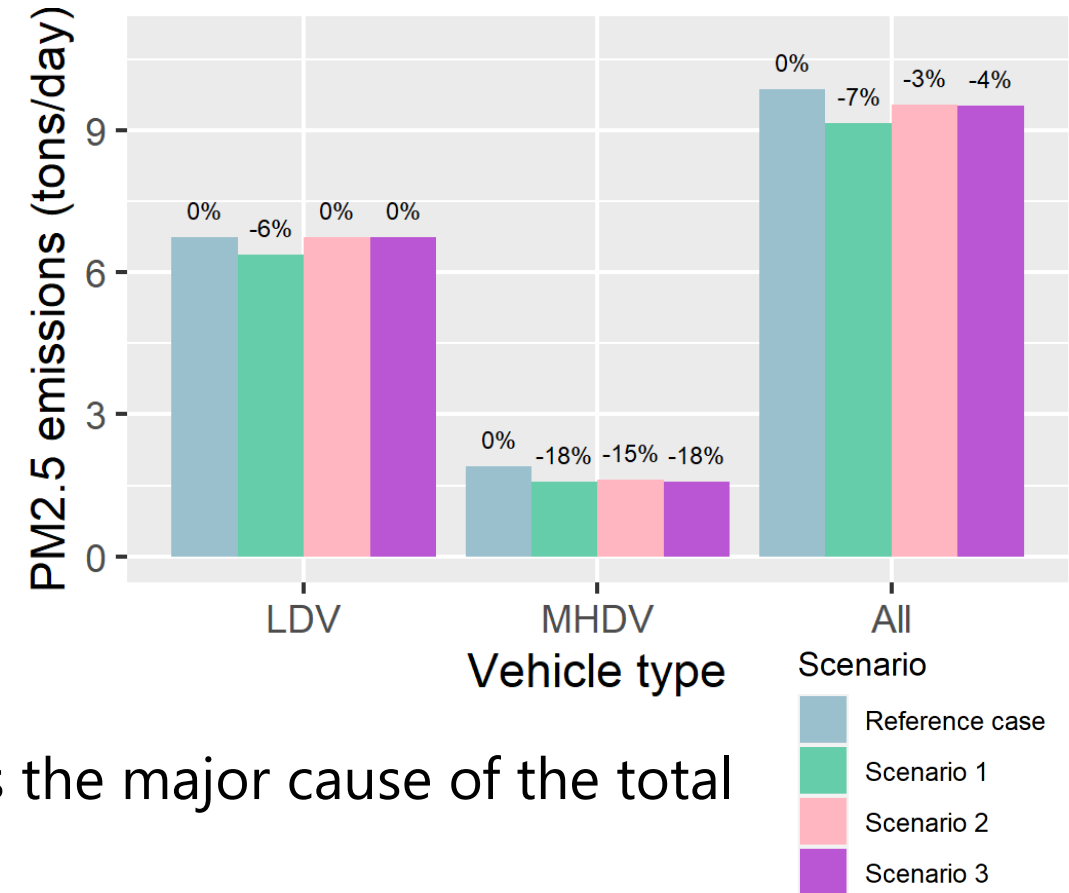


# PM<sub>2.5</sub> Running Exhaust Emission (Tons/Day) in 2040 by Scenario for South Coast Fleet

Modeled PM<sub>2.5</sub> emissions include running exhaust, tire wear, and brake wear



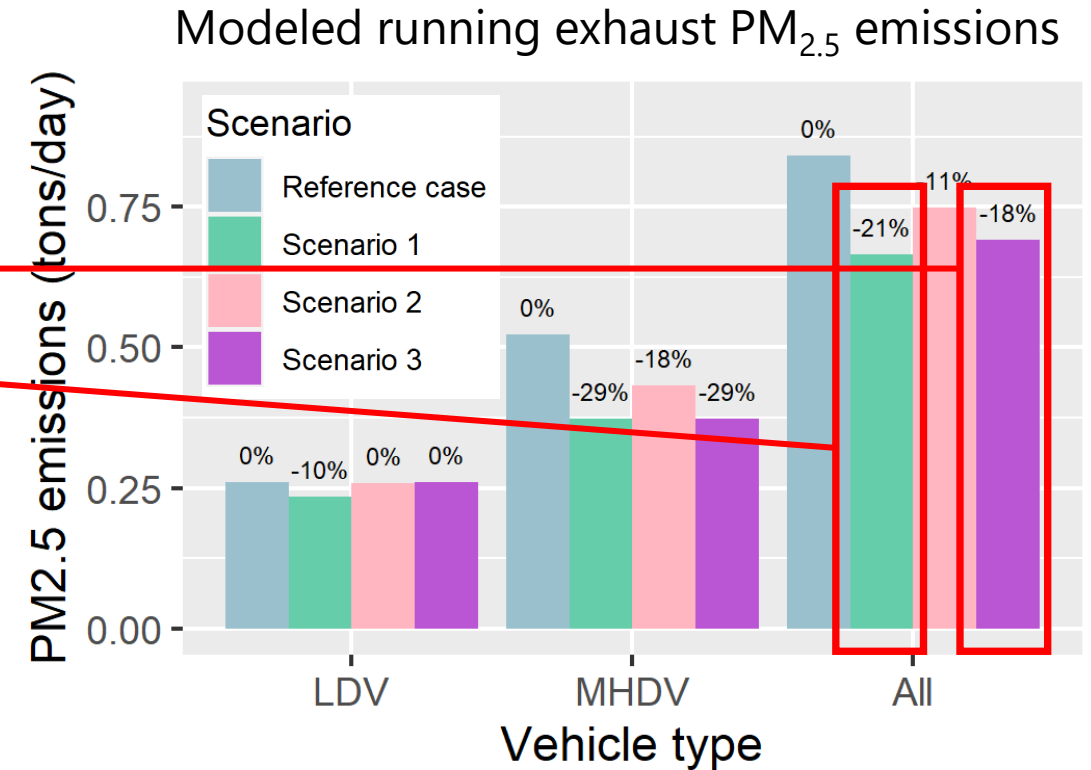
Modeled brake wear PM<sub>2.5</sub> emissions



The reduction in brake wear PM<sub>2.5</sub> emissions is the major cause of the total PM<sub>2.5</sub> reduction

# PM<sub>2.5</sub> Running Exhaust Emission (Tons/Day) in 2040 by Scenario for South Coast Fleet

- EV penetration significantly reduces running exhaust emissions
- Comparison between scenario 1 and 3 shows that LDV EV penetration contributed an additional 3% reduction of overall running exhaust PM<sub>2.5</sub> emissions





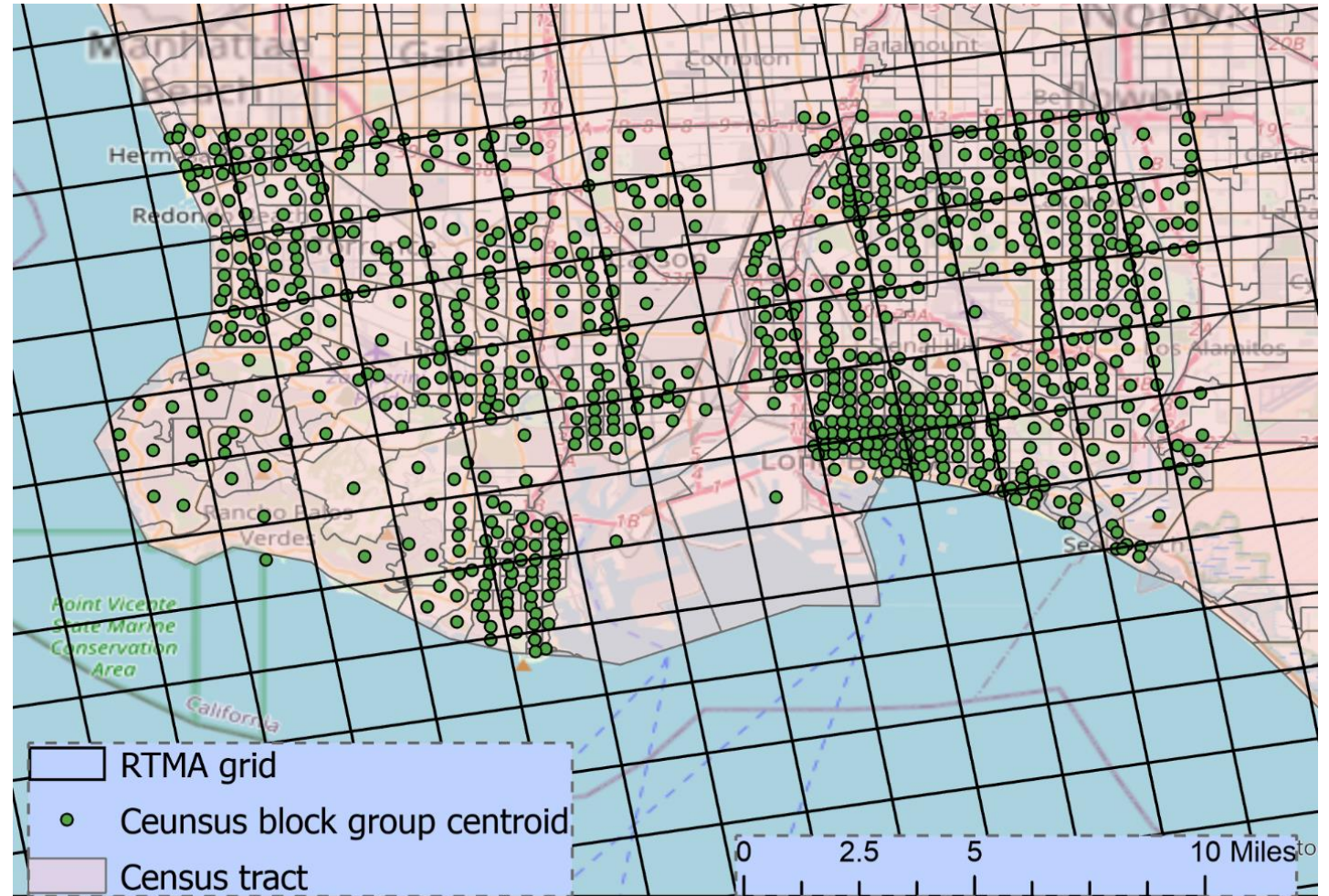
# Summary of Results

Scenario	ICE reductions (%)	NO <sub>x</sub> reductions (%)	PM <sub>2.5</sub> reductions (%)
Scenario 1	9	27	8
Scenario 2	2	14	4
Scenario 3	2	26	4

- NO<sub>x</sub> emissions
  - Scenario 3 showed similar NO<sub>x</sub> emission reduction (26%) to Scenario 1 (27%) because MHDV fleet is the major NO<sub>x</sub> contributor
- PM<sub>2.5</sub> emissions
  - EV penetration does not greatly reduce PM<sub>2.5</sub> emissions
    - Brake wear is the biggest contributor for PM<sub>2.5</sub> emissions, and LDV is the biggest contributor for brake wear PM<sub>2.5</sub>
    - Since the EV penetration in the LDV fleet is not high (0.1% and 9%) in our scenarios, the overall PM<sub>2.5</sub> emissions reductions is limited

# Next Steps

- Develop roadway-specific emissions using traffic activity data from Streetlytics (<https://www.bentley.com/en/products/brands/streetlytics>)
- Fine resolution modeling using real-time mesoscale analysis (RTMA) meteorological field



# References

- Rowangould, G.M., 2013. A census of the U.S. near-roadway population: Public health and environmental justice considerations. *Transp. Res. Part D Transp. Environ.* 25, 59–67. doi:10.1016/j.trd.2013.08.003
- Erdakos G., Chang S.Y., Eisinger D., Heller A., and Unger H. (2019) Zero emission vehicles: forecasting fleet scenarios and their emissions implications. Final report prepared for NCHRP 25-25, Task 115 by Sonoma Technology, Inc., Petaluma, CA, and Louis Berger, Denver, CO, STI-918083-7043, November. Available at <http://www.trb.org/Main/Blurbs/180232.aspx>.
- Mukherjee A., McCarthy M.C., Brown S.G., Huang S., Landsberg K., and Eisinger D.S. (2020) Influence of roadway emissions on near-road PM<sub>2.5</sub>: monitoring data analysis and implications. *Transportation Research Part D: Transport and Environment*, 86(102442), (STI-7166). Available at <https://www.sciencedirect.com/science/article/pii/S1361920920306295>.
- Snyder, M.G., Venkatram, A., Heist, D.K., Perry, S.G., Petersen, W.B., Isakov, V., 2013. RLINE: A line source dispersion model for near-surface releases. *Atmos. Environ.* 77, 748–756. doi:10.1016/j.atmosenv.2013.05.074
- Reid, S., Bai, S., Du, Y., Craig, K., Erdakos, G., Baringer, L., Eisinger, D., McCarthy, M., Landsberg, K., 2016. Emissions Modeling with MOVES and EMFAC to Assess the Potential for a Transportation Project to Create Particulate Matter Hot Spots. *Transp. Res. Rec. J. Transp. Res. Board* 2570, 12–20. doi:10.3141/2570-02



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Supplementary slides

# Comparison to previous studies

- A. EV population

Study	Heavy Duty EV population % in 2040
Raju et al., 2021	26% (CARB scoping plan in the South Coast region)
Current (this) study	30% (Scenario 1)

- B. Emissions

Study	On-road emissions (tons/year) in 2040	
	NO <sub>x</sub>	PM <sub>2.5</sub>
EPRI, 2020 (South Coast 1.33 km domain)*	19,000**	5,000**
Current study	26,000 (Reference case) 19,000 (Scenario 1)	4,500 (Reference case) 4,100 (Scenario 1)

\* A scenario that meets California's economy-wide decarbonization targets of 40% by 2030 (relative to 1990 levels) and 80% in 2050

\*\*Interpolated from the 2030 and 2050 estimates

- C. Emissions change

Study	NO <sub>x</sub> emission reduction (tons/day)	
	Light-duty fleet	Heavy-duty fleet
South Coast AQMP (2031)*	6	15
Current study (2040)	1	18

\*Estimates with range of local, state, and federal emission reduction measures, including emission reduction programs that are still in development



# ACT regulation

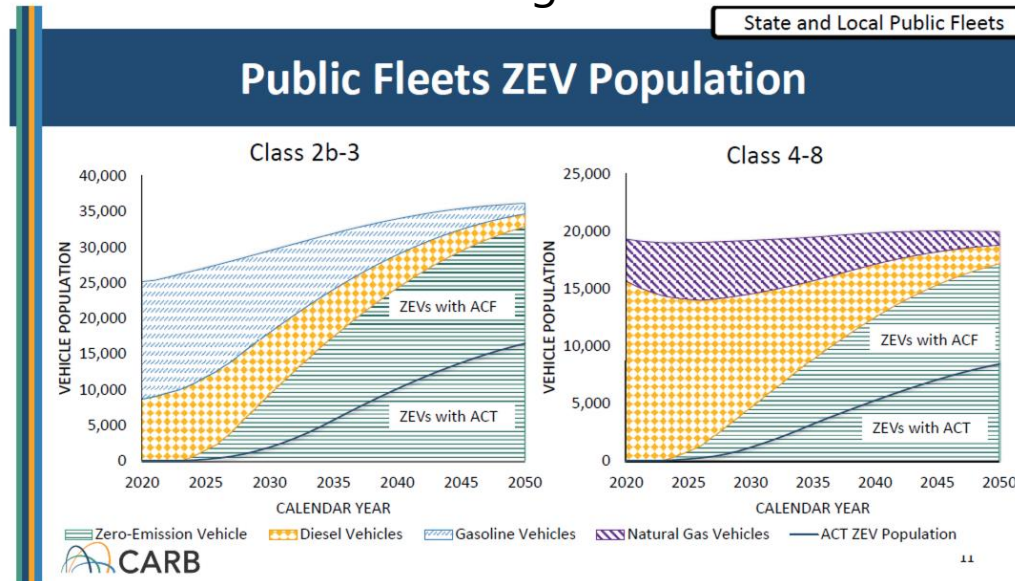
- Zero-emission truck sales: Manufacturers who certify Class 2b-8 chassis or complete vehicles with combustion engines would be required to sell zero-emission trucks as an increasing percentage of their annual California sales from 2024 to 2035. By 2035, zero-emission truck/chassis sales would need to be 55% of Class 2b – 3 truck sales, 75% of Class 4 – 8 straight truck sales, and 40% of truck tractor sales.

<https://ww2.arb.ca.gov/resources/fact-sheets/advanced-clean-trucks-fact-sheet>

# ACF regulation

- Phase-in zero emission trucks and buses 2023 to 2045\*
  - State and local government fleets
  - High priority private fleets and federal agencies
  - Drayage trucks serving ports and railyards

Example with the state and local government fleets



Source: <http://www.aqmd.gov/docs/default-source/clean-air-plans/air-quality-management-plans/2022-air-quality-management-plan/carb-epa-presentations---hd-trucks-03-24-21.pdf?sfvrsn=8>