

# Implications of Emerging Trends and Needs for MOVES

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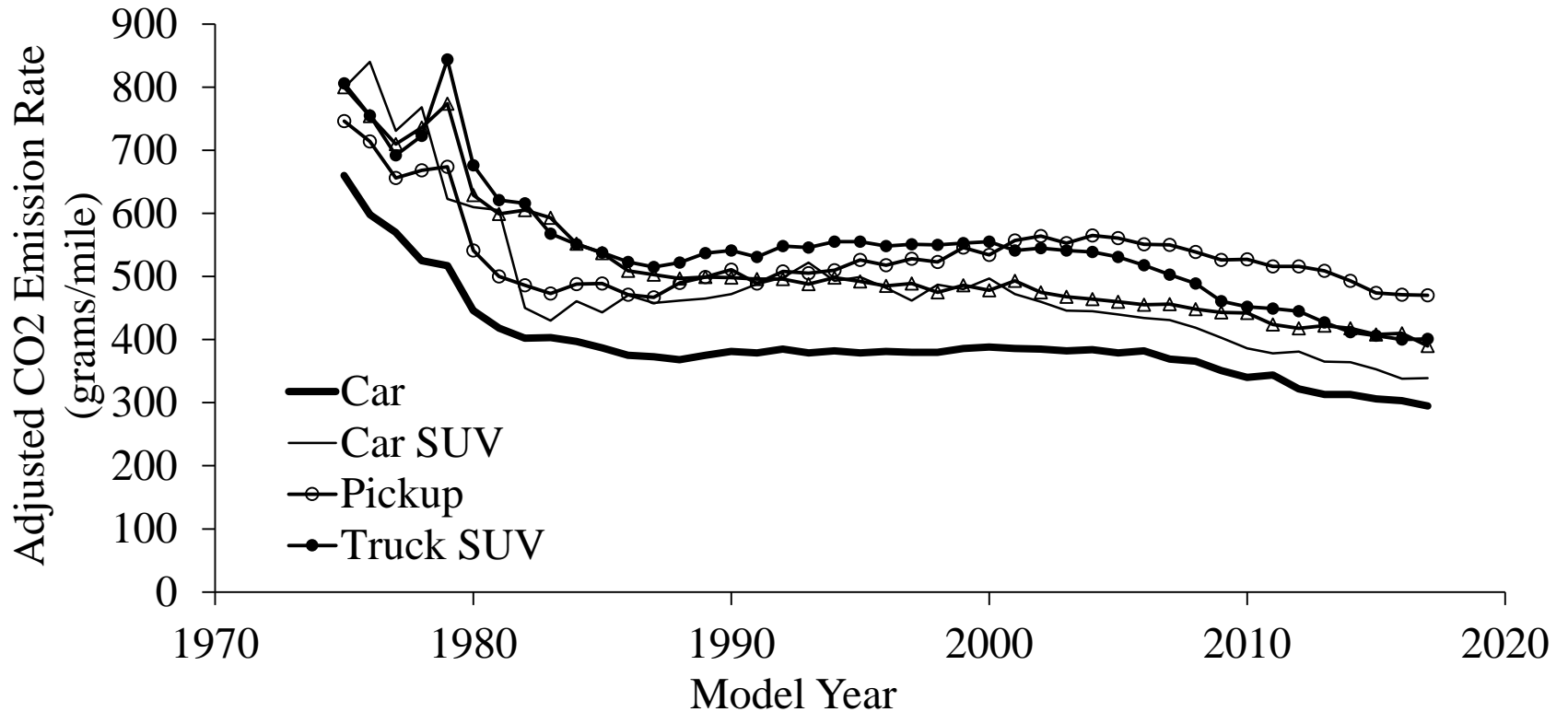
Clean Air Act Advisory Committee

March 7, 2018

# Outline

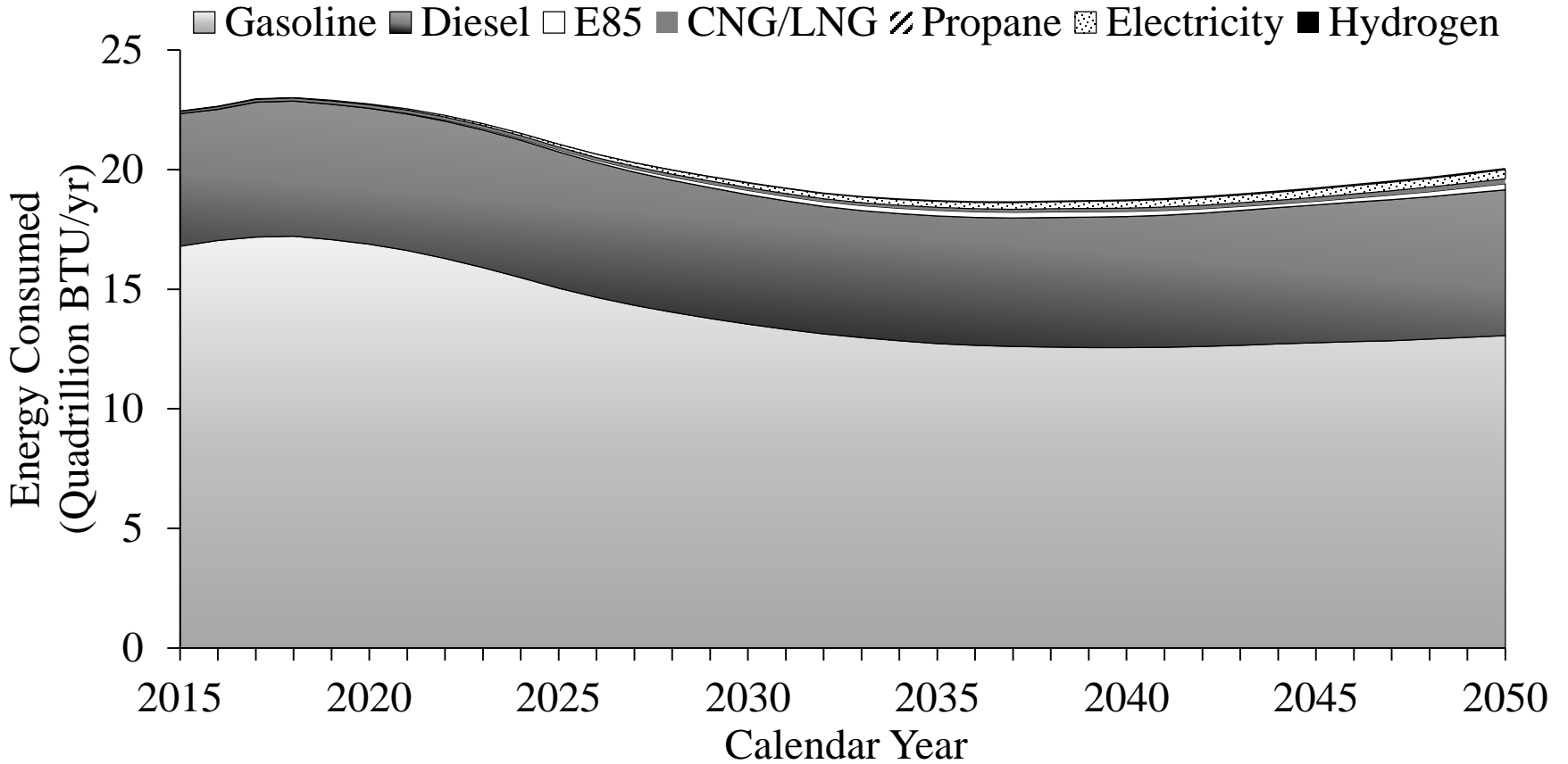
- Trends in Light Duty Vehicle Technology
- Gas Direct Injection
- Beyond E10
- Flex Fuel Vehicles
- Hybrid Electric Vehicles
- Plug-In Hybrid Electric Vehicles
- Vocational Vehicles and Duty Cycles
- Vehicle Load
- Other Needs

# Trends in Light Duty Gasoline Vehicle CO<sub>2</sub> Emission Rates



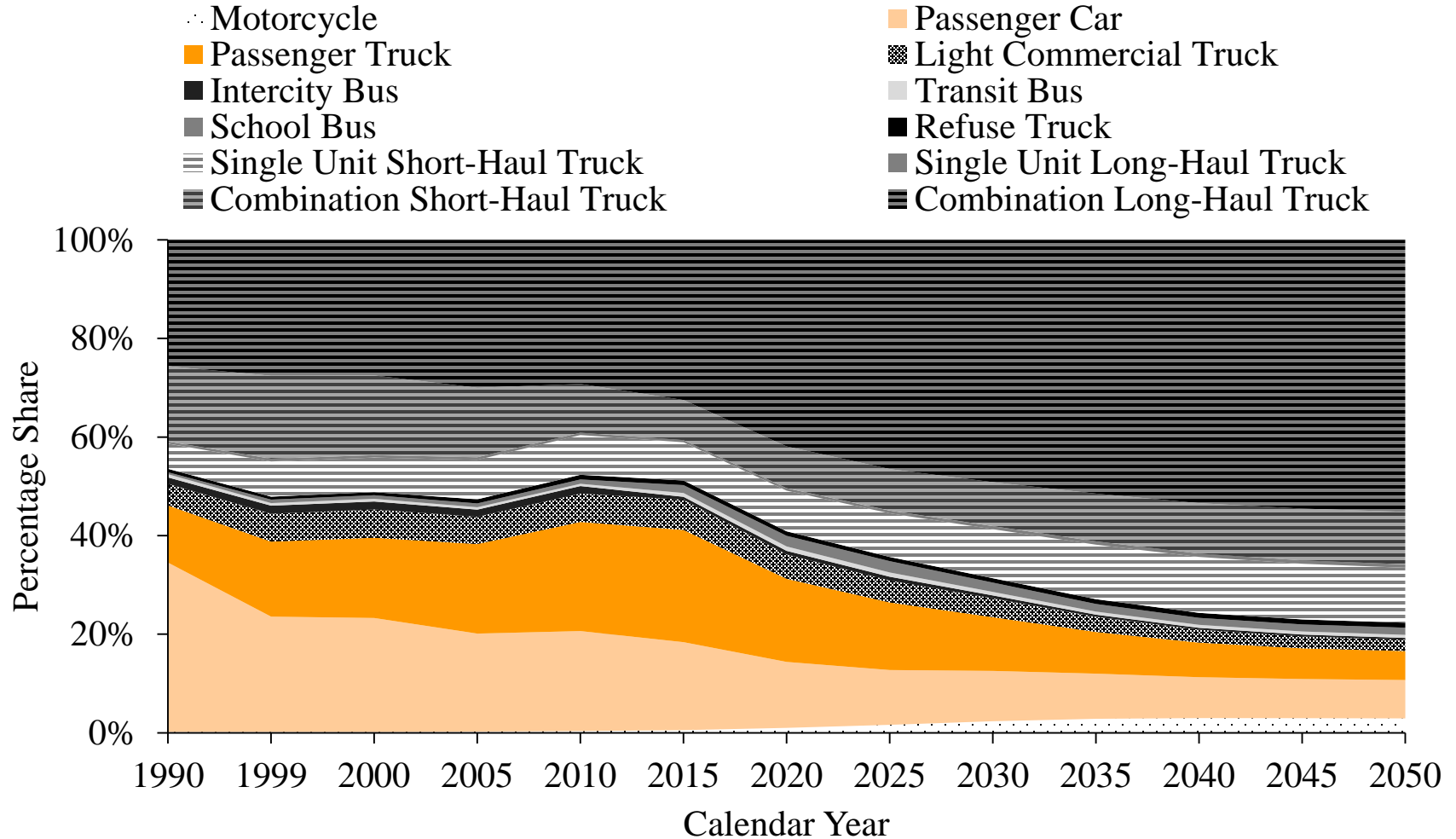
Source: (EPA, 2018)

# Projected Trend in U.S. Highway Vehicle Energy Consumption: 2015 to 2050



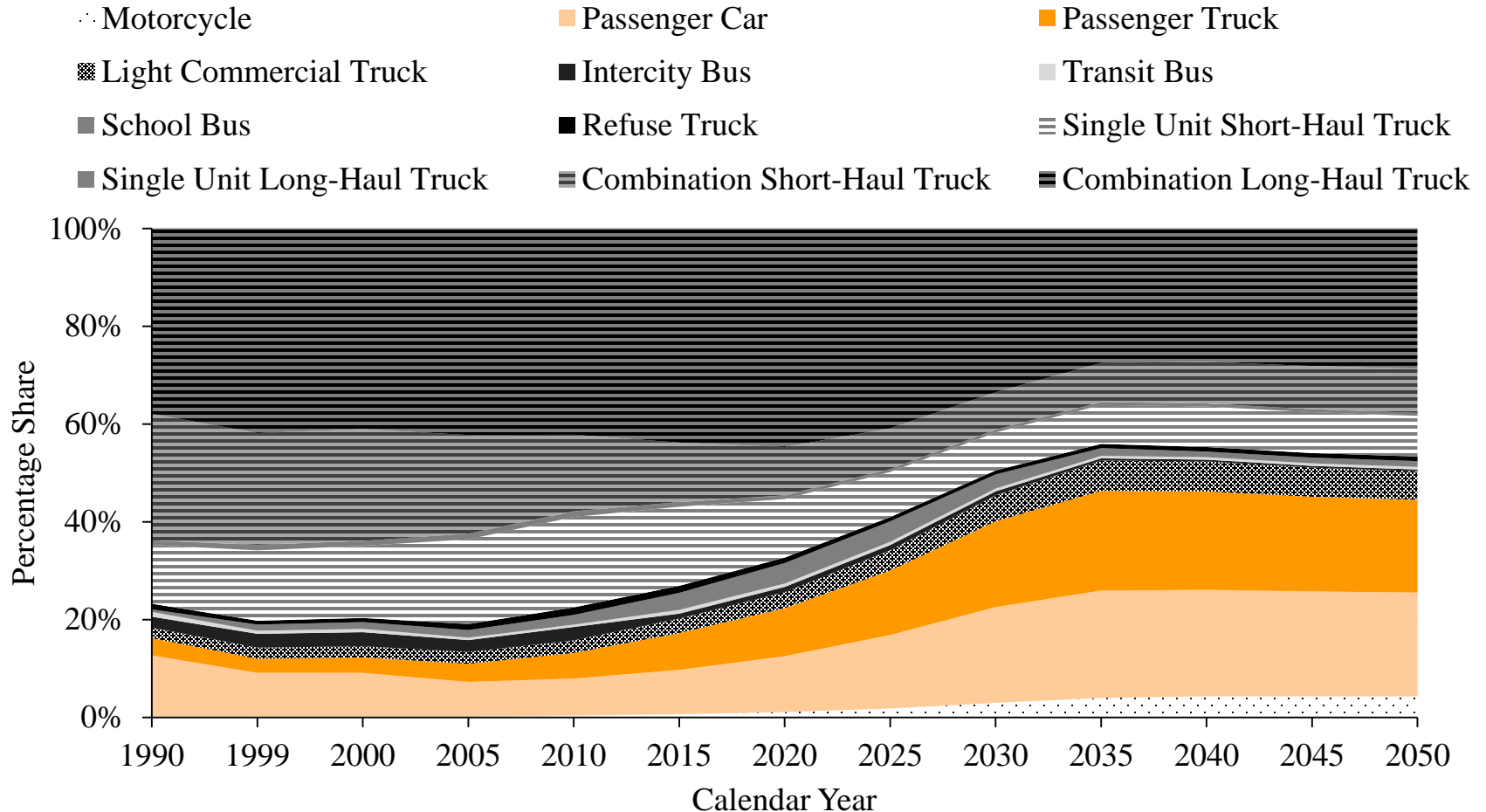
Source: EIA, 2018

# Estimated Trends in U.S. NO<sub>x</sub> Onroad Vehicle Emissions

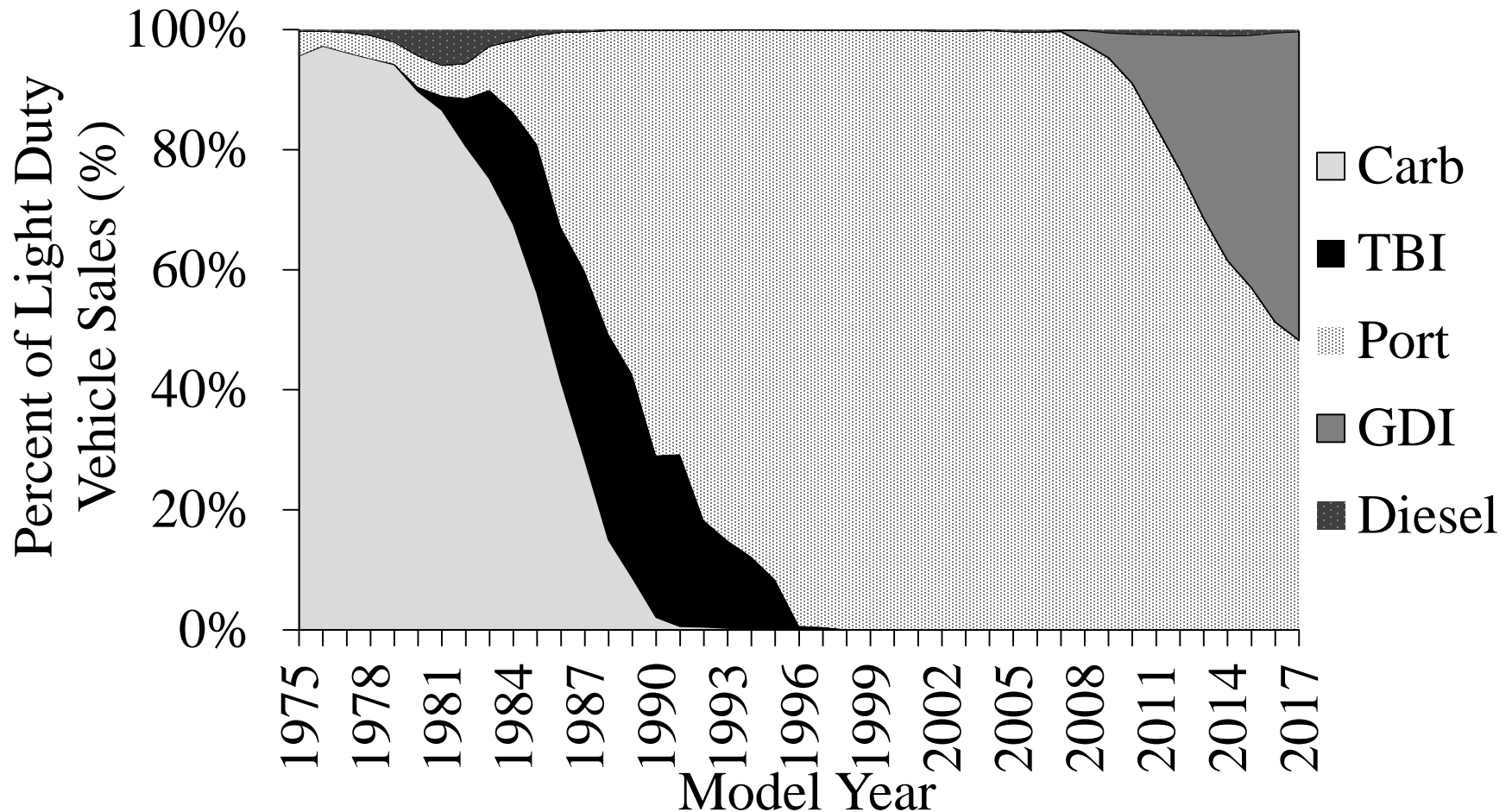


Based on National Emissions from MOVES for a July Weekday

# Estimated Trends in U.S. PM<sub>2.5</sub> Onroad Vehicle Emissions



# Trends in LDGV Fuel Delivery



Source: (EPA, 2018)

# Background: Gas Direct Injection

- Much focus has been on studying Particulate Matter (PM), especially ultrafine particles (UFP) from GDI engines
- Total Soot Particle Number emitted by GDI engines is generally higher than PFI engines by more than an order of magnitude, and than Diesel engines equipped with a Diesel Particulate Filter (DPF)
- Gasoline Particulate Filters (GPFs) are being considered for GDI engines



# Instruments



Portable Emissions Measurement System (PEMS):

Carbon Dioxide ( $\text{CO}_2$ ), Nitric Oxide (NO), CO, Hydrocarbons (HC), and  $\text{O}_2$

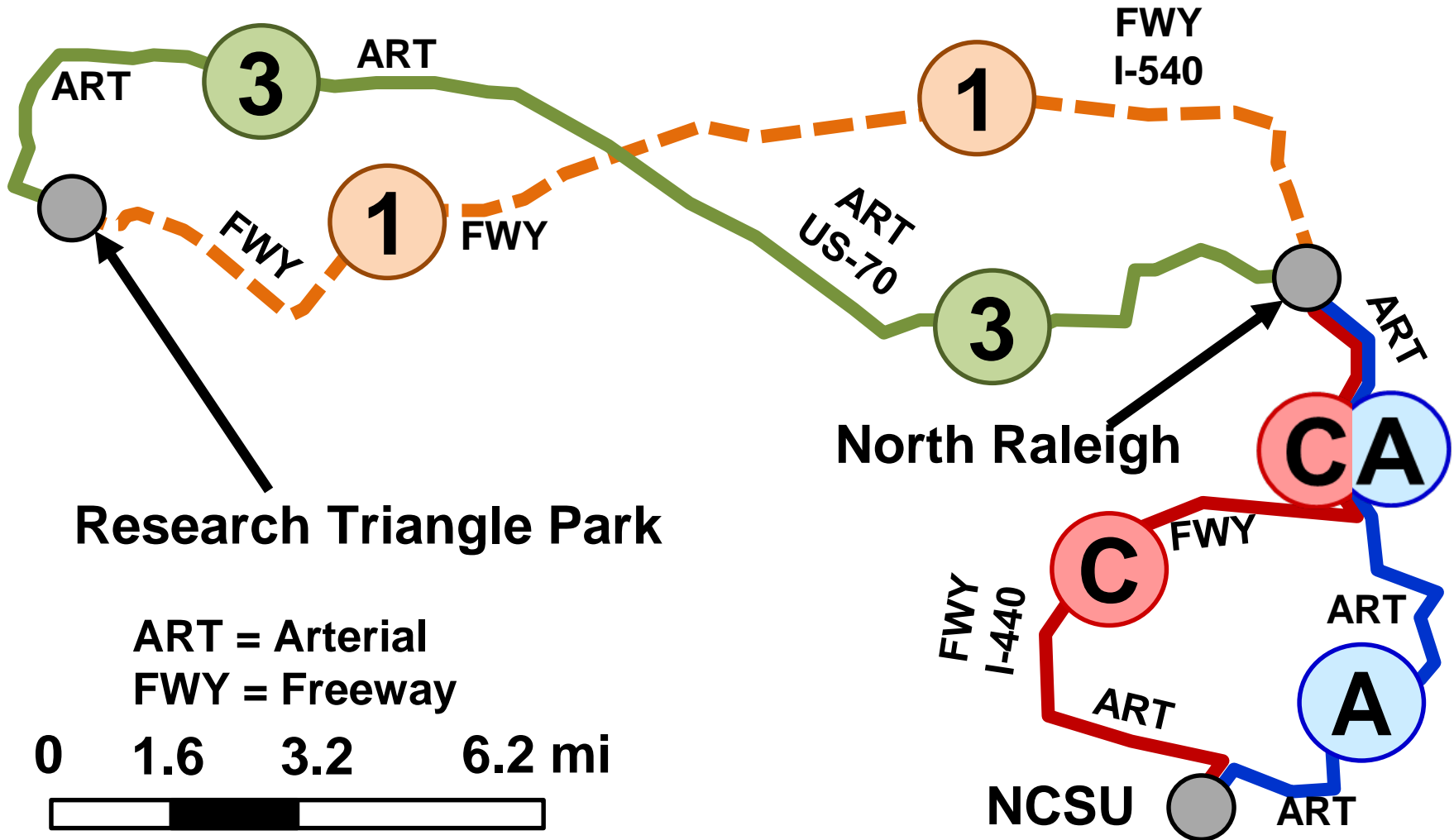


Global Positioning System (GPS) Receivers with Barometric Altimeter

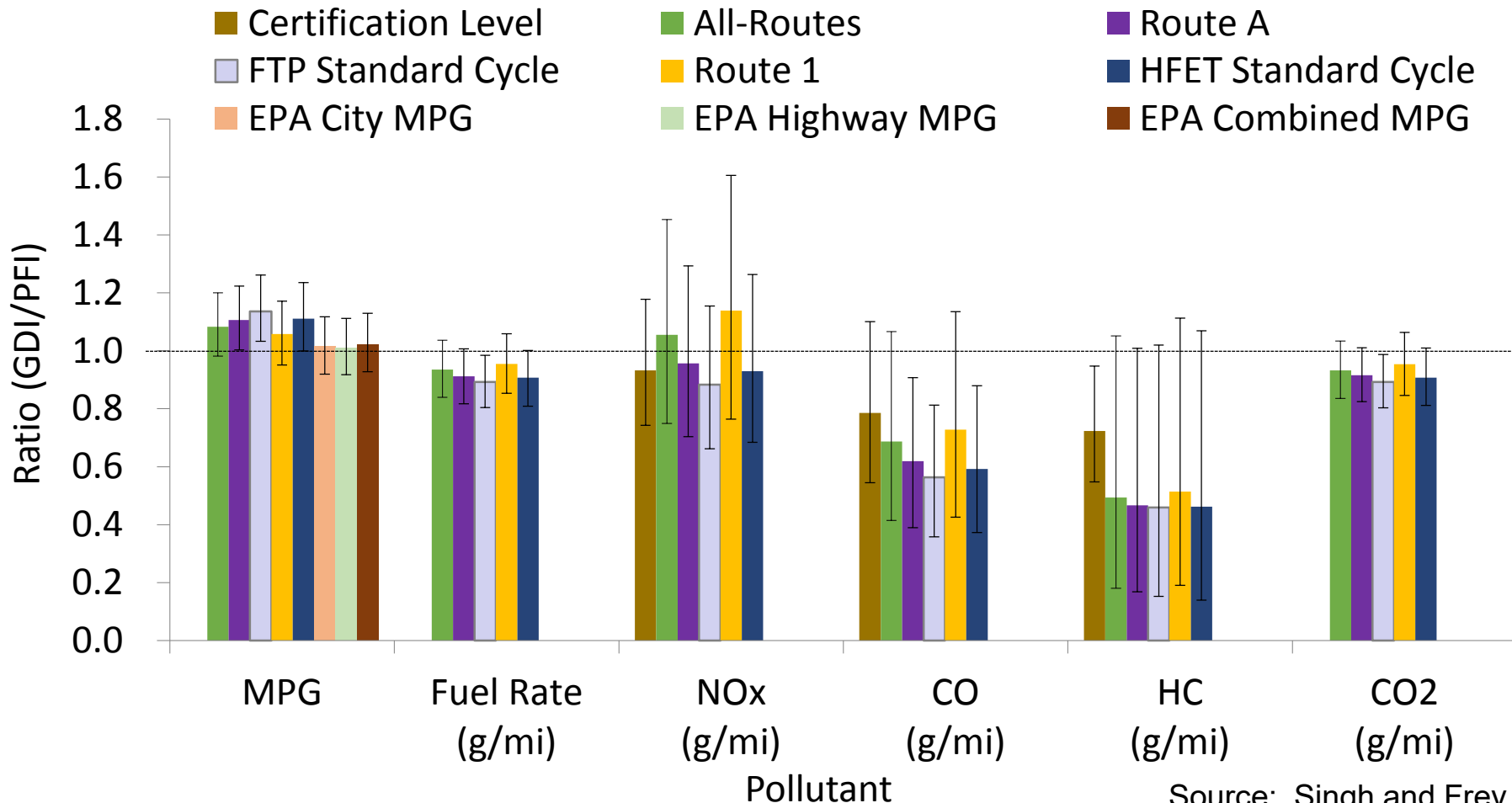
On-board Diagnostic Data Logger (OBD)



# Measurement Routes



# Results: Real-World Data vs Certification Data



Source: Singh and Frey

Note: Error bars are 95% confidence intervals based on average of 25 "Composite" GDI and "Composite PFI" vehicles, and are estimated using bootstrapping

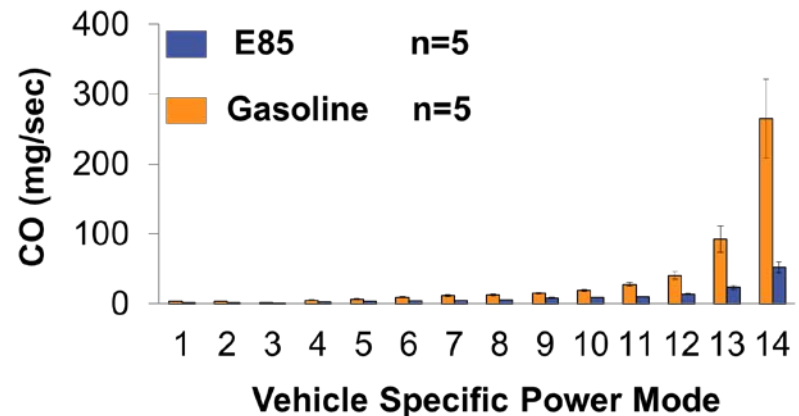
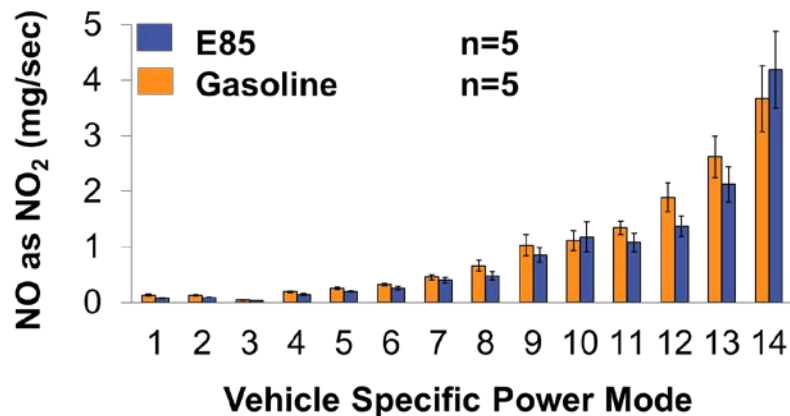
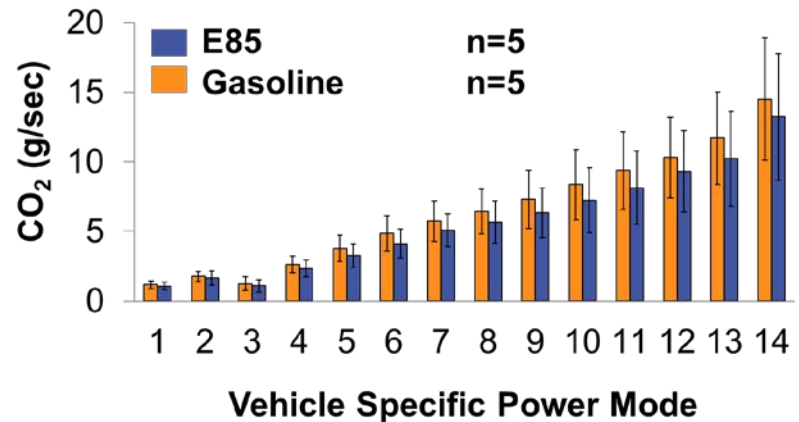
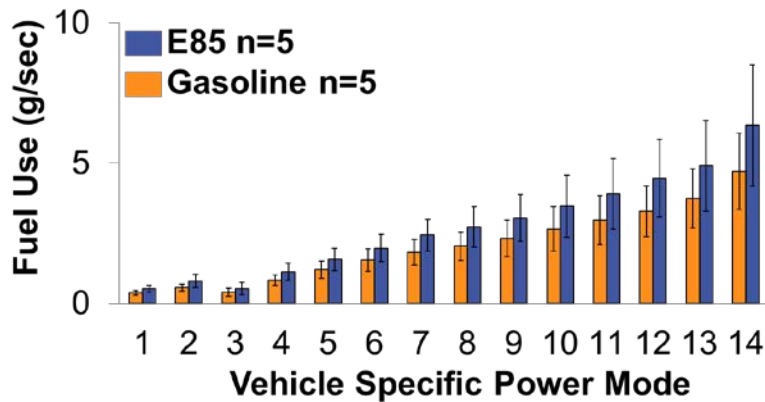
# Flex Fuel Vehicles Production Volume

Model Year	Category	Ford	GM	Jaguar Land Rover	Mercedes	Nissan	Toyota	FCA <sup>†</sup>	Volkswagen <sup>†</sup>	Total
2012	Car	174,597	396,264	-	13,493	-	-	105,174	2,060	691,588
	Truck	323,563	511,183	-	8,289	24,154	31,670	453,399	-	1,352,258
	All	498,160	907,447	-	21,782	24,154	31,670	558,573	2,060	2,043,846
2013	Car	209,988	374,354	321	34,493	-	-	142,158	30,346	791,660
	Truck	546,695	637,576	-	22,082	13,650	33,203	431,359	20,799	1,705,364
	All	756,683	1,011,930	321	56,575	13,650	33,203	573,517	51,145	2,497,024
2014	Car	259,189	282,707	2,754	48,597	-	-	76,570	39,375	709,192
	Truck	498,245	801,740	32,013	12,079	14,809	56,516	650,617	25,666	2,091,685
	All	757,434	1,084,447	34,767	60,676	14,809	56,516	727,187	65,041	2,800,877
2015	Car	140,169	170,959	2,640	12,026	-	-	183,860	28,994	538,648
	Truck	296,039	313,961	10,795	5,208	13,565	43,060	585,462	31,987	1,300,077
	All	436,208	484,920	13,435	17,234	13,565	43,060	769,322	60,981	1,838,725
2016	Car	137,556	125,079	-	24,782	-	-	115,995	21,237	424,649
	Truck	338,099	139,667	-	9,894	-	69,596	313,607	39,212	910,075
	All	475,655	264,746	-	34,676	-	69,596	429,602	60,449	1,334,724

# Definition of VSP Modes

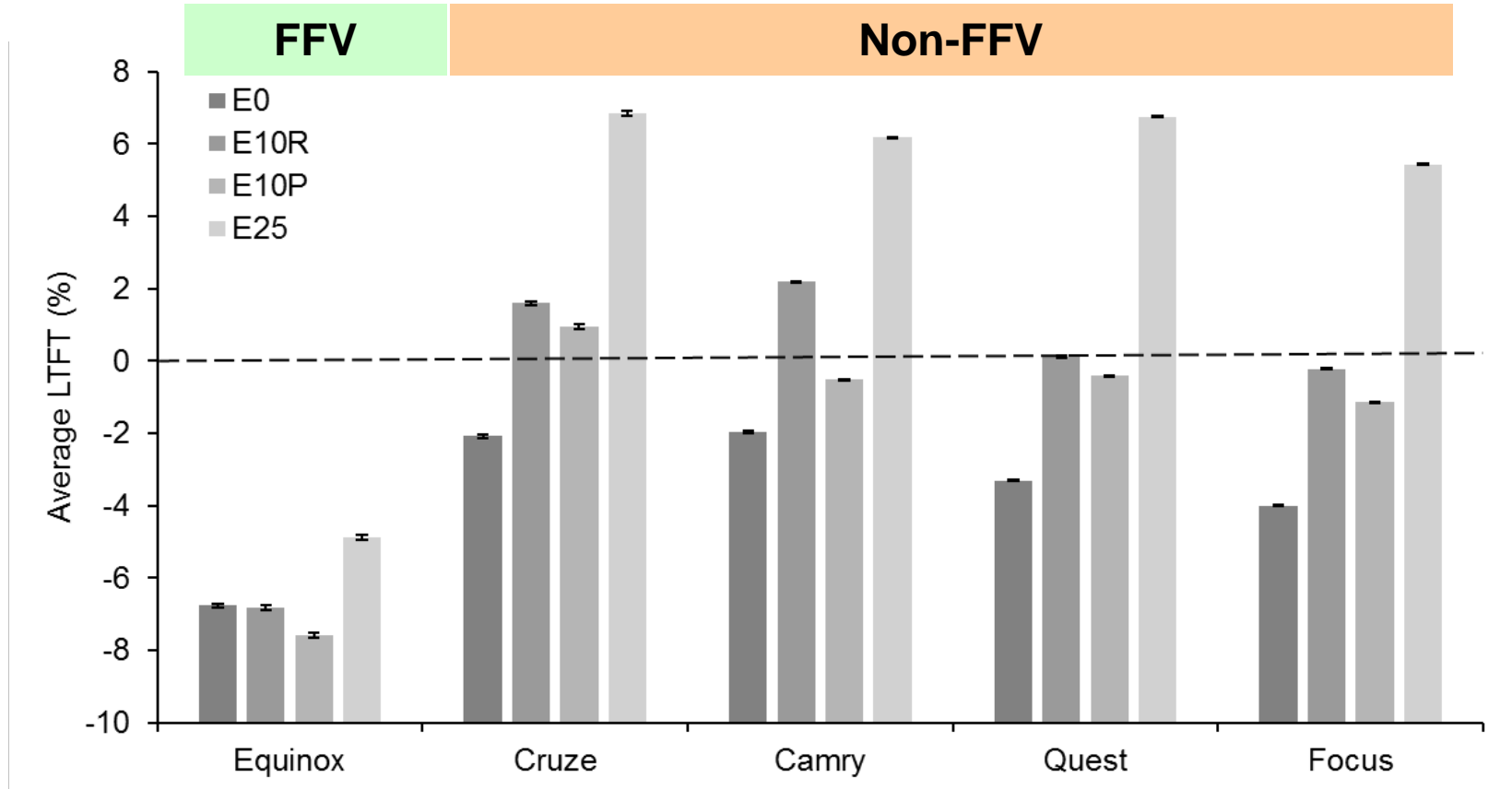
	VSP mode	Definition (kW/ton)
Deceleration or Downhill	1	$VSP < -2$
	2	$-2 \leq VSP < 0$
Idle	3	$0 \leq VSP < 1$
Cruising, Acceleration, or Uphill	4	$1 \leq VSP < 4$
	5	$4 \leq VSP < 7$
	6	$7 \leq VSP < 10$
	7	$10 \leq VSP < 13$
	8	$13 \leq VSP < 16$
	9	$16 \leq VSP < 19$
	10	$19 \leq VSP < 23$
	11	$23 \leq VSP < 28$
	12	$28 \leq VSP < 33$
	13	$33 \leq VSP < 39$
	14	VSP Over 39

# Comparison of FFVs on E85 vs. E10 Based on PEMS Measurements



Source: Delavarrafiee and Frey, 2018, JAWMA

# Beyond E10: Conventional Vehicles Adapt to Ethanol Blends



Long-Term Fuel Trim (which affects fuel/air ratio) adapts to blends from E0 to E25

Ignition timing advance varies with engine load and fuel

# Sales of Alternative Technology Vehicles

Year	Hybrid Electric Vehicles (HEV)	Plug-In Hybrid Electric Vehicles (PHEV)	Battery Electric Vehicles (BEV)	Fuel Cell Electric Vehicle (FCEV)	Sum
2011	250,954	6,966	9,074	19	267,013
2012	387,188	37,558	12,795	30	437,571
2013	536,383	41,376	46,832	19	624,610
2014	441,988	56,548	60,368	49	558,593
2015	365,732	49,118	64,175	75	479,100
2016	336,125	73,146	72,424	1,030	482,725
2017	365,320	91,724	96,261	1,862	555,167
Total	2,689,900	356,058	362,058	3,084	3,411,706
Subtotal: Non-CA	2,002,958	186,303	179,253	9	2,368,523
Market Share	2.64%	0.39%	0.43%	0.00%	3.47%

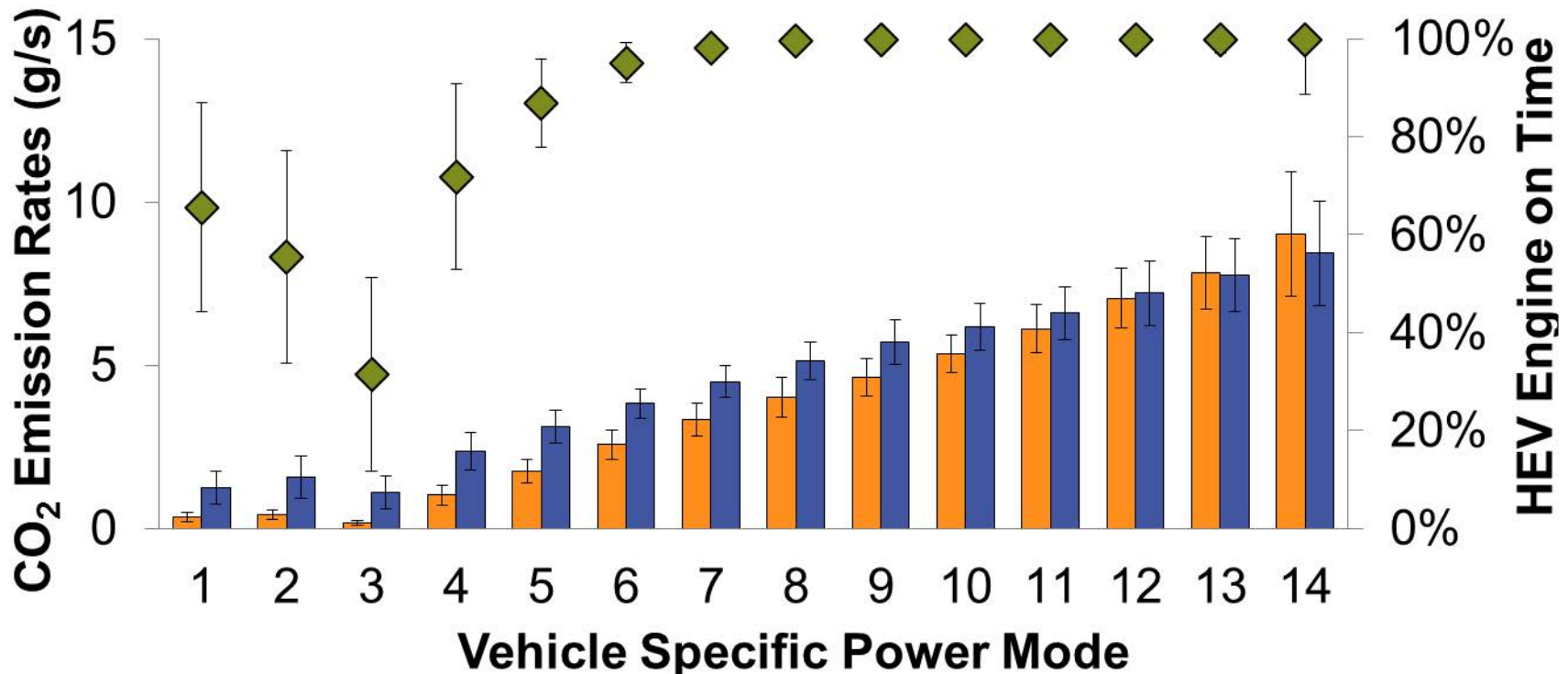
**Source: [autoalliance.org](http://autoalliance.org)**



# Results: HEV vs. Conventional Vehicle: Average VSP Modal CO<sub>2</sub> Emission Rates

For Modes 1 to 9, HEV CO<sub>2</sub> emission is significantly lower than CV.

■ Average of Composite HEVs, n=11     ◆ Fraction of HEV Engine On Time, n=11  
■ Average of Composite CVs, n=11



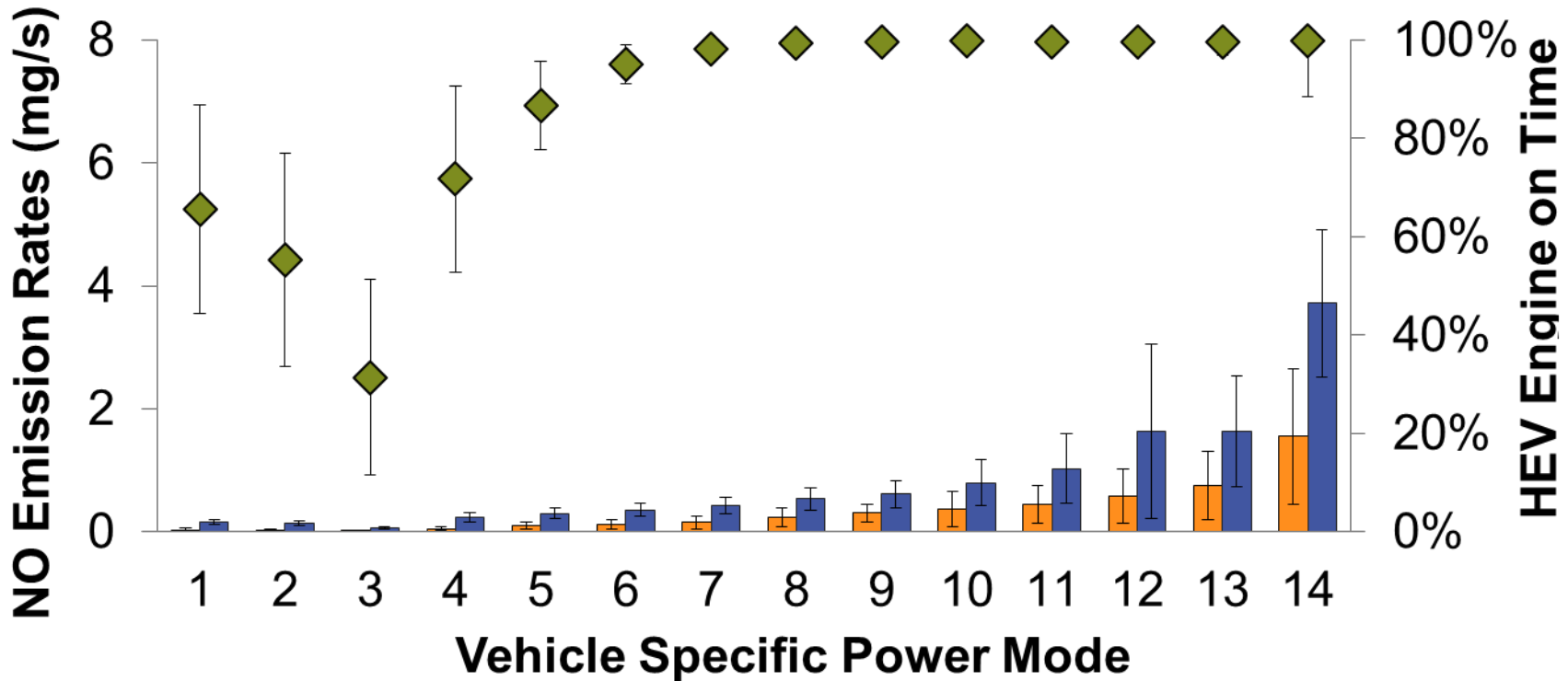
\*NOTE: Error bars are 95% confidence intervals on mean.

\*For the HEVs, modal average VSP fuel use and emission rates are weighted based on the fraction of the time that engine was on.

# Results: HEV vs. Conventional Vehicle: Average VSP Modal NO<sub>x</sub> Emission Rates

For Modes 1 to 9, HEV NO emission rates are significantly lower than CV.

■ Average of Composite HEVs, n=11     ◆ Fraction of HEV Engine On Time, n=11  
■ Average of Composite CVs, n=11



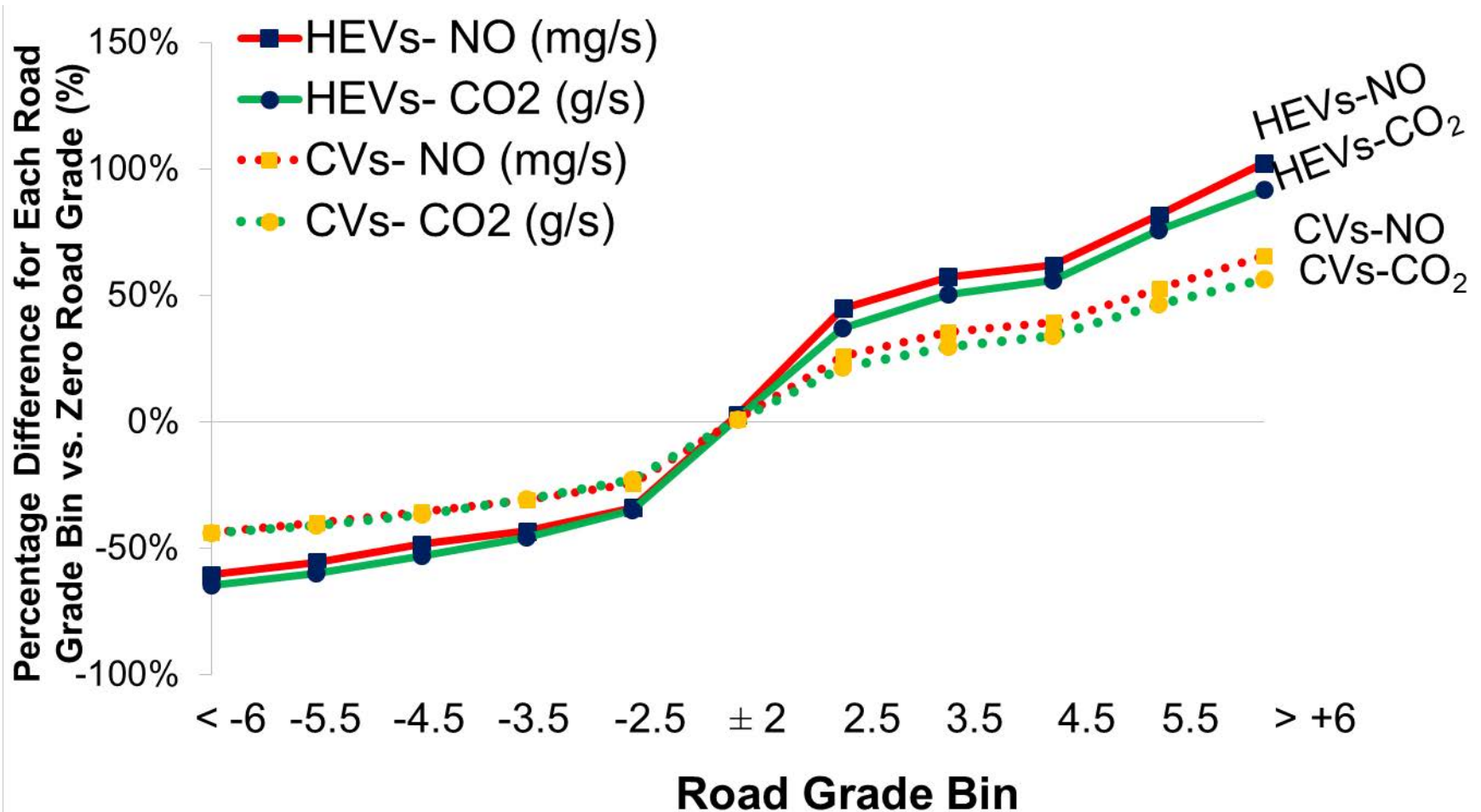
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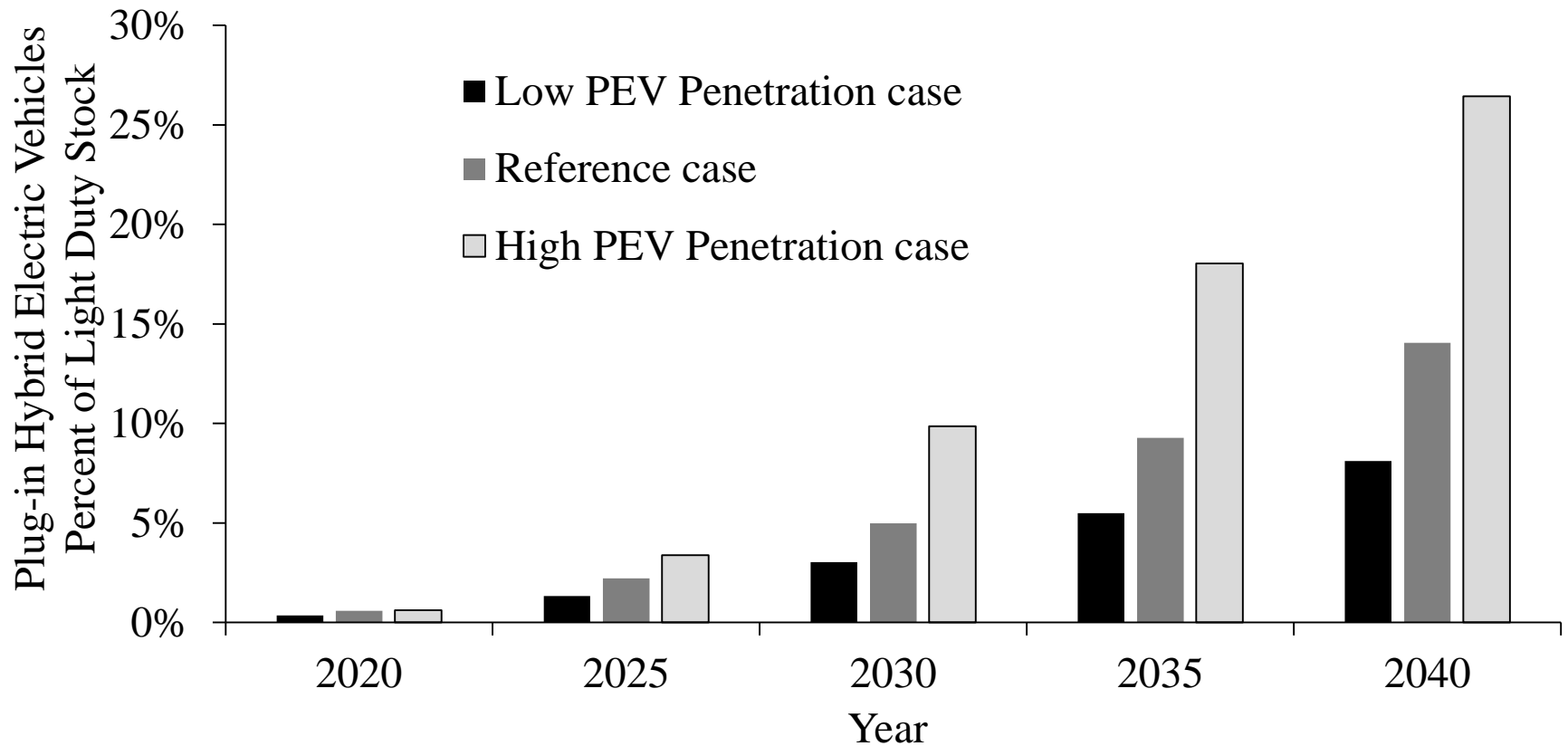
# Cycle Average Gaseous Emission Rates for HEVs vs. Conventional Vehicles

Pollutant	Description	Unit	Observed Driving Cycles in Raleigh, NC	
			Route A	Route 1
CO <sub>2</sub>	Percentage Difference (n=11) (Average HEVs vs. Average CVs )	%	-44	-27
	p Value for two paired t-test	-	0.00	0.00
NO <sub>x</sub>	Percentage Difference (n=11) (Average HEVs vs. Average CVs )	%	-72	-64
	p Value for two paired t-test	-	0.00	0.01
CO	Percentage Difference (n=9) (Average HEVs vs. Average CVs )	%	-21	-31
	p Value for two paired t-test	-	0.54	0.29
HC	Percentage Difference (n=11) (Average HEVs vs. Average CVs )	%	-47	-43
	p Value for two paired t-test	-	0.04	0.07

# Percentage Difference in CO<sub>2</sub> and NO Emission Rates of Each Road Grade Bin Vs. Zero Road Grade



# Projected Trend in Global PHEV Vehicle Stock

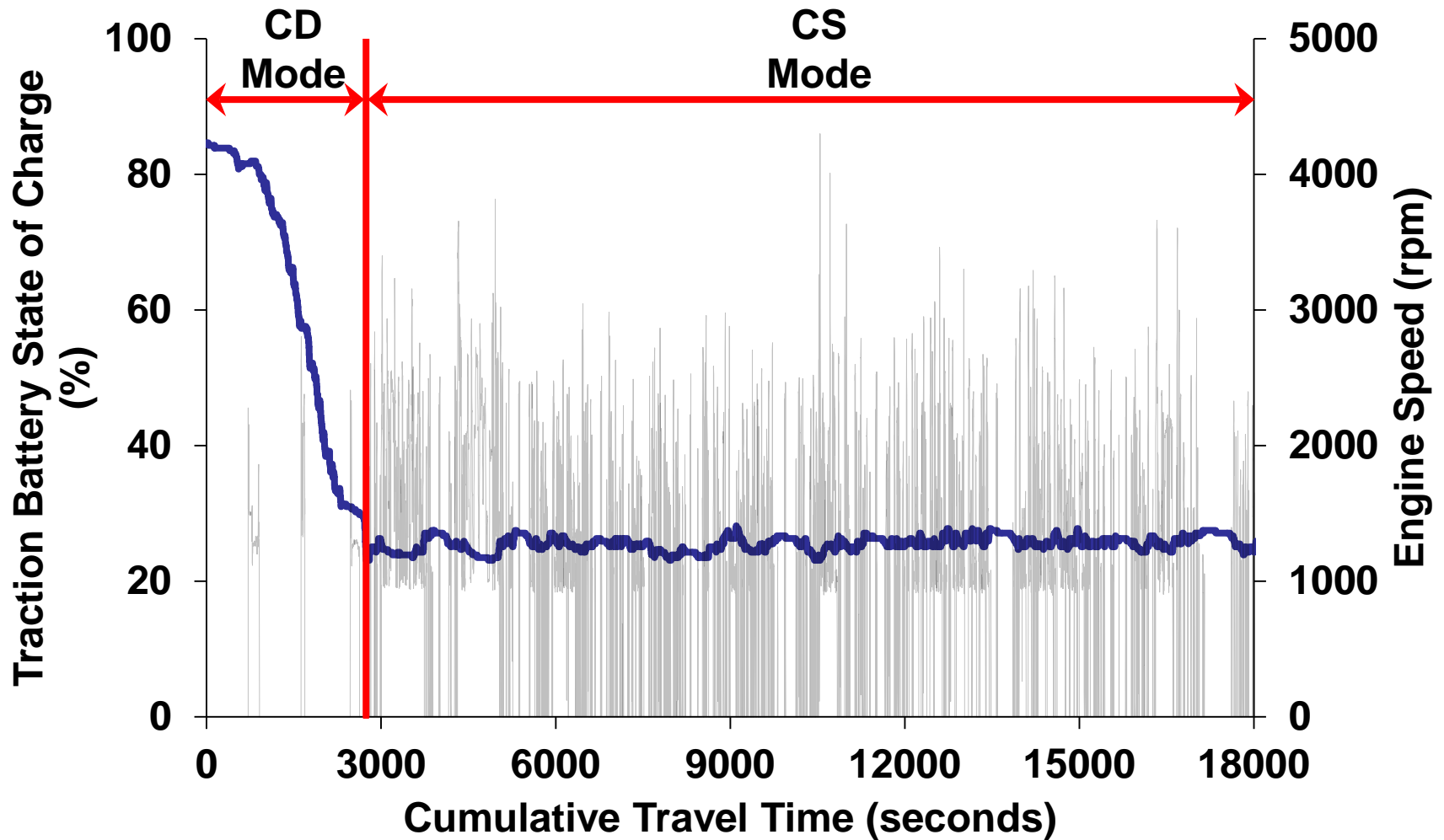


Projected Trend from 2020 to 2040 in Worldwide Plug-in Electric Vehicles as Percent of Light-Duty Vehicle Stock. Source: (Lynes, 2017)

# Field Measurements of a 2013 Toyota Prius Plug-In

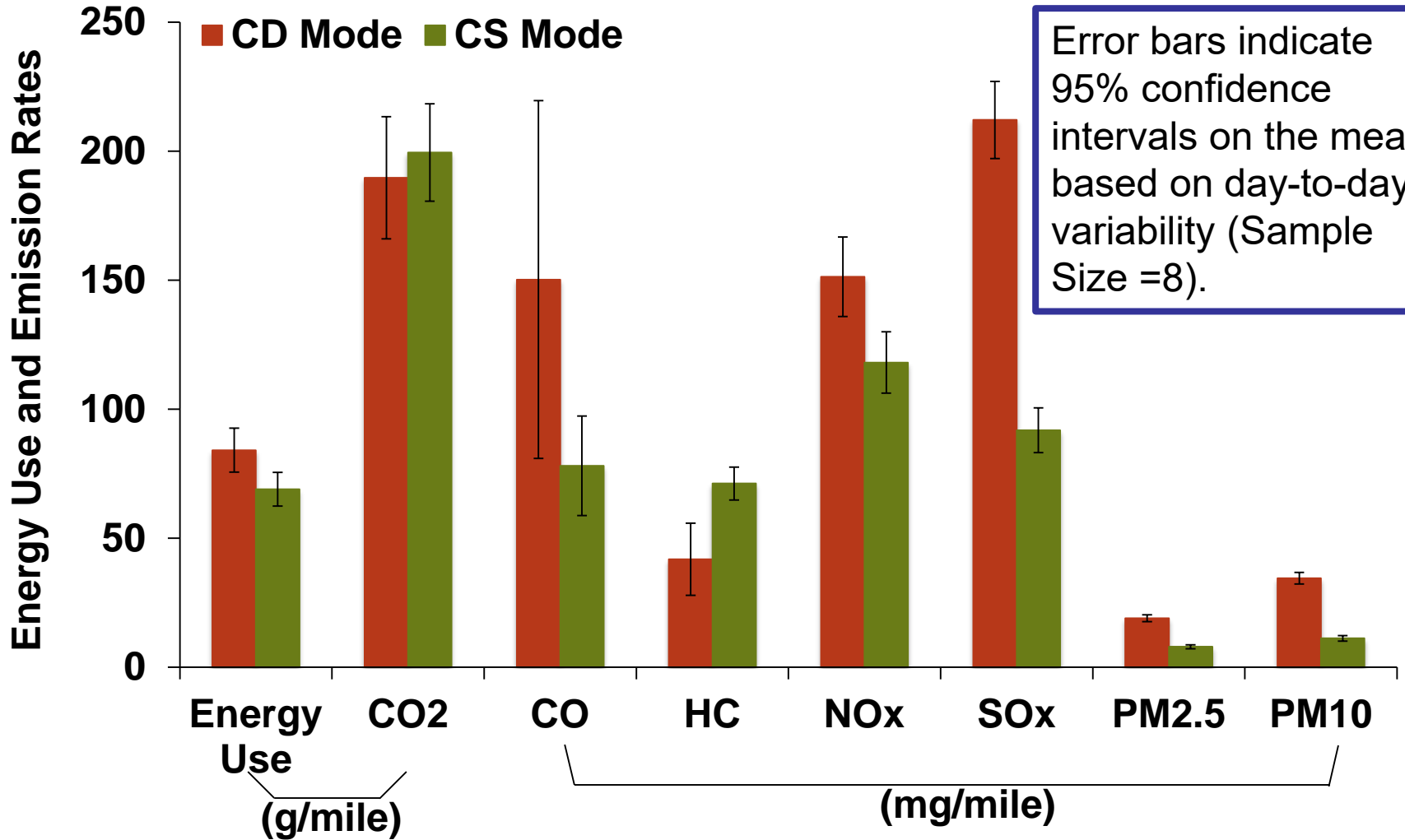


# Results: CD Mode versus CS Mode



Source: Zheng and Frey (in preparation)

# Results: CD Mode versus CS Mode

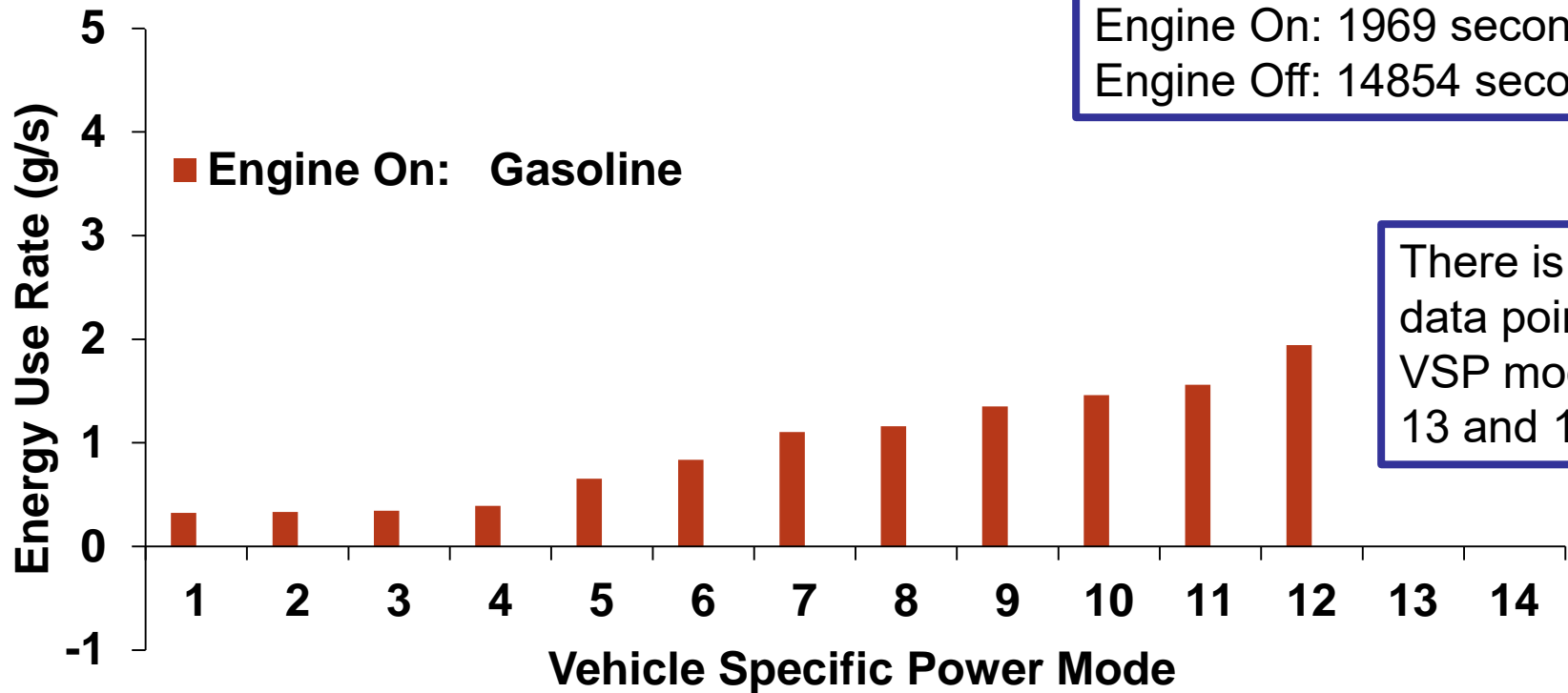


Energy use is gasoline equivalent fuel use.



# Results: CD Mode Energy Use

## Engine On versus Engine Off



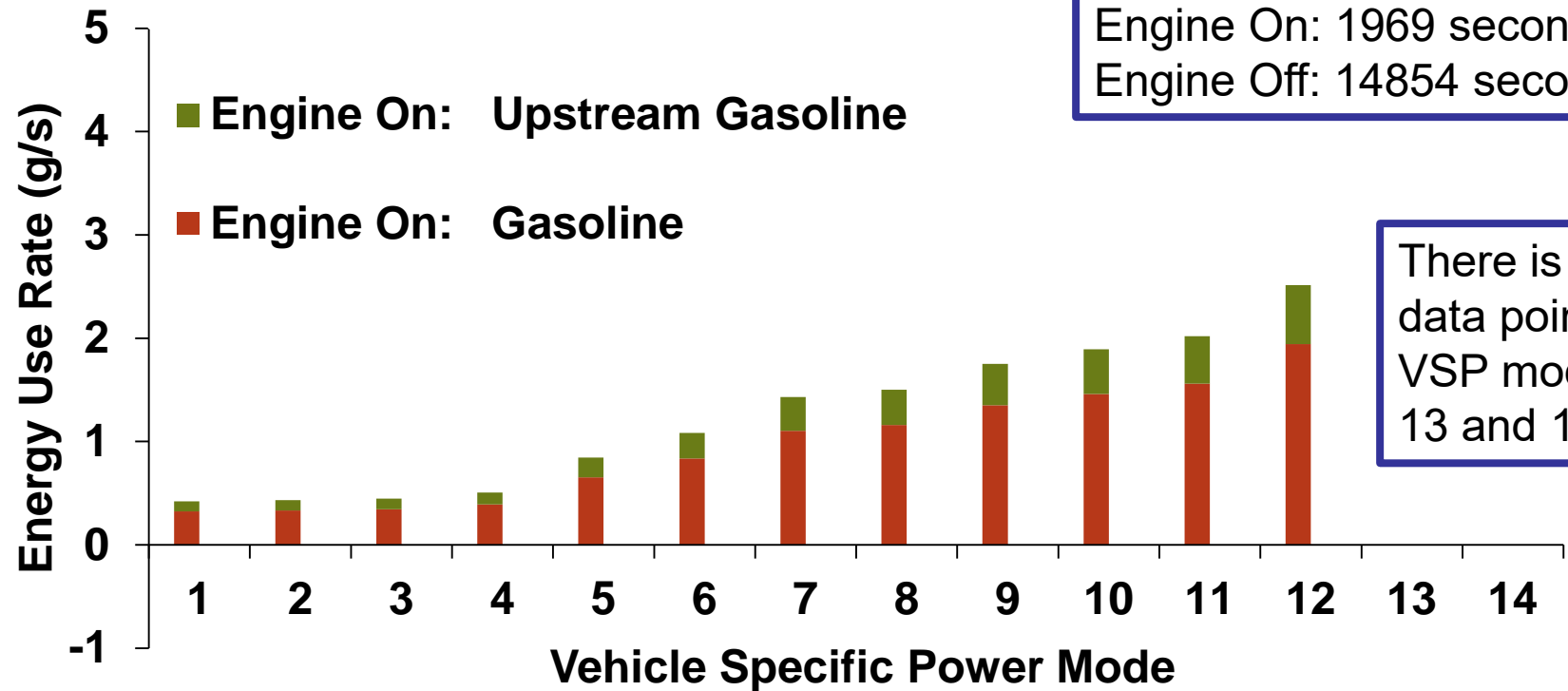
Sample Size  
 Engine On: 1969 seconds  
 Engine Off: 14854 seconds

There is no data point in VSP modes 13 and 14.

Error bar indicate 95% confidence intervals on the mean based on second-by-second variability in total energy use rates.

# Results: CD Mode Energy Use

## Engine On versus Engine Off



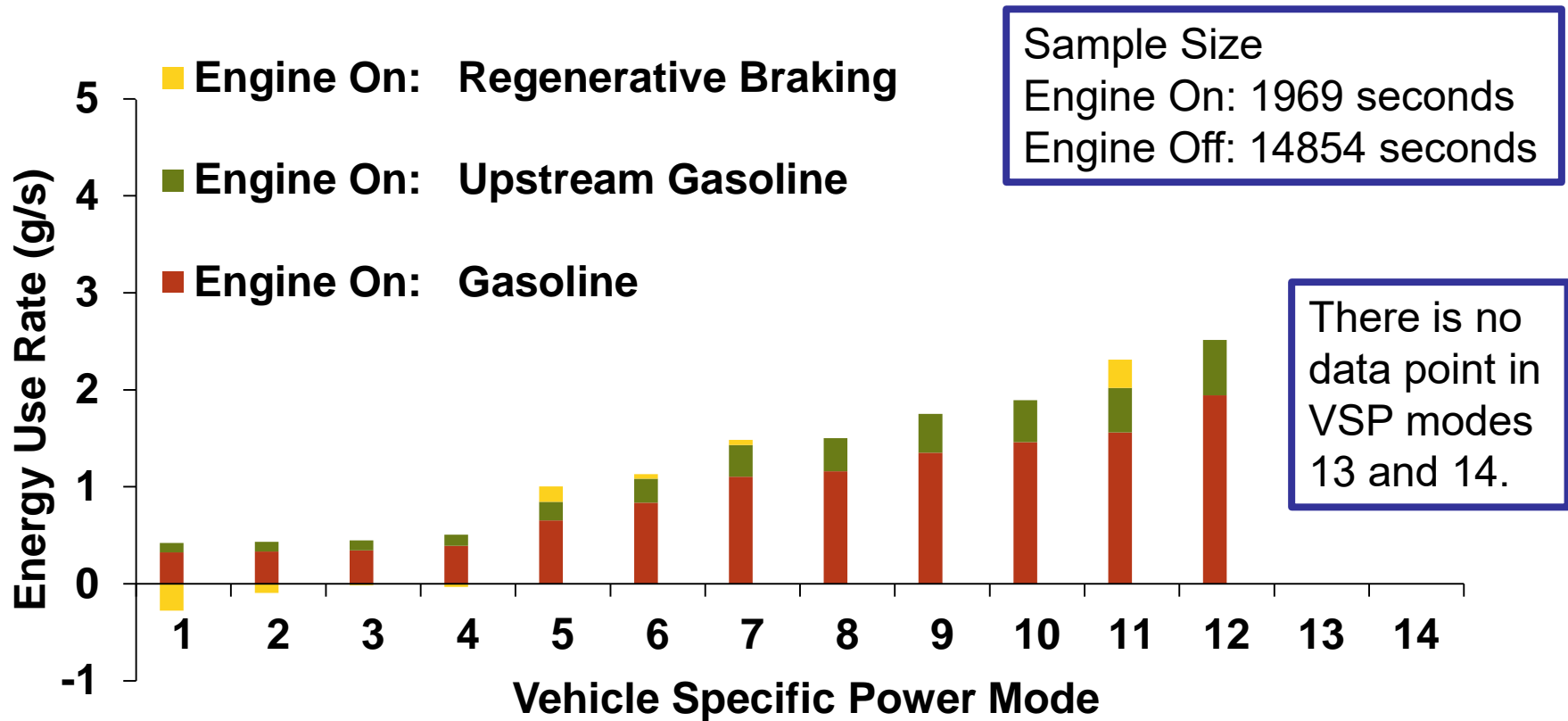
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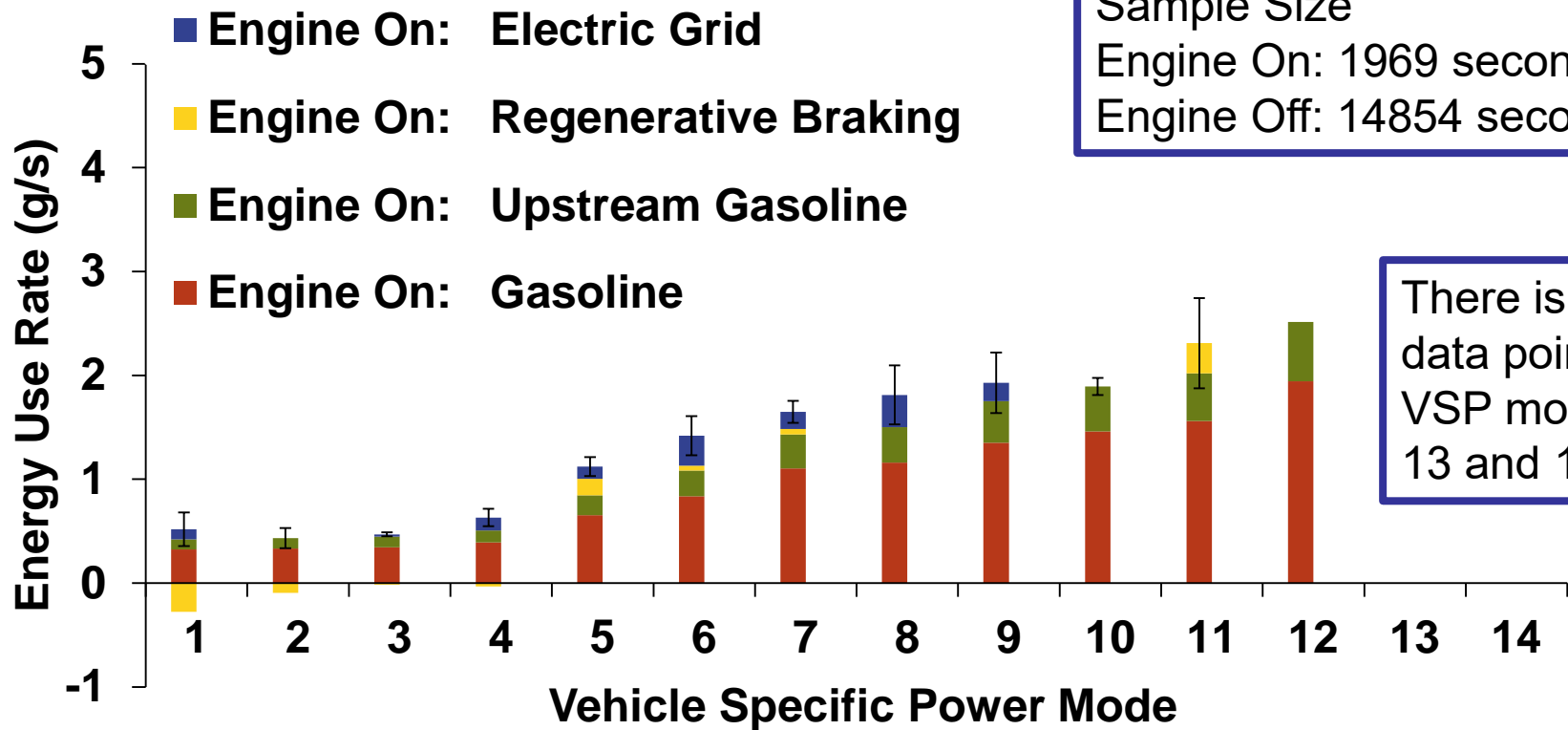
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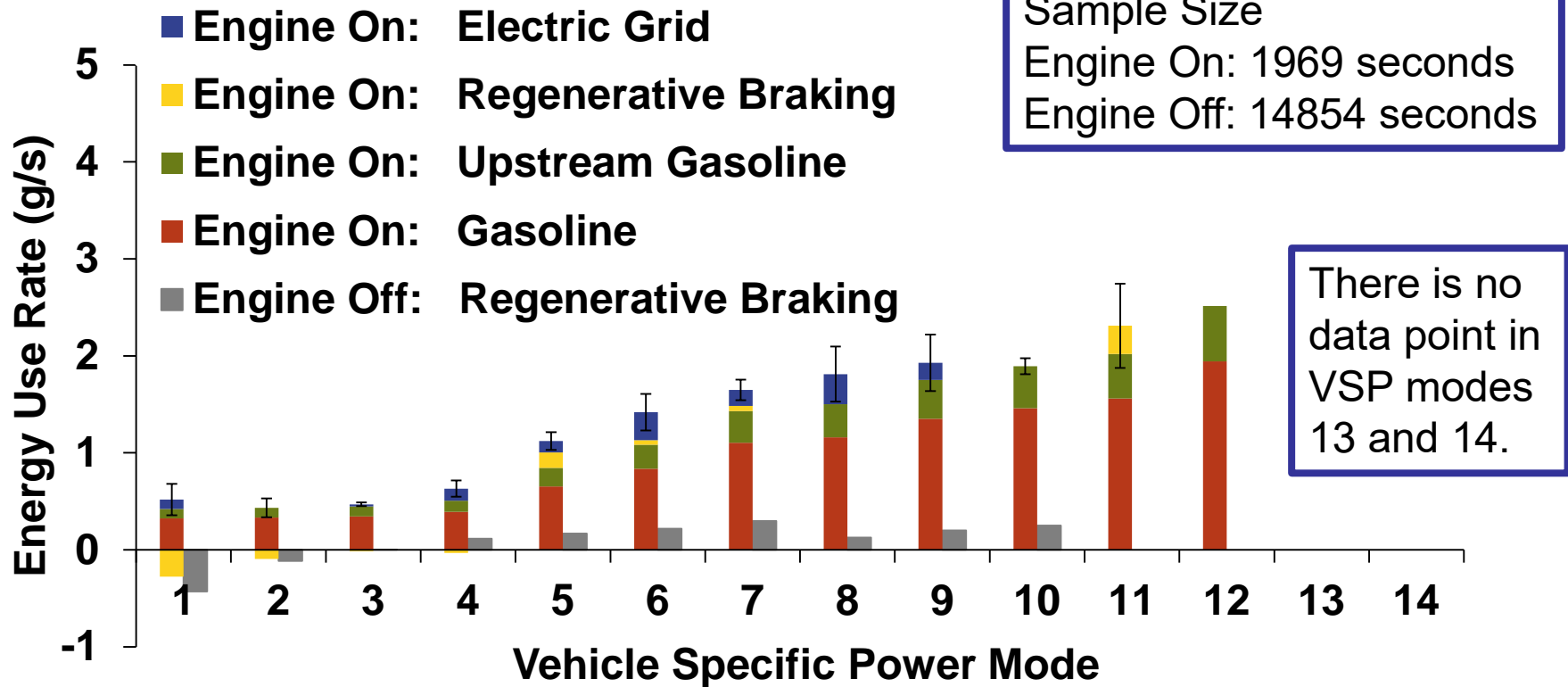
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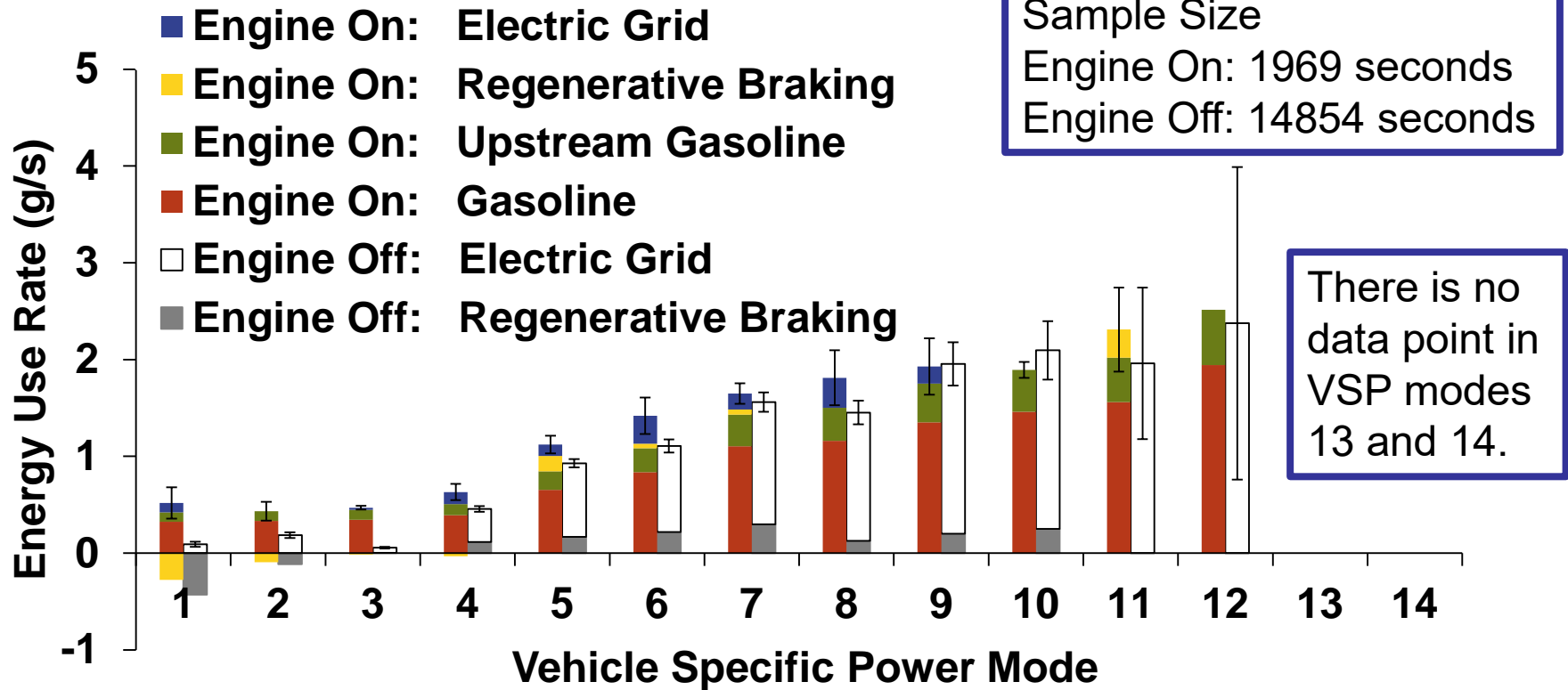
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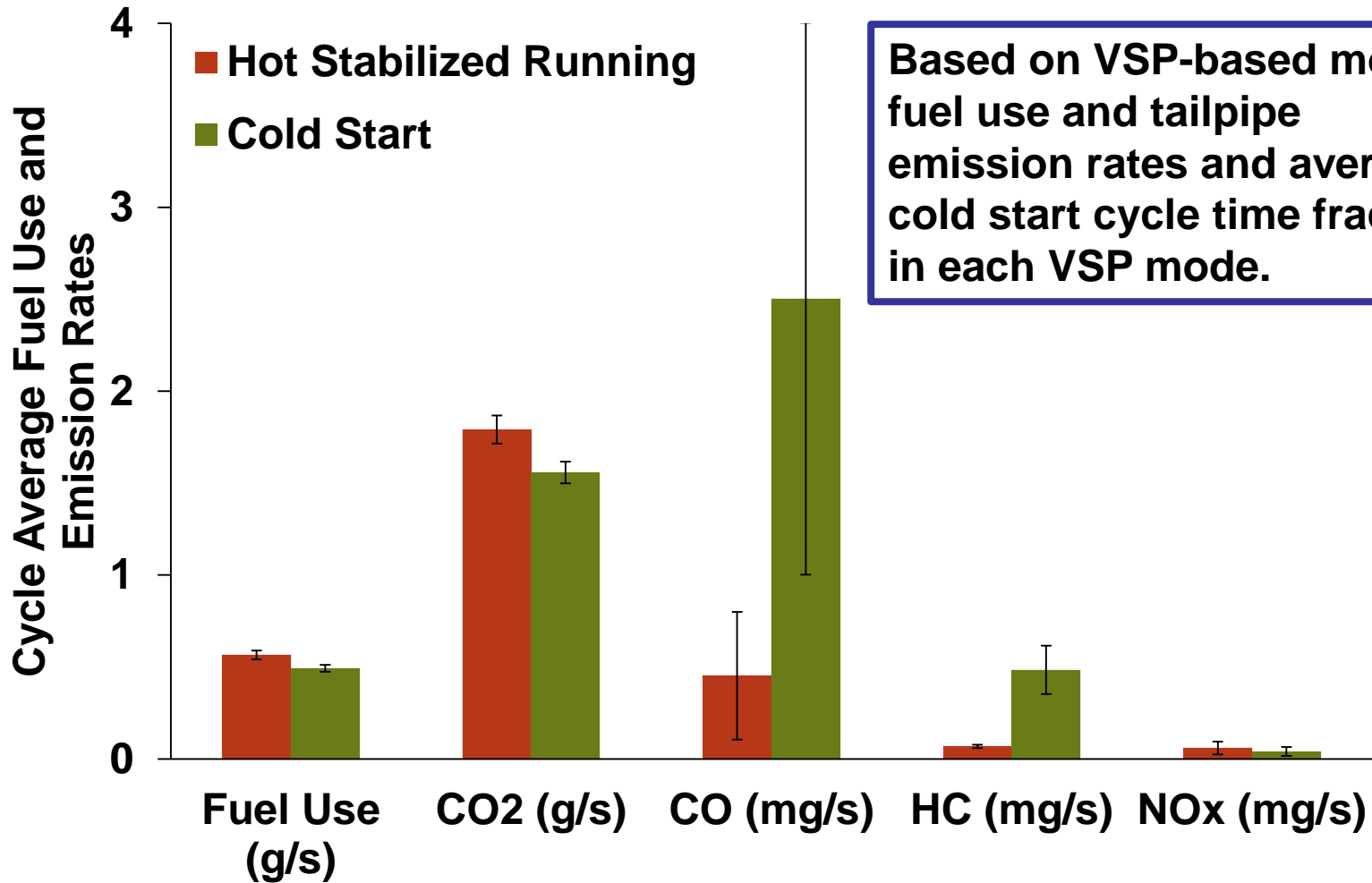
# Results: CD Mode Energy Use

## Engine On versus Engine Off



Error bar indicate 95% confidence intervals on the mean based on second-by-second variability in total energy use rates.

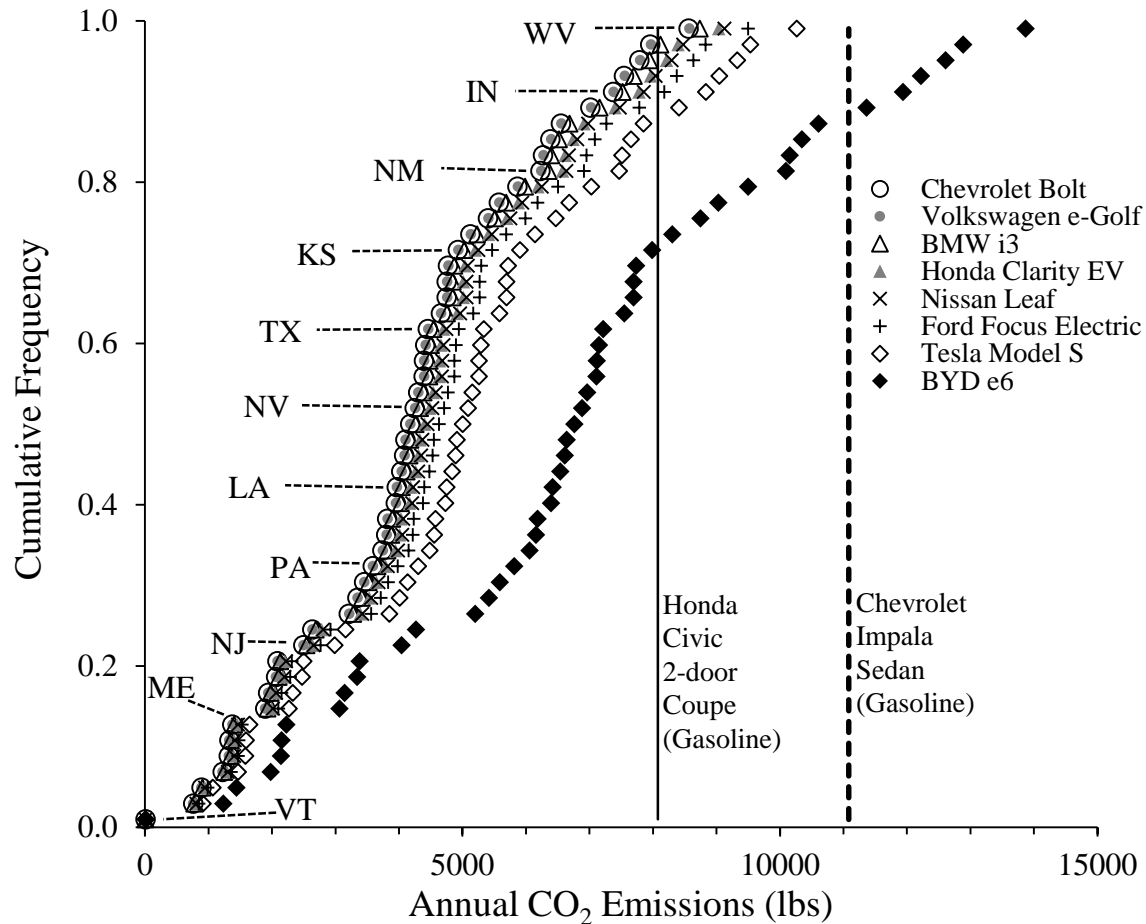
# Results: Cold Start versus Hot Stabilized Running



Based on VSP-based modal fuel use and tailpipe emission rates and average cold start cycle time fraction in each VSP mode.

Error bar indicate 95% confidence intervals on the mean.

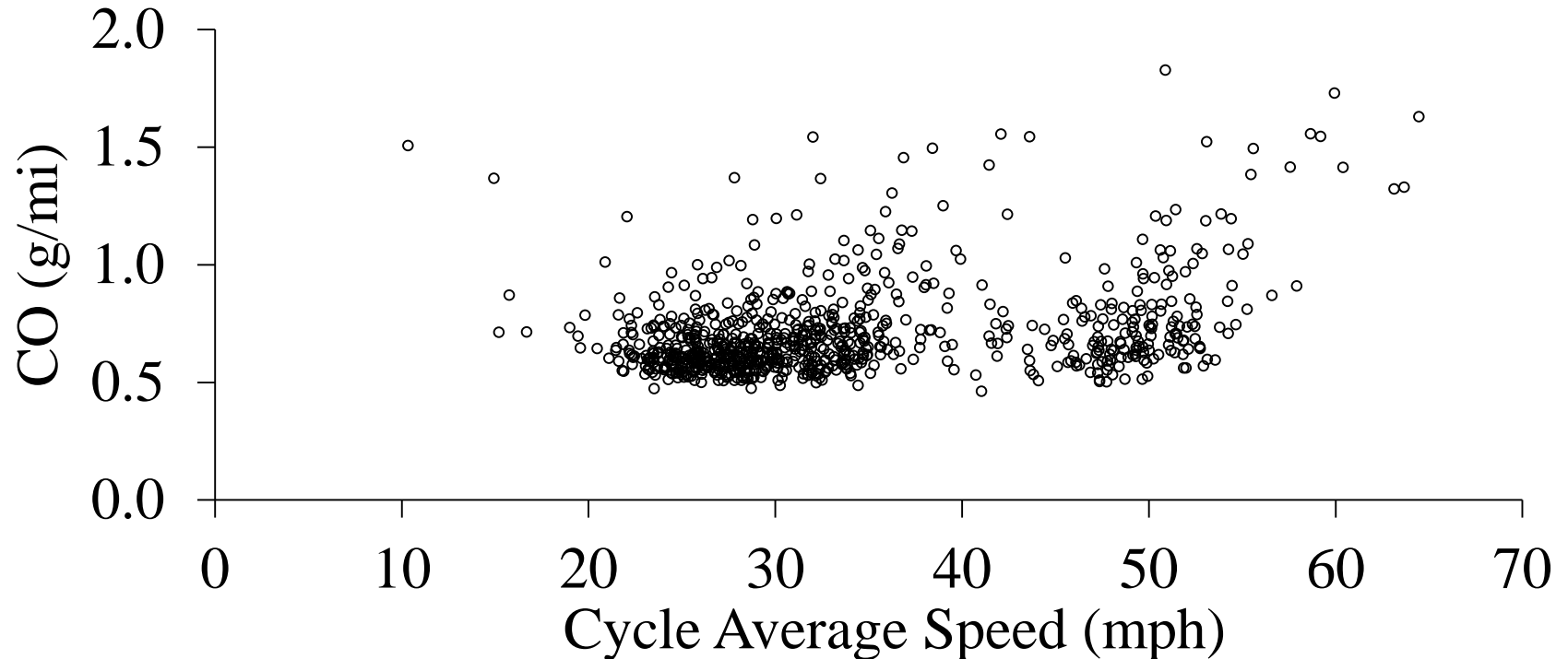
# Comparison of Annual Inter-State Variability in Indirect Power Generation Variability in Indirect Power Generation



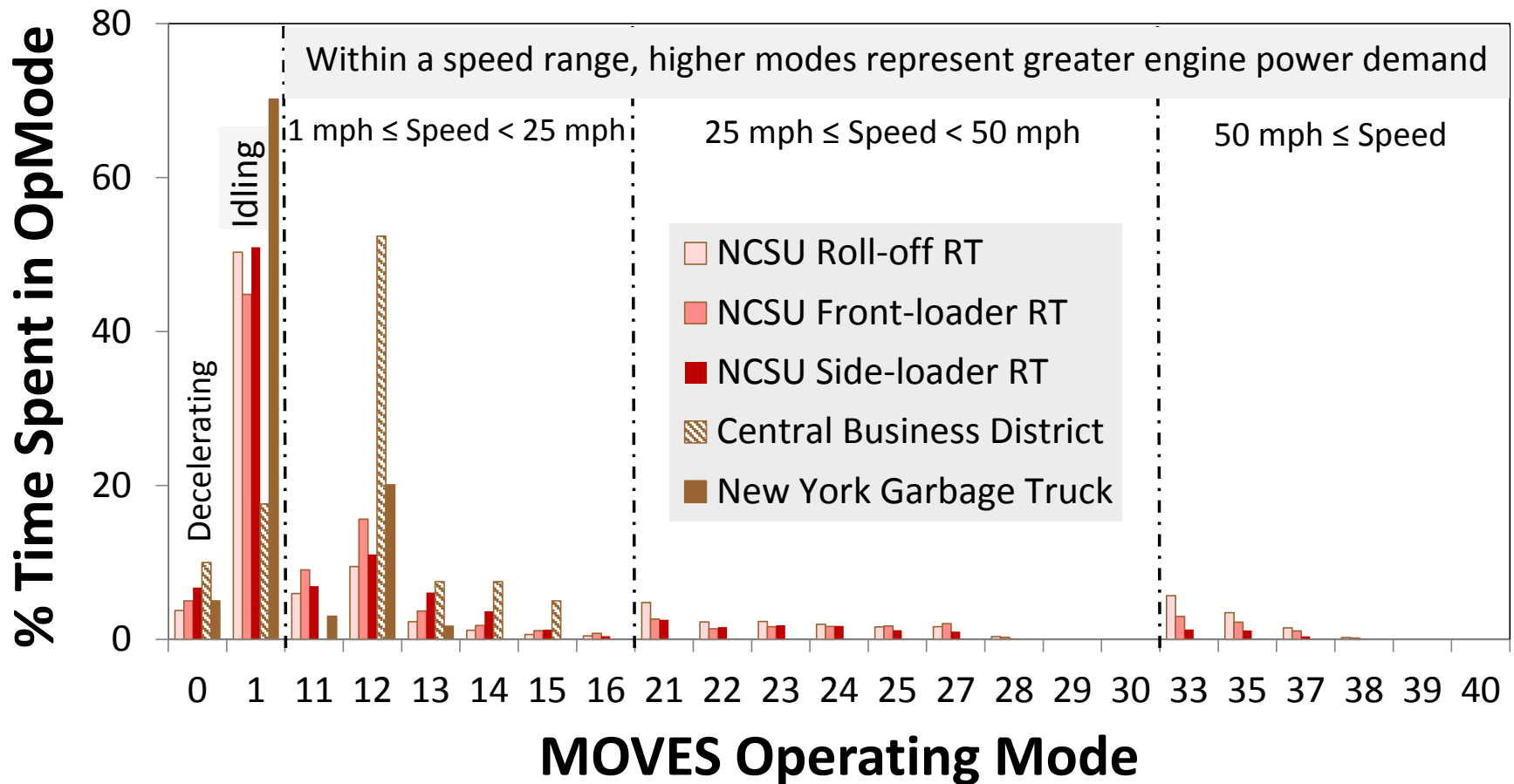
Comparison of Annual Inter-State Variability in Indirect Power Generation CO<sub>2</sub> Stack Emissions for Electricity Consumed by Selected Electric Vehicles and Tailpipe Exhaust CO<sub>2</sub> Emissions from Selected Gasoline Vehicles. Based on 2017 Model Year Vehicles. Source: Alternative Fuel Data Center, U.S. Department of Energy



## Move Beyond Default Cycles: CO Emission Rates Based on 800+ Real-World Cycles



# Comparison of Duty Cycles: NCSU vs Literature



Source: Sandhu, Frey, Bartelt-Hunt, and Jones 2014, AWMA Annual Meeting

# Effect of Driving Cycle

Duty Cycle	Fuel g/s	CO <sub>2</sub> g/s	CO mg/s	HC mg/s	NO <sub>x</sub> mg/s	PM mg/s
RO-Avg	3.1	10	21	5.8	56	0.8
MOVES2014	5.5	17	26	8.8	90	1.3
%Diff	76	77	23	53	60	60

Duty Cycle	Fuel g/s	CO <sub>2</sub> g/s	CO mg/s	HC mg/s	NO <sub>x</sub> mg/s	PM mg/s
SL-Avg	3.0	10	30	4.2	58	0.8
MOVES2014	5.3	17	34	7.0	86	1.1
%Diff	74	75	15	65	48	35

Source: Sandhu, Frey, Bartelt-Hunt, and Jones 2014, AWMA Annual Meeting

# Field Study

- Portable Emission Measurement System
- NCDOT in-use dump trucks
  - Single rear axle – “Single”
  - Double rear axle – “Tandem”
  - Tier 1 and Tier 2 engines
- Drivers – NCDOT
- Duty cycles – real world activity

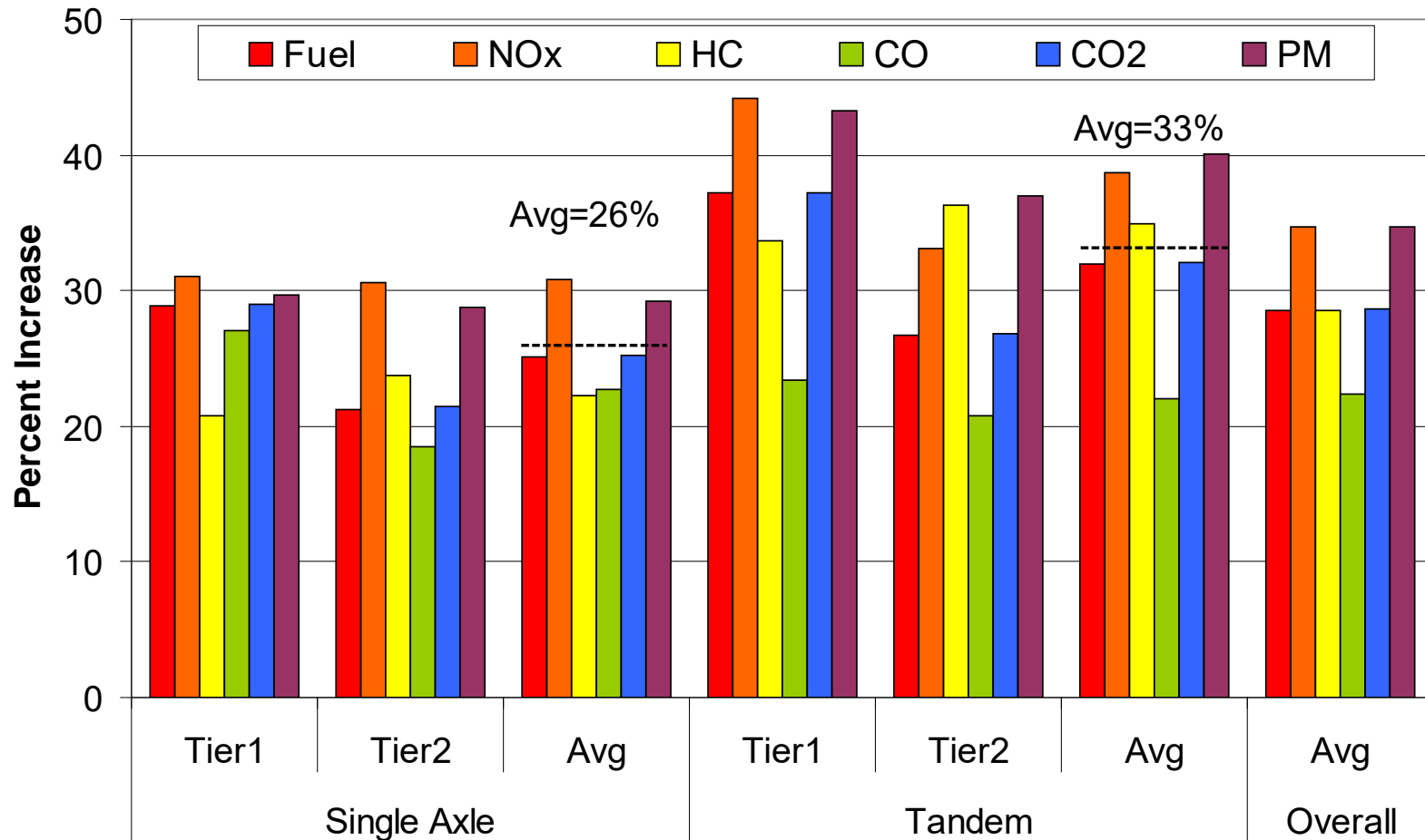
“Single”



“Tandem”

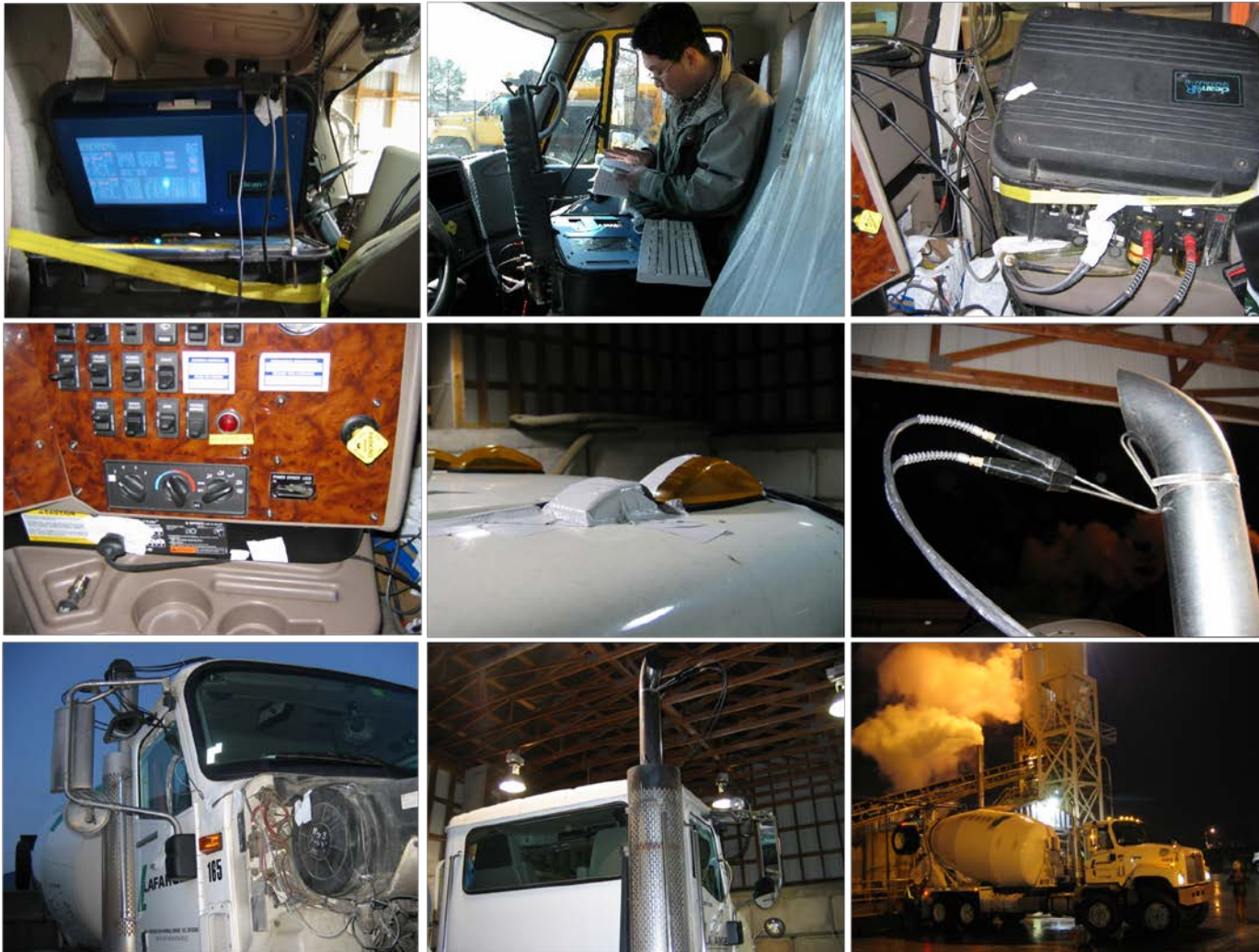


# Overall Comparison of Loaded Versus Unloaded Fuel Use and Emissions: Petroleum Diesel

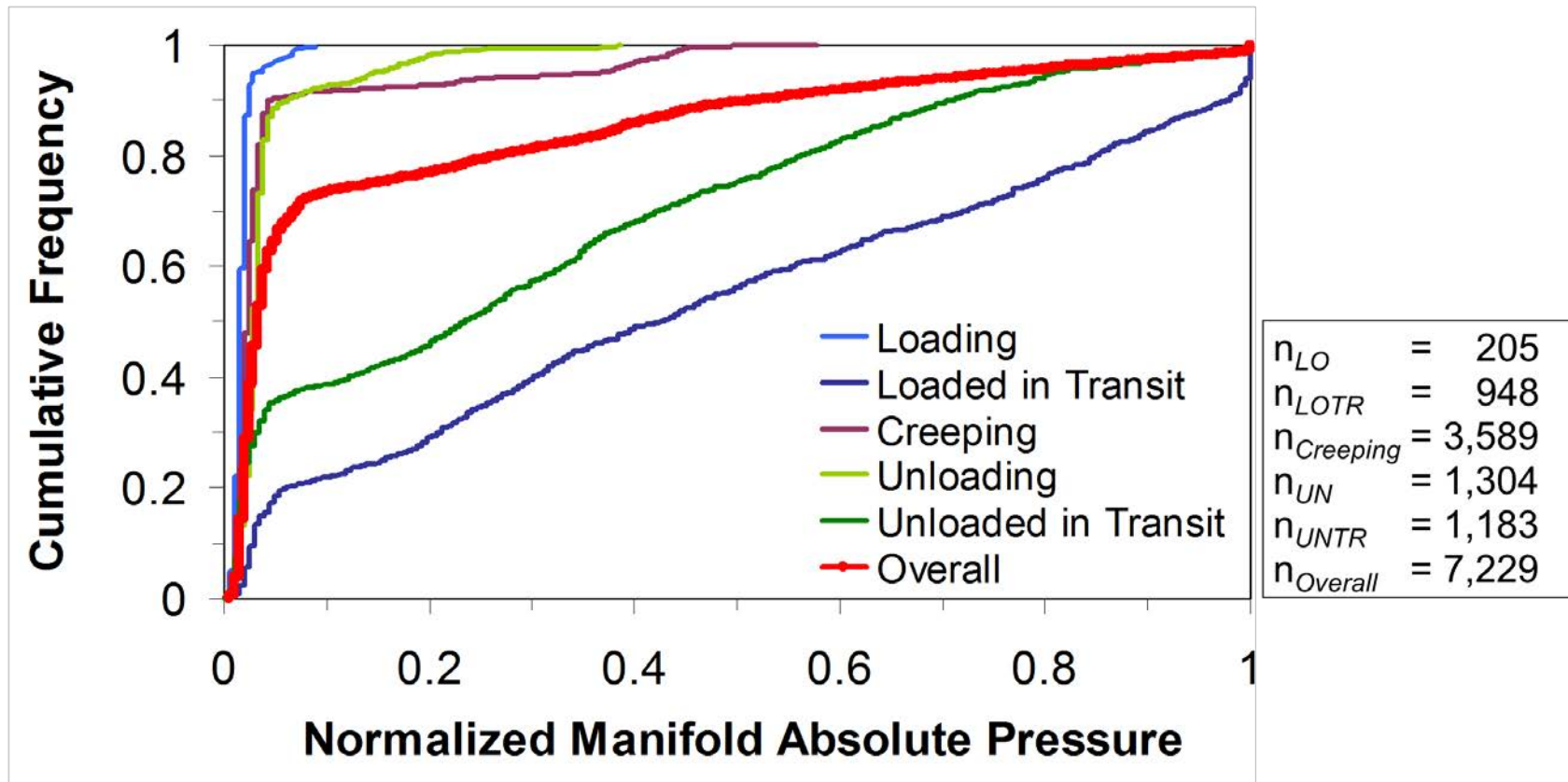


Source: Frey and Kim, 2006, Transportation Research Record

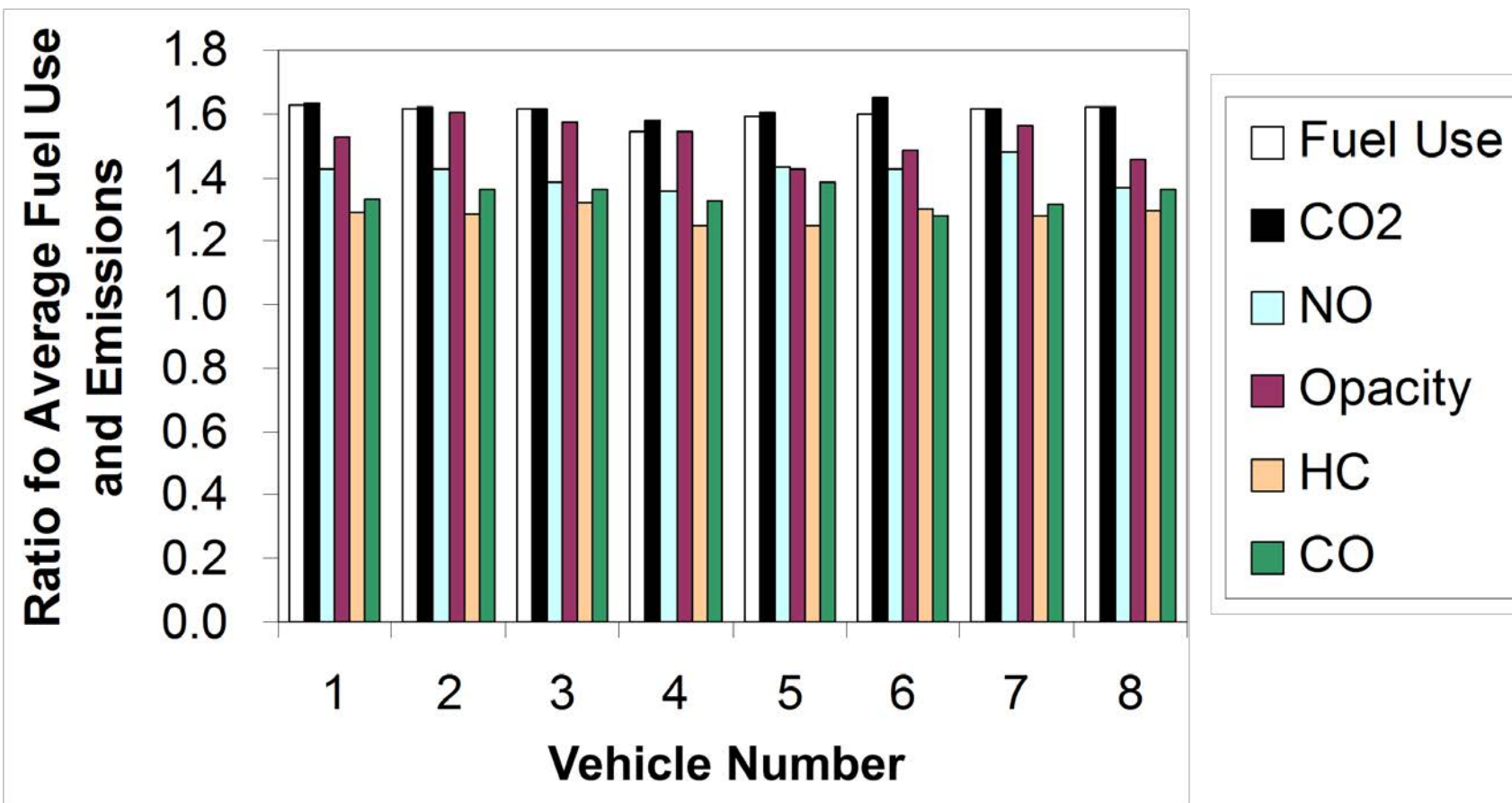
# Field Data Collection on Concrete Mixer Trucks



# Frequency Distribution of Engine Loads for Components of Concrete Mixer Truck Duty Cycle

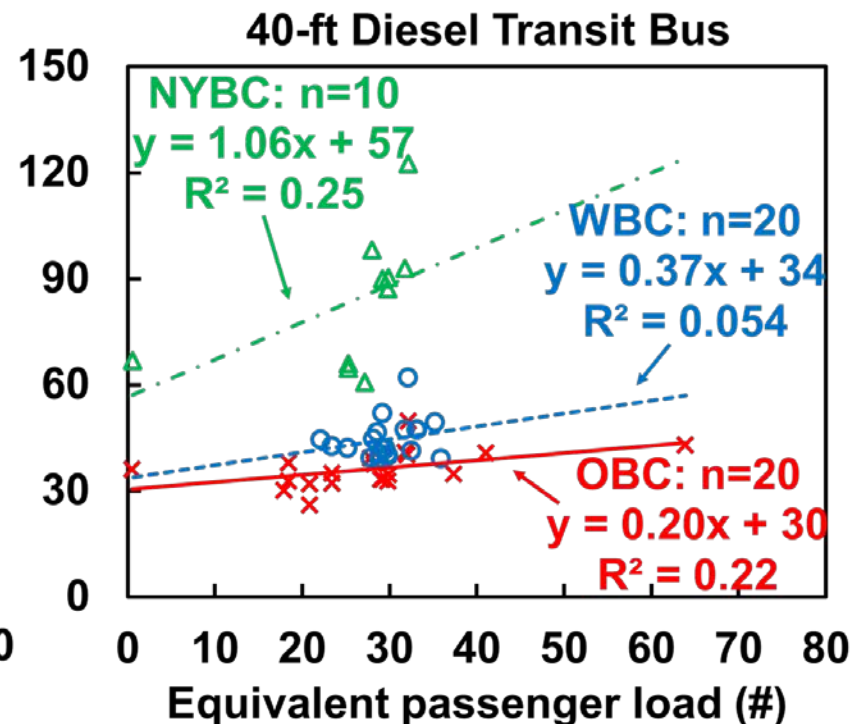
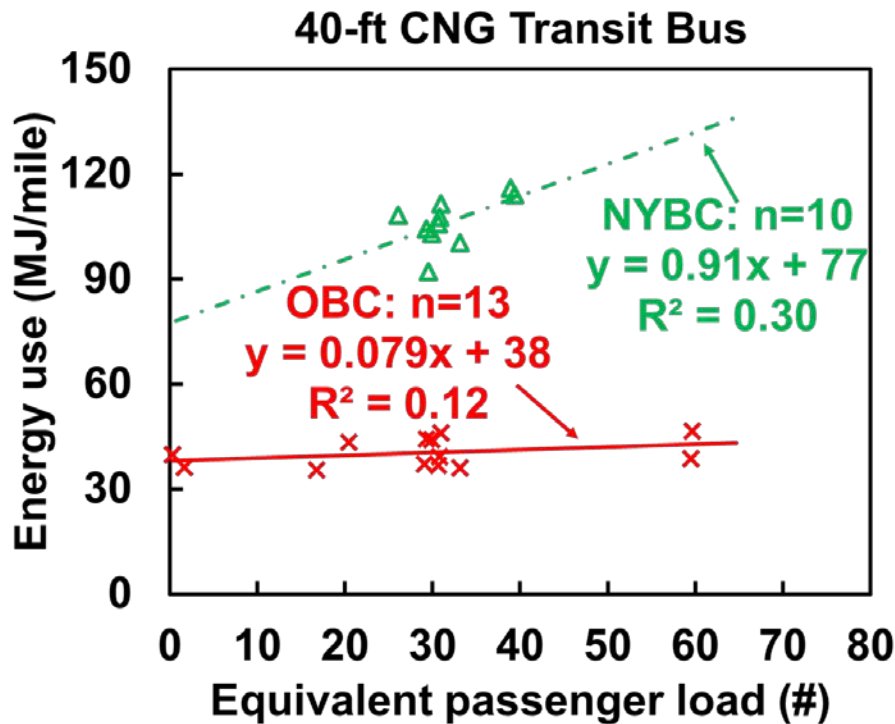


# Ratio of Loaded to Unloaded Fuel Use and Emission Rates for Concrete Mixer Trucks





# Transit Bus Energy Use Rate Versus Passenger Load

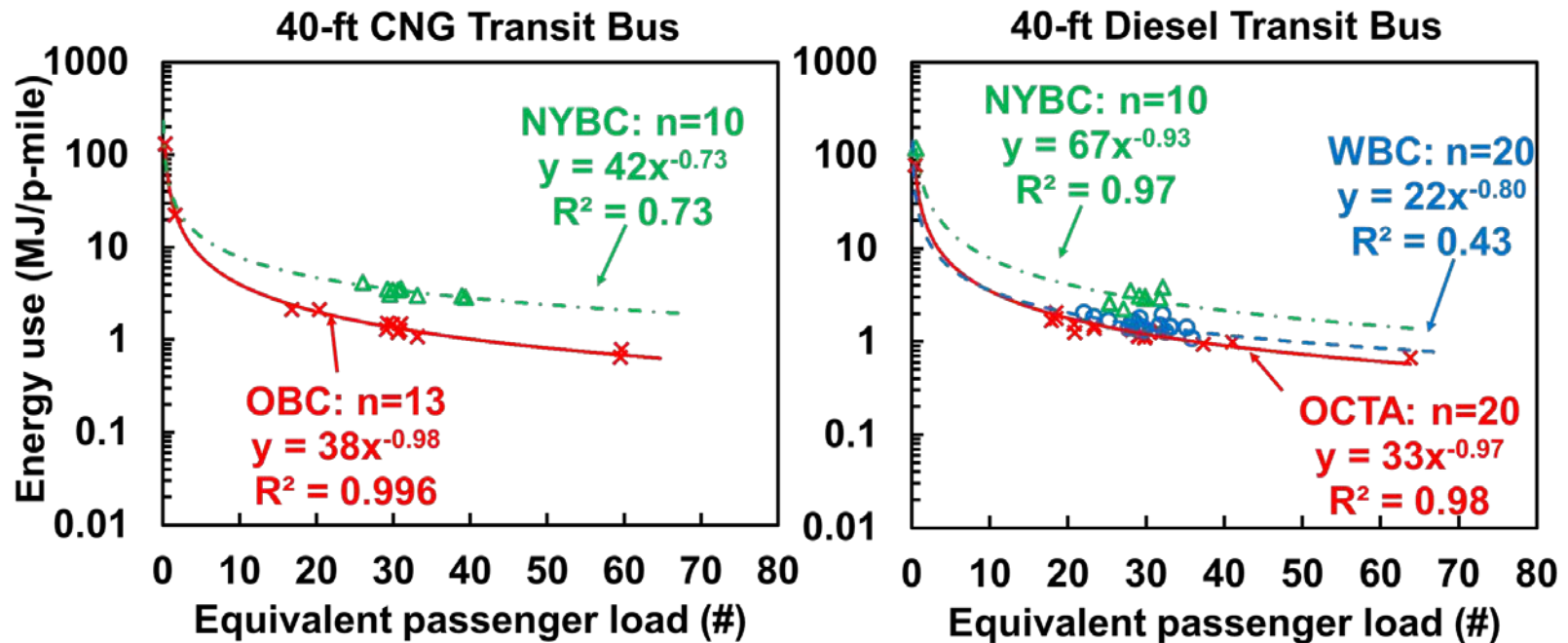


Source: Wei and Frey, 2018, TRB Annual Meeting

## MOVES Transit Bus

- These data do not correspond to any particular size of transit bus
- Categorized by regulatory class (weight)
- Common sizes are 30 foot, 40 foot, and 60 foot long (with variations)
- Better documentation of basis
- Categorize by regulatory class and size

# Implications: Energy Use Rate Per Passenger Mile



Source: Wei and Frey, 2018, TRB Annual Meeting

# Other Needs: Secondary Organic Aerosol (SOA) Precursors

- IVOC and SVOC from gasoline and diesel vehicles leads to SOA formation (Gentner et al., 2017)
- Ratio of SOA-precursors to primary PM from LDGVs ranged from 20 to 90 for measurements that included cold starts (May et al., 2014)
- SOA yield is likely higher for gasoline than diesel vehicles (McDonald et al., 2015)
- Decreases in aromatics can decrease SOA (Zhu et al. 2017)
- Intermediate VOCs (IVOCs) (13 to 19 carbon atoms)
- Semi-Volatile Organic Compounds (SVOCs) (20 to 26 carbon atoms)
- Formatting MOVES output for SOA precursors, and for ratio of precursors to primary organic aerosol emissions, would be helpful.
- Actual SOA formation also depends on atmospheric concentration of peroxy radicals and other factors.

## Other Needs: Role of Lubricating Oil

- Not well-characterized
- E.g., SOA precursor
- Factor in cold starts
- Factor in primary organic aerosol emissions (e.g., Li et al., 2016)
- Factor in UFP emissions (e.g., Pirjola et al., 2015)
- Implicated in self-pollution of diesel school buses (i.e. crankcase gases) (e.g., Ireson et al., 2011)
- Needs more research

## Other Needs: Ultrafine Particles

- More attention to this in Europe
- Solid Particle Number (SPN) method used in Europe
- Role of volatile UFPs, especially at size less than 23 nm

## Other Needs: Brake and Tire Wear

- Brake and tire wear likely to exist for all vehicles as long as there are friction brakes and tires
- Vehicles with batteries tend to be heavier – more wear emissions (e.g., Timmers and Achten, 2016).
- Some of these particles are large (>2.5 micrometers) (e.g., Sanders et al., 2003) and are of less health concern
- Brake UFP emissions seem to increase with brake temperature (e.g., Nosko et al., 2017; Alemani et al., 2018)
- Evidence of UFP emissions from tires (Dahl et al., 2006), which include more organics than brake wear (Thorpe and Harrison, 2008)
- Needs more investigation

## Other Needs: Air Conditioning

- Based on MOVES, air conditioning imposes an energy use penalty of approximately 10 to 15 percent, depending on the cycle.
- Based on data collected in 1997 and 1998
- Current GHG emission standards offer incentives for AC efficiency
- Lack of adequate quantification of AC energy consumption based on recent data and trends



# Autonomous Vehicles

- Potentially very ‘disruptive’
- More trip taking?
- “right-sized” vehicles?
- More efficient trajectories? Or higher performance trajectories?
- Will pricing models adapt to potentially large increases in energy demand from AVs?
- Possible market share of 2 to 15 percent by 2030... (?)
- Full autonomy less likely until mid-century or later
- When, how, should MOVES start to account for AVs...

# Summary

- LDGV is in technology transition from PFI to GDI
- Significant number of FFVs
- LDGVs adapt to ethanol blends
- Growing numbers of HEVs, PHEVs, BEVs
- HEVs can likely be modeled with existing opmodes as long as fraction of engine off time is accounted for.
- Grid-based emissions for PHEVs and BEVs should be taken into account
- With the growing number of available real-world cycles, should move away from “default cycles” to distributions of cycles, and assess mean trends rather than interpolate
- While beyond detail needed for aggregated inventories, libraries of vocational duty cycles could be helpful to some users
- Vehicle load is not a variable in MOVES. Fuel use and emissions are sensitive to vehicle load.
- Other needs include accounting for SOA-precursors, UFP characteristics, role of lubricating oil w.r.t. particle emissions, improved brake and tire wear estimates, and updating air conditioning adjustments