

# E-Commerce Impacts on Regional Travel and Energy Use:

## Household Shopping and Parcel Delivery Tradeoffs



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FHWA Talking Freight Seminar  
December 19, 2019

# Transportation System is Being Disrupted

Vehicle Electrification



Passenger Movement



Traveler Behavior



Connectivity



Shared Mobility



Automation



Goods Movement



Charging Infrastructure



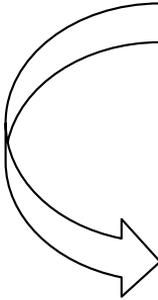
E-Commerce



Electric Grid



# Today: Examine the Impacts of E-commerce on Regional Travel and Energy Consumption



# Research Question

As traditional (physical)  
shopping trips



are replaced by

virtual (e-commerce)  
shopping “events”...



...what will be the net effect on regional  
Vehicle-Miles Traveled (VMT) and  
Fuel Use or Total Energy Consumption?

# Scope

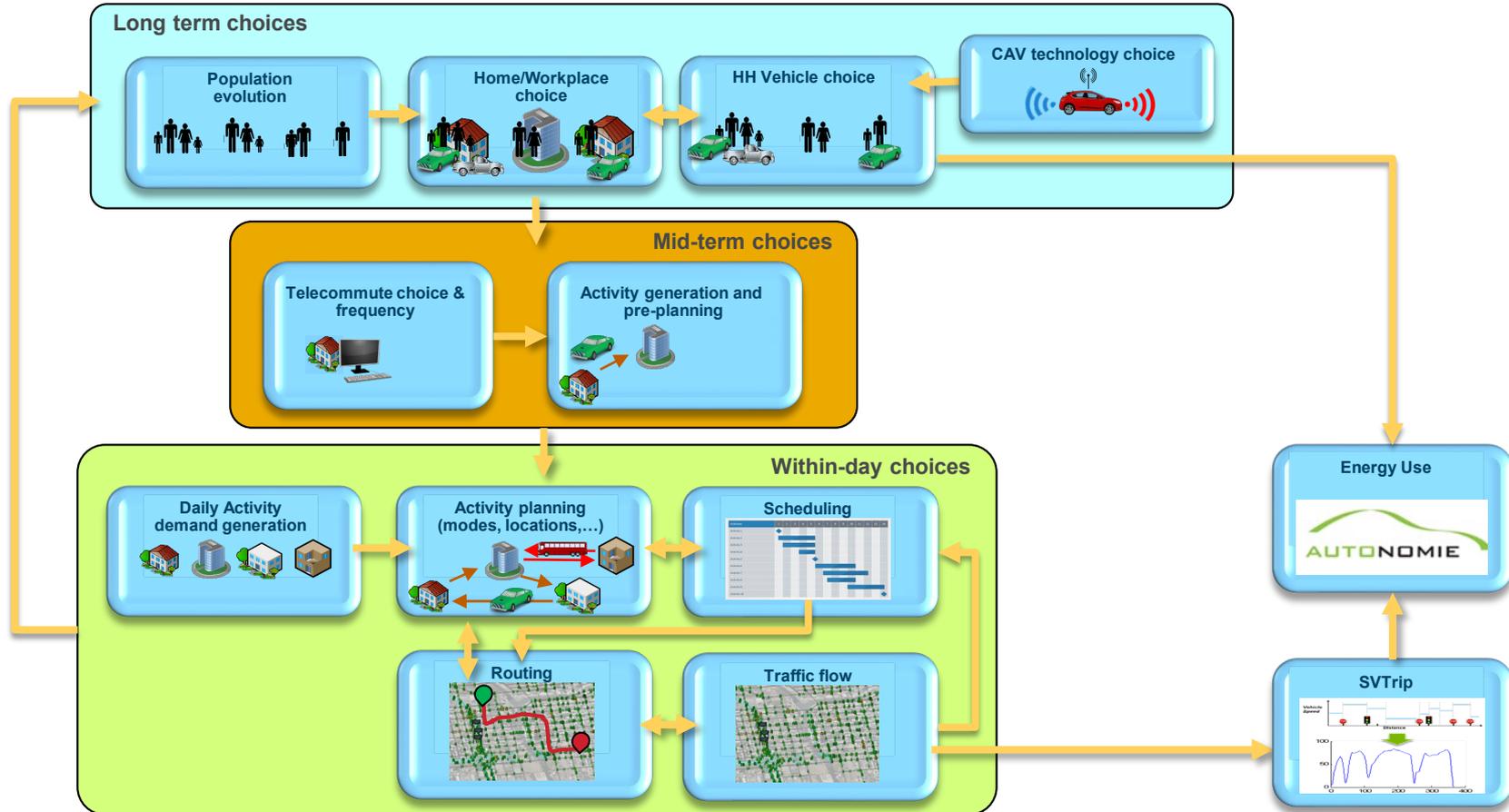
- Last-mile delivery
- Chicago Metropolitan Region:



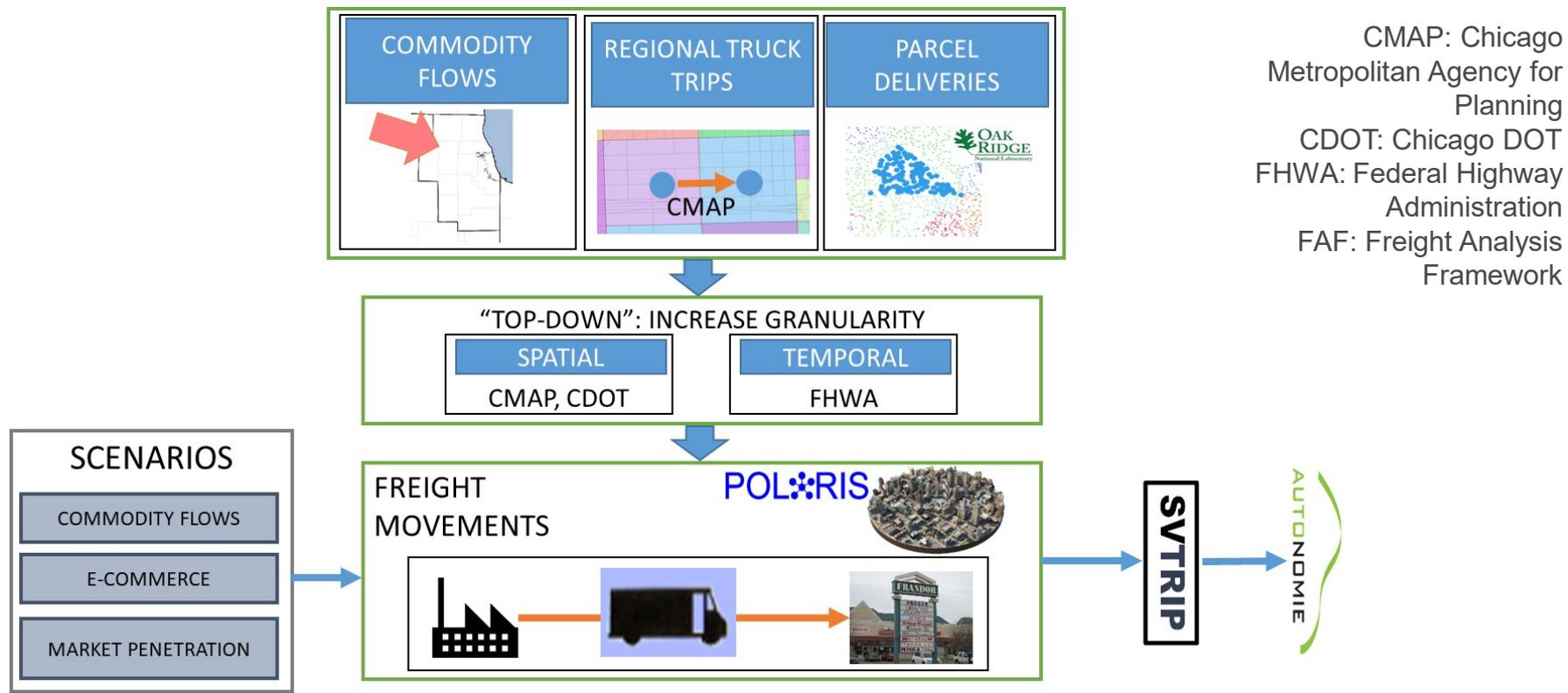
# APPROACH

*ACTIVITY-BASED TRAVEL DEMAND (ABM) AND DYNAMIC TRAFFIC ASSIGNMENT (DTA) MODELING*

# POLARIS...allows us to explore tradeoffs that individuals make in their travel decisions



# Implemented Freight Model in POLARIS



CMAP: Chicago Metropolitan Agency for Planning  
 CDOT: Chicago DOT  
 FHWA: Federal Highway Administration  
 FAF: Freight Analysis Framework

# Methodology to Assess E-Commerce Impacts

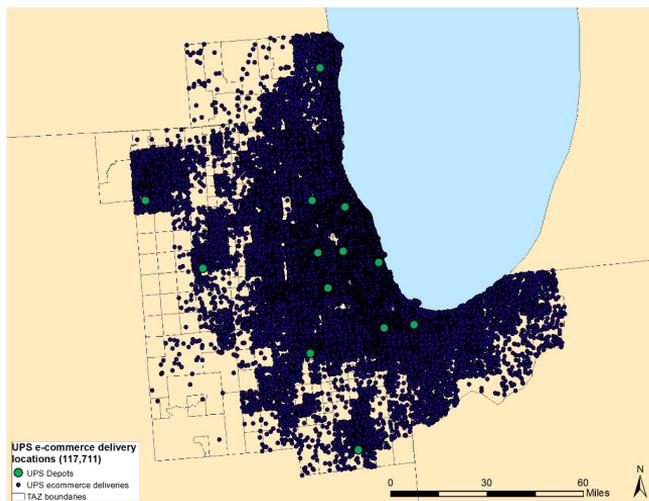
**Step 1. Generate household delivery demand.**

**Step 2. Generate parcel delivery supply.**

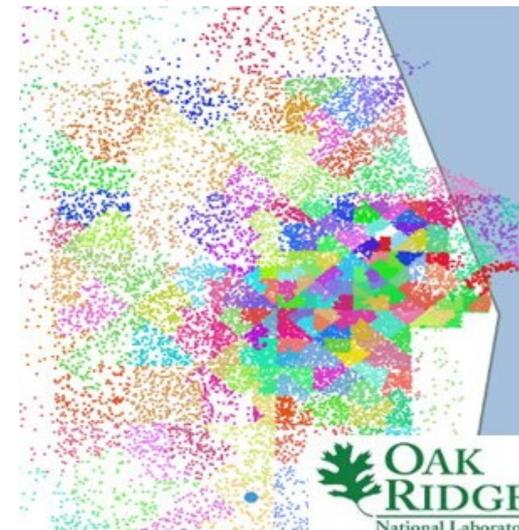
WholeTraveler  
survey data



E-commerce Demand:  
Household Behavioral Model



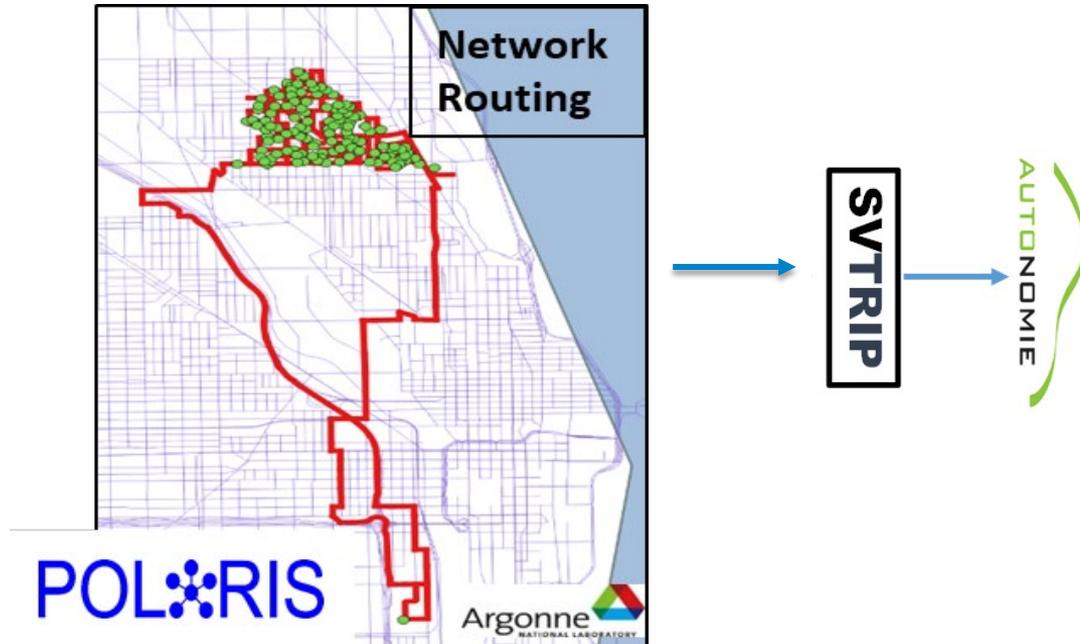
E-commerce Supply\*:  
Parcel Truck Stop  
Sequence Model



# Methodology to Assess E-Commerce Impacts

Step 3. Route delivery trucks in POLARIS.

Step 4. Compute vehicle-miles traveled (VMT) and energy use.



# Household E-commerce Demand Behavioral Model

**More e-commerce demand for households with:**

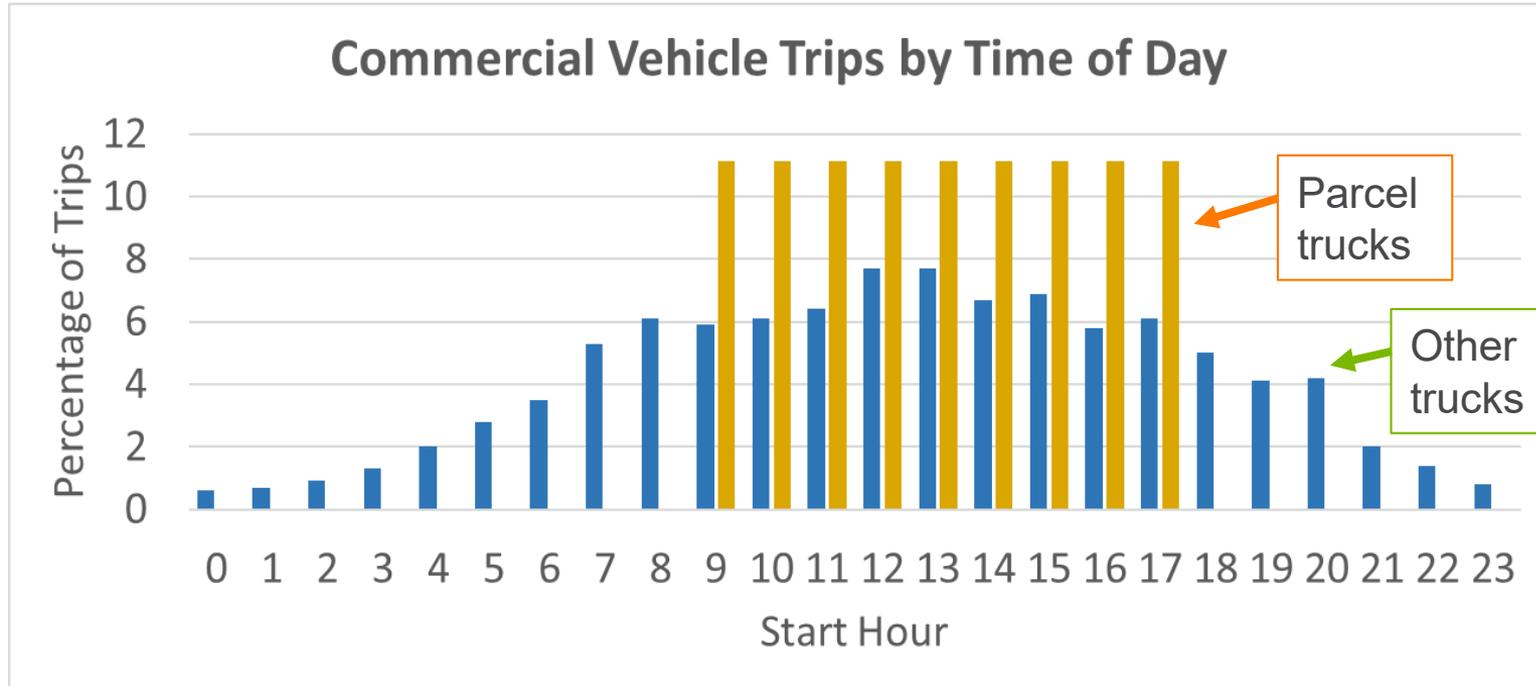
- Higher incomes
- More children (busier parents?)

**Less e-commerce demand for households with:**

- More vehicles
- Fewer adults
- Residence is walkable and/or relatively close to transit (high-density)

Binary Choice: Whether Participates in E-commerce or not		
Variables	Estimates	t-stat
Constant	-0.103	-1.64
# of HH Children	0.104	1.39
HH income less than 25k	-0.459	-2.33
HH income between 25k and 50k	-0.54	-3.37
HH income between 50k and 100k	-0.154	-1.41
HH income greater than 200k	0.355	3.32
Distance to nearest transit stop from home (in 100th of miles)	0.077	1.18
Ratio of Delivery to Retail Shopping		
<i>Parameters to the latent propensity</i>		
Constant	2.882	11.7
# of HH Adults	-0.146	-2.49
HH income greater than 200k	0.369	3.29
Walk Score (Range 0 to 10)	-0.057	-3
# of HH Vehicle	-0.18	-2.8
<i>Threshold Parameters</i>		
	-ve	
Theta 0	Infinity	Fixed
Theta 1	0	Fixed
Theta 2	1.576	11.86
Theta 3	2.162	15.74
Theta 4	2.738	19.23
Theta 5	3.482	22.34
	+ve	
Theta 6	Infinity	Fixed
Summary		
Number of Observations		971
Final Log-likelihood		-1362.45

# Temporal Disaggregation\* Algorithm



\*The process uses data from: Chicago DOT Buildings Data, CMAP Land Use Inventory, and the FHWA Traffic Data Computation Method: Pocket Guide

# Assumptions in Model Scenarios

Scenario	E-commerce Delivery Rate (Deliveries per week per household)	Vehicle & Powertrain Technology	Other Important Assumptions
Baseline	1	-	-
Short Term	3	<b>Baseline, BAU</b> (Business as usual), <b>VTO</b> Targets	Increased TNC Use
Long Term	5		2 scenarios: High TNC* Use & Low Private AV** Low TNC Use & High Private AV

\*Transportation network company

\*\*Autonomous vehicle

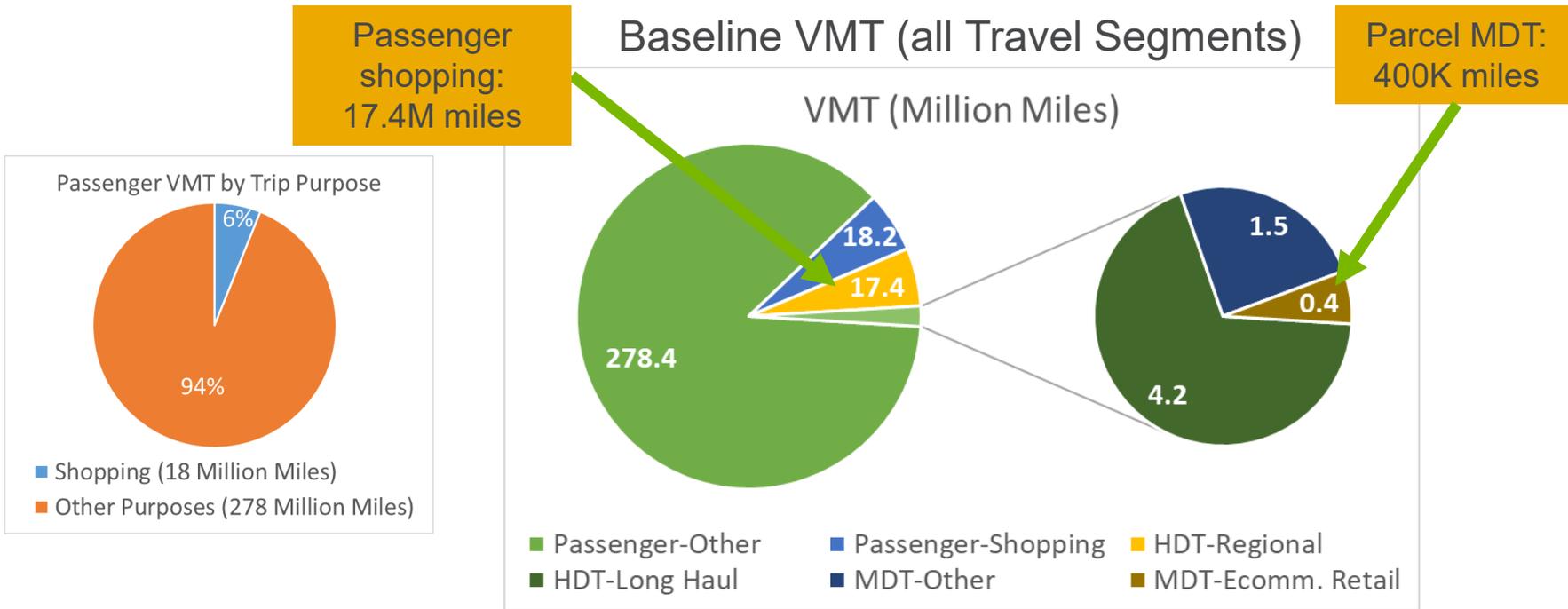
- Vehicle & Powertrain Technology: **Increasing levels of electrification** among passenger and commercial fleets
- Future growth in passenger and commercial trips due to **population growth** and **moderate commodity flow growth**

# FINDINGS

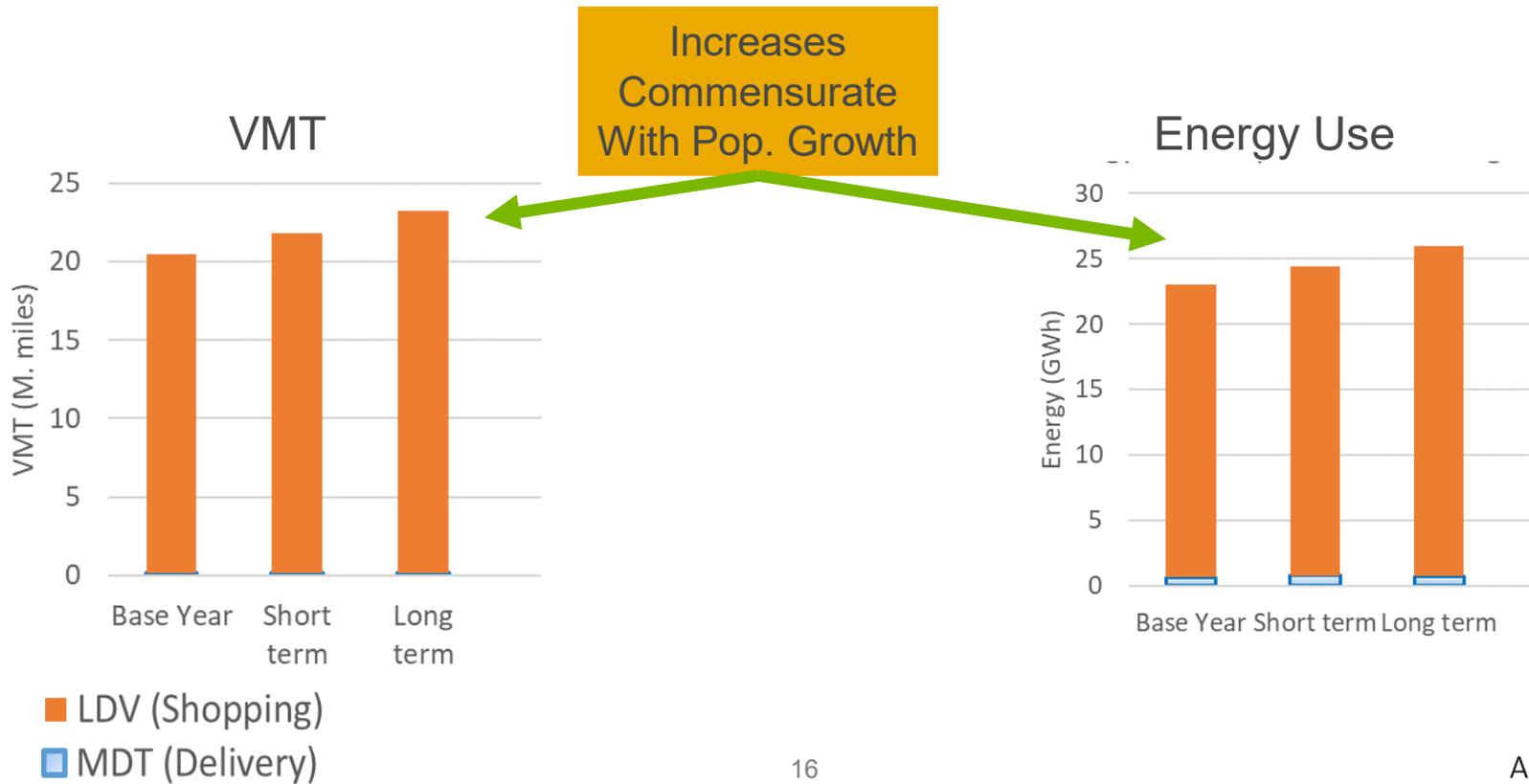
# Travel Segments in the E-commerce Analysis:

--Medium-Duty Parcel Delivery Trucks (MDT)

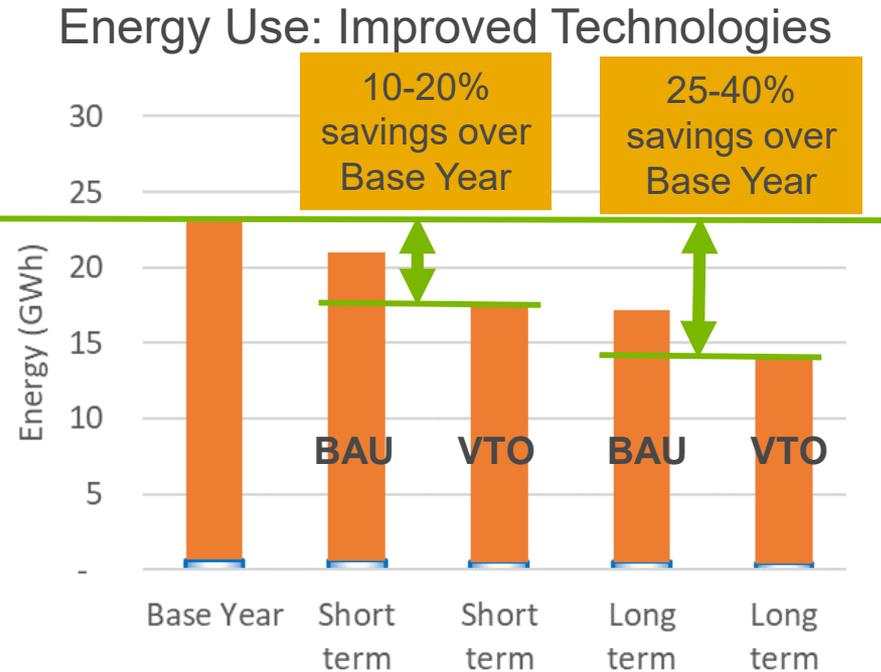
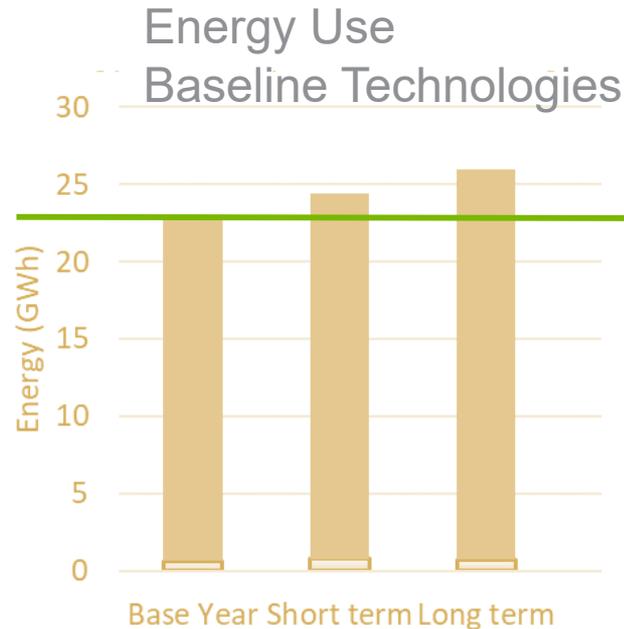
--Passenger Shopping Light-Duty Vehicles (LDV)



# Slight Growth in VMT and Energy Use if E-commerce Rate Stays at 1 Delivery per Household per Week...

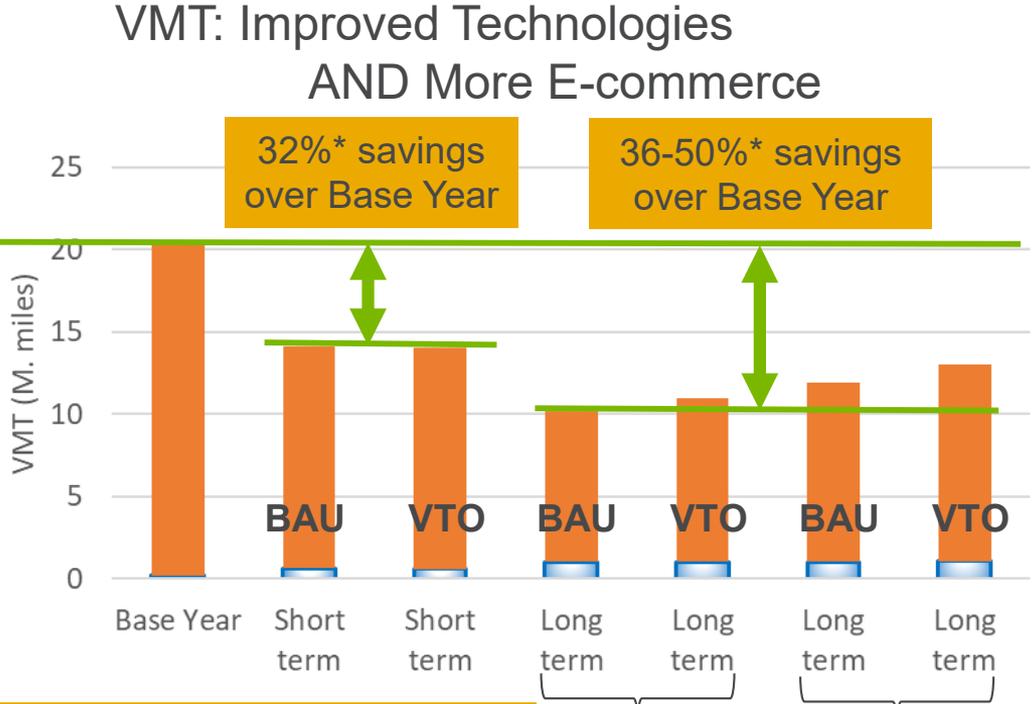
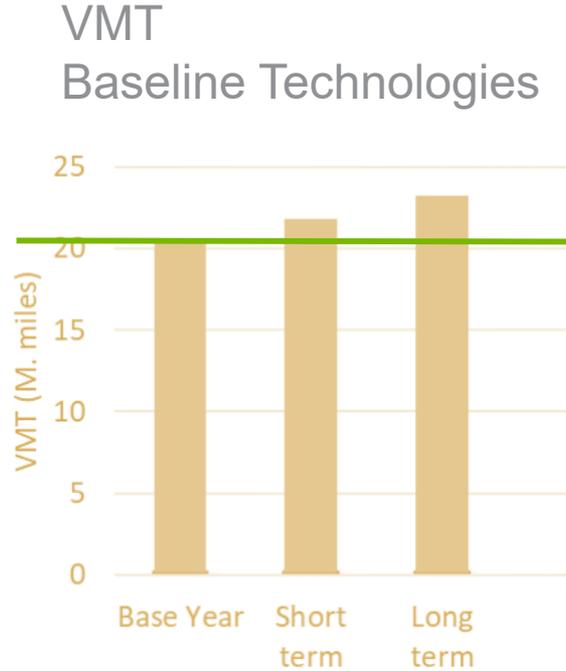


# Ceteris Paribus (e.g., 1 Delivery per Household per Week), Vehicle Technology Improvements Can Greatly Reduce Energy Use



- LDV (Shopping)
- MDT (Delivery)

# In a World with Increasing E-commerce, Parcel MDT VMT Grows by about 300-500%, but Total Last-Mile Retail VMT Decreases Significantly...



- LDV (Shopping)
- MDT (Delivery)

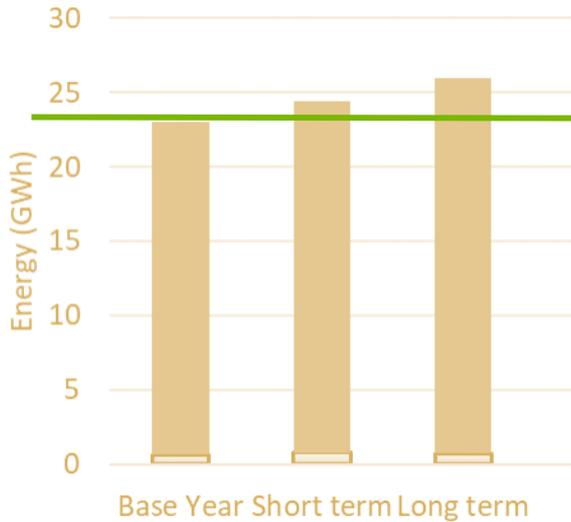
\*After accounting for Vehicle Technology Improvements: 34-56% savings

High TNC

High Private AV

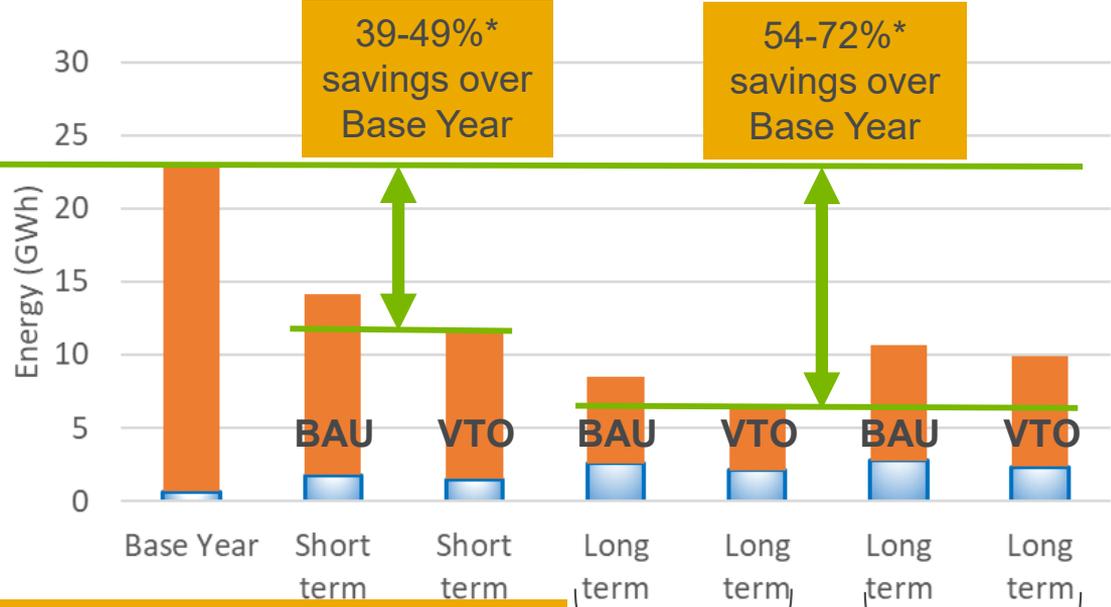
# Energy Use is Likewise Significantly Reduced as E-commerce Increases...

Energy Use  
Baseline Technologies



- LDV (Shopping)
- MDT (Delivery)

Energy Use: Improved Technologies  
AND More E-commerce



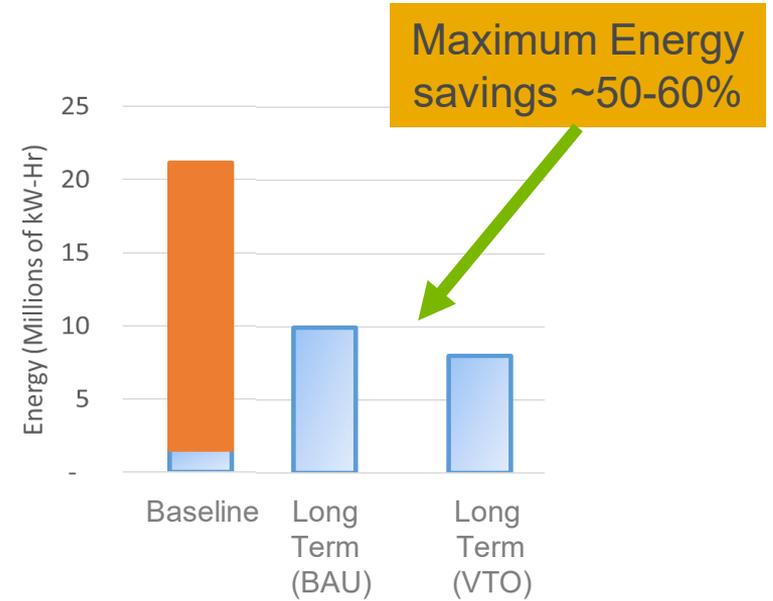
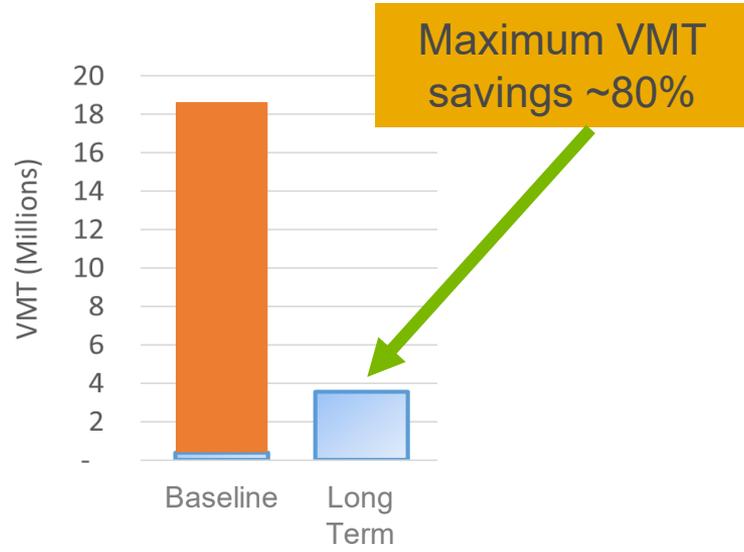
After accounting for Vehicle Technology Improvements: 29-54%\* savings

High TNC

High Private AV

# A corner case\*: E-commerce deliveries replace ALL household shopping trips...

\*This case is from an earlier version of the model.



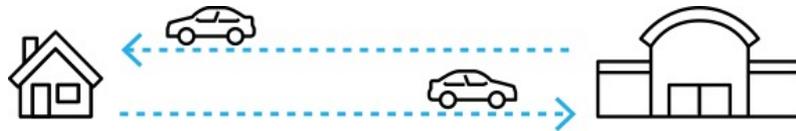
→ overall trend: efficient e-commerce system saves last-mile VMT & energy  
→ room to improve truck efficiency

- LDV (Shopping)
- MDT (Delivery)

# Why does this happen?



SHOPPING TRIP = 7 to 8 miles



(2017 NHTS)

DELIVERY TRIP

1 ADDED STOP = 0.4 mile



# CONCLUSION

## Summary of Results

- Although e-commerce is expected to generate a large increase in last-mile delivery, an overall net reduction in VMT (34-56%) and energy use (29-54%) is estimated to occur after also accounting for shopping trip reductions and vehicle technology changes
- Overall results differ somewhat due to assumptions about the future, especially:
  - The market penetration of electrification technologies
  - Levels of TNC and Private AV use among passengers
    - High usage of Private AV may generate longer LDV shopping trips

# For more information:

## Citywide Impacts of E-Commerce: Does Parcel Delivery Travel Outweigh Household Shopping Travel Reductions?

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### ABSTRACT

E-commerce has facilitated online ordering of goods by households in recent years. This technological advancement has disrupted shopping related transportation. While the National Household Travel Survey (NHTS [1]) finds that household shopping frequency has declined in the last 10-20 years, deliveries by parcel delivery trucks and vans [2] have increased. However, the net effect of these phenomena on overall trip making, vehicle-miles traveled (VMT) and fuel consumption has not been quantified. From a regional planning perspective, understanding the net effect is important for informing city policies—for example, in regards to land use and transportation planning.

The objective of this research is to address this gap. In this study, the net regional impact of e-commerce on transportation and fuel consumption is evaluated.

### 1 Introduction and Background

Generally speaking, city planning and policy measures aim to promote economic health, mobility, energy efficiency, and other desirable urban traits that enhance quality of life for residents. Access to shopping and low levels of congestion typically are considered desirable features in a metropolitan area.

In recent years, however, travel by motorized vehicles has grown to such levels that congestion is a top concern in many cities. At the same time, accessibility to shopping has been enhanced in a new way with the emergence of e-commerce, which has grown from less than 1% of US retail purchasing in 2000 to about 10% in 2018 [5]. Traffic by parcel delivery trucks, which transport deliveries from fulfillment centers and other e-commerce distribution points to homes and businesses, has grown

SCC '19 Proceedings of the 2nd ACM/EIGSCC  
Symposium on Smart Cities and  
Communities  
Article No. 10

Portland, OR, USA — September 10 - 12,  
2019

ACM New York, NY, USA ©2019

table of contents ISBN: 978-1-4503-6978-7  
doi> 10.1145/3357492.3358633

See also:

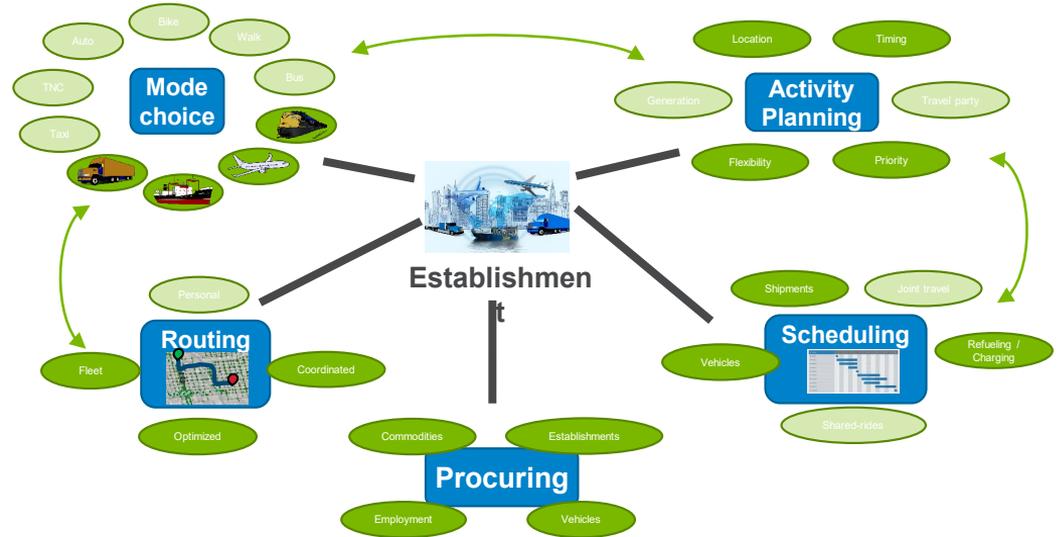
DOE SMART *Workflow Capstone Report & Multimodal Freight Capstone Report*

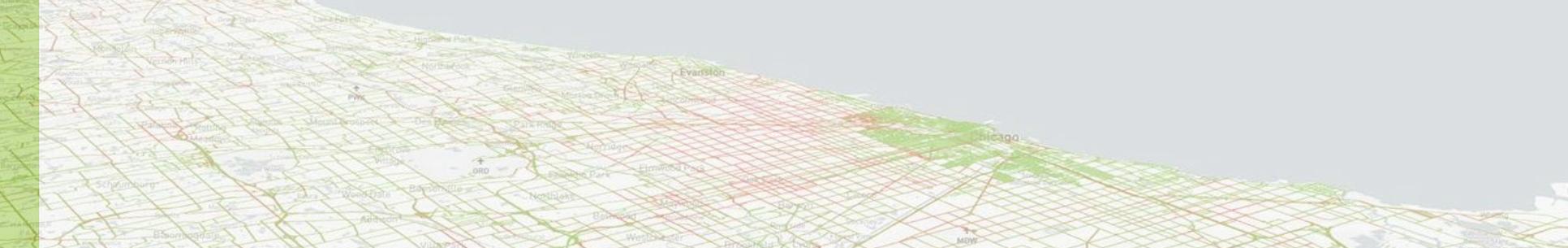
## ACKNOWLEDGMENTS

The submission has been created by UChicago Argonne, LLC, Operator of Argonne National Laboratory (“Argonne”) and UT-Battelle, LLC, Operator of Oak Ridge National Laboratory (“ORNL”). Argonne, a U.S. Department of Energy Office of Science laboratory, is funded and operated under Contract No. DE-AC02-06CH11357. ORNL, a U.S. Department of Energy Office of Science laboratory, is funded and operated under Contract No. DE-AC05-00OR22725. The following Department of Energy project managers played a role in guiding this work: David Anderson and Prasad Gupte of the Vehicle Technologies Office (VTO). The U.S. Government retains for itself, and others acting on its behalf, a paid-up, nonexclusive, irrevocable worldwide license in said article to reproduce, prepare derivative works, distribute copies to the public, and perform publicly and display publicly, by or on behalf of the Government.

# Next steps

Enhancements to the model:  
Stinson, Auld, Mohammadian (Oct 2018).  
“An Agent-based Model of Freight  
Transportation  
with Emerging Trends in POLARIS,”  
VREF Urban Freight Conference,  
Gothenburg, Sweden.

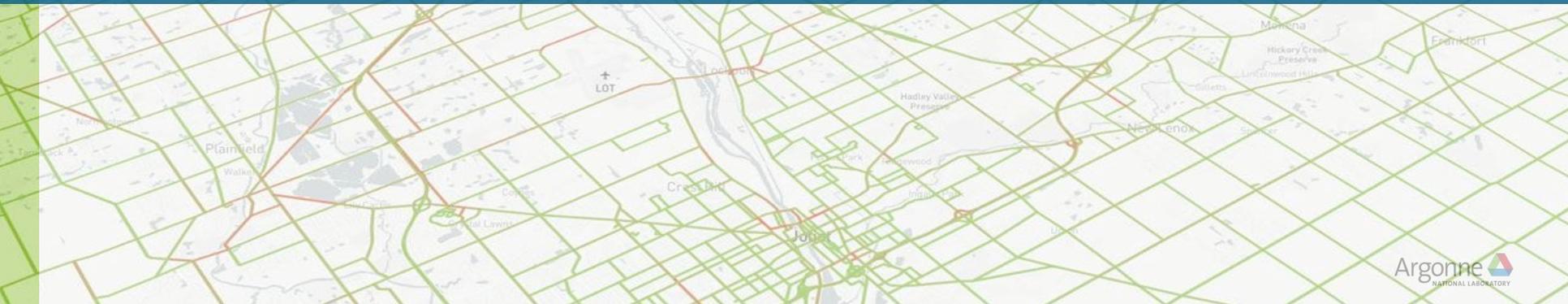




# Argonne



NATIONAL LABORATORY

The logo consists of a central white triangle pointing upwards, surrounded by four colored triangles: green (top-left), red (top-right), blue (bottom-left), and dark blue (bottom-right). The entire logo is set against a dark blue background.

# Detailed scenario assumptions

Scenario Group	Scenario	Component Technology	Long Haul Commodity Flow - CAGR (%)	E-commerce Deliveries per Household	Passenger vehicle retirement rate (%)	Passenger VOTT Factor
<b>Baseline</b>	Base0	Baseline	N/A	0.16 per day (about 1 per week)	0	1
<b>Baseline Short Term</b>	Base1	Baseline	1			
	Base2	Short term BAU				
	Base3	Short term VTO Targets				
<b>Baseline Long Term</b>	Base4	Baseline				
	Base5	Long term BAU				
	Base6	Long term VTO Targets				
<b>A</b>	A2	Short term BAU		0.4 per day (about 3 per week)	45	High
	A3	Short term VTO Targets		45		
<b>B</b>	B5	Long term BAU		0.7 per day (about 5 per week)	68	Low
	B6	Long term VTO Targets			75	
<b>C</b>	C5	Long term BAU	15		Low	
	C6	Long term VTO Targets	20			