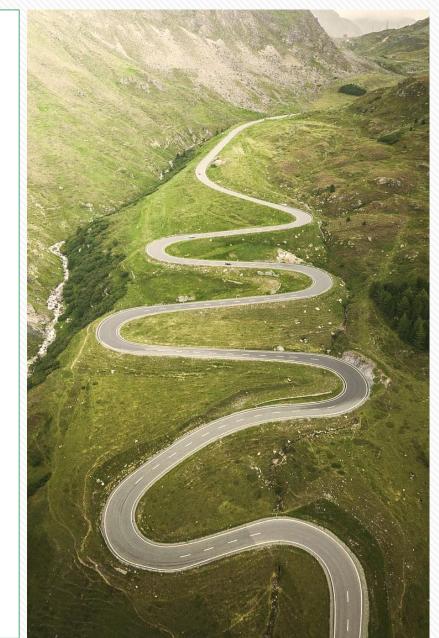
THE PATH TO 100% A Household-Level EV Adoption Model for California

Trisha Ramadoss, Ph.D. Candidate EV Research Center, UC Davis Tuesday November 14, 2023 BECC

In collaboration with Drs. Jae Hyun Lee, Adam Wilkinson Davis, Scott Hardman, Gil Tal







MOTIVATION Switching to electric vehicles

Advanced Clean

California is moving towards 100% EVs

CALIFORNIA'S CLIMATE PLAN LAYS THE ROADMAP TO 2045



Cars II

35%

2026

2027

2028

2029





100%

Sales

Vehicle

New

ğ

PHEV

and

ZEV

2

80% 70%

60%

50%

40%

30%

20%

10%

0%

2035

2032

RESEARCH QUESTIONS The path to 100% EVs

How do we move from **early adopters** to the **general population**?



Generated by Trisha Ramadoss using DALL-E 3

Institute of Transportation Studies

Electric Vehicle Research Center

- Which types of households have already adopted an EV?
- How do they compare to the general population?
- How quickly is adoption progressing?
- Is adoption on track to meet **2045** targets?

3

Identifying different types of adopters

Clustering

3

Generalizing to the entire population

- Scoring Population
- Weighting EV Adoption by Cluster

Creating **future scenarios**

- Bass Diffusion Current & Net Zero
- Comparing to EV Supply using ACCII



Generated by Trisha Ramadoss using DALL-E 3



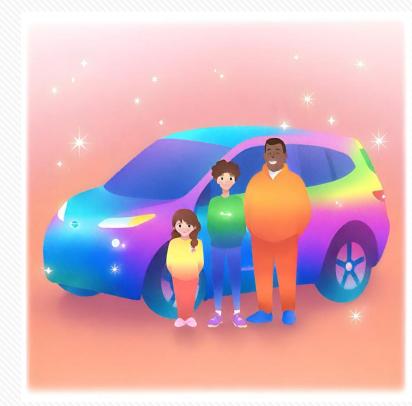
Identifying different **types of adopters**

Clustering

3

Generalizing to the entire population

- Scoring Population
- Weighting EV Adoption by Cluster
- Creating future scenarios
 - Bass Diffusion Current & Net Zero
 - Comparing to EV Supply using ACCII



Generated by Trisha Ramadoss using DALL-E 3



Identifying different **types of adopters**Clustering

Generalizing to the entire population

Scoring Population

3

• Weighting EV Adoption by Cluster

Creating **future scenarios**

- Bass Diffusion Current & Net Zero
- Comparing to EV Supply using ACCII



Generated by Trisha Ramadoss using DALL-E 3



Identifying different **types of adopters**

Clustering

3

Generalizing to the entire population

- Scoring Population
- Weighting EV Adoption by Cluster

Creating **future scenarios**

- Bass Diffusion Current & Net Zero
- Comparing to EV Supply using ACCII



Generated by Trisha Ramadoss using DALL-E 3



Identifying different **types of adopters**









Sociodemographics

• Income, Age, Gender, Education, Housing Type & Tenure



Land Use

Rural/Suburban/Urban

Latent Class Clustering



Vehicle Fleet (Multi-Vehicle only)

• Fleet size, Vehicle Ages, Vehicle Body Types







- Survey of EV buyers who apply to CVRP
 - Designed by ITS-Davis EV Research Center
 - Recruitment by CARB
 - Buy EV → Apply CVRP → Recruited
- CVRP Rebate
 - 2010 onwards
 - \$1,000-\$7,500
 - Buying/leasing new EV
 - Changing income & vehicle eligibility







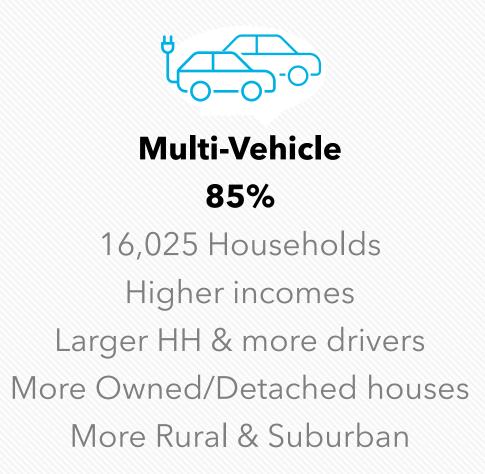






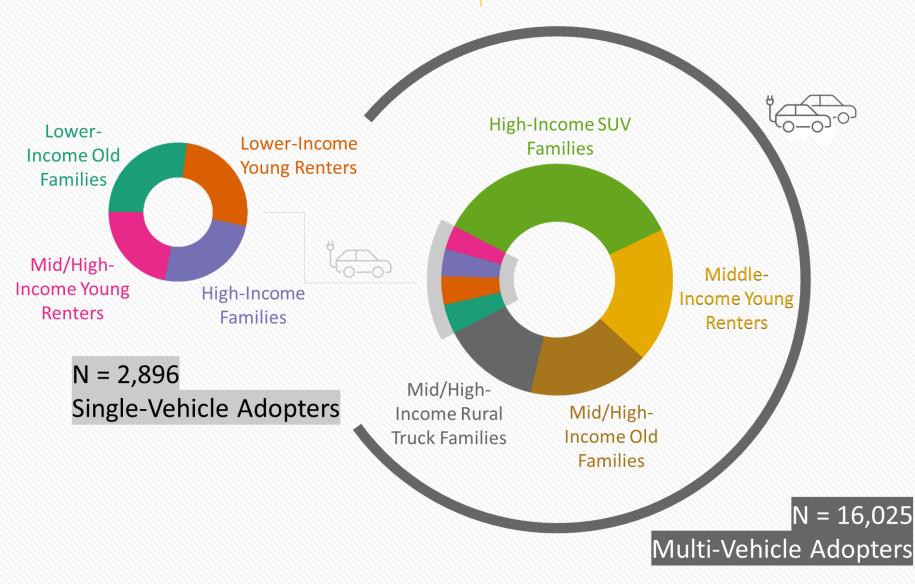
Single-Vehicle 15%

2,896 Households Slightly younger More female EV drivers More Apartments & Rented More Urban





EV ADOPTERS 8 Clusters









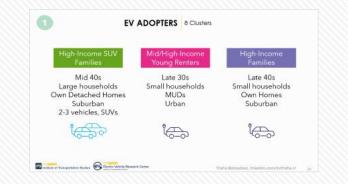
- Unsurprisingly, the largest adopter cluster is high-income, suburban & likes to own SUVs
- But, we also see interesting clusters
 - Lower-income
 - Rural

Institute of Transportation Studies

- Renters
- Own trucks







Generalizing to the **entire population**

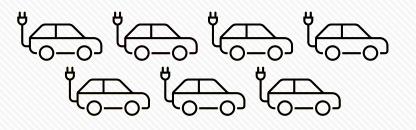






GENERAL POPULATION Methods & Data

- Scoring to calculate the probability a general household belongs to a cluster
 - NHTS California Add-on
- Weighting PEV survey to calculate to-date **cumulative adoption** in each cluster
 - CEC ZEV Sales data

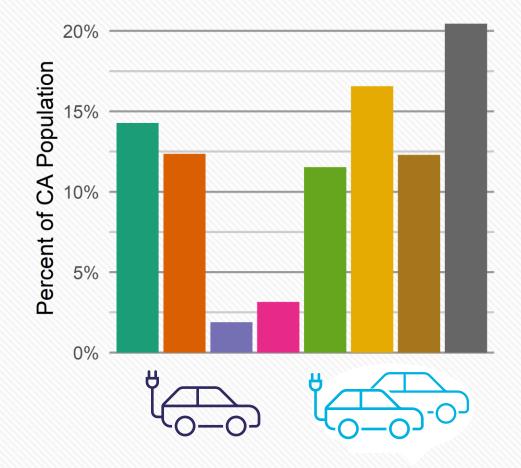








GENERAL POPULATION 8 Clusters



Mid/High-Income Rural Truck Families Middle-Income Young Renters Lower-Income Old Families Lower-Income Young Renters Mid/High-Income Old Families **High-Income SUV Families** Mid/High-Income Young Renters **High-Income Families**



Creating future scenarios

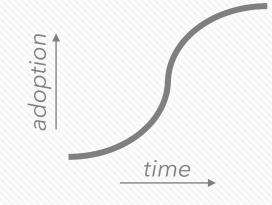


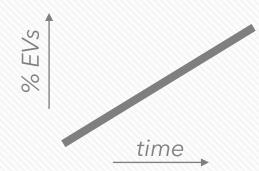




FUTURE SCENARIOS Methods & Data

- Using Bass diffusion to create two scenarios fitting to:
 - Past cluster adoption **BAU**
 - Past cluster adoption + Net Zero full adoption by 2045
- Comparing to CA **EV supply**, assuming a similar vehicle fleet in 2035
 - NHTS California Add-On
 - Advanced Clean Car II Targets











Lower-Income Old Families Lower-Income Young Renters **High-Income Families** Mid/High-Income Young Urban Renters 10.0% 10.0% 10.0% 10.0% PEV Adoption Fraction 5.0% 5.0% 5.0% 0.0% 0.0% 0.0% **High-Income SUV Families** Middle-Income Young Renters Mid/High-Income Old Families Mid/High-Income Rural Truck Families 10.0% 10.0% 10.0% 5.0% 5.0% 5.0% 5.0% 0.0% 0.0% 0.0% 0.0% 2012 2014 2016 2018 2020 2012 2016 2018 2020 2018 2020 2018 2020 2014 2012 2016 2016 2014 2012 2014

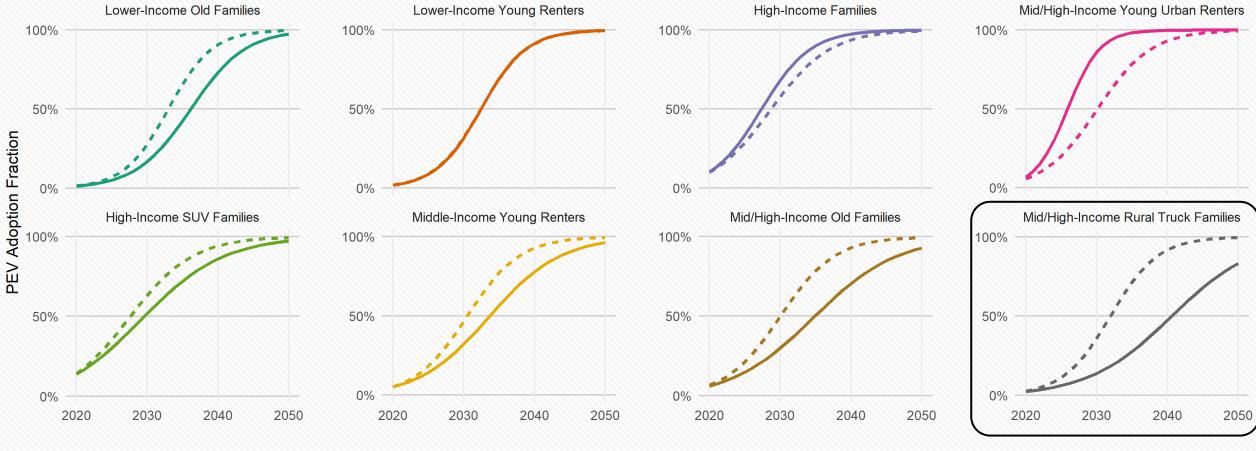
Large segments of the population have low current adoption

---- BAU ---- Net Zero by 2045





Current Trajectory & Net Zero



Large segments are falling short of 2045 net-zero goals

----- BAU - - Net Zero by 2045







Cluster membership \propto

Vehicle age

ACCII TARGETS

• Number of vehicles



Correlates to **probability of EV ownership** assuming ACCII targets are met

Clusters & Vehicles

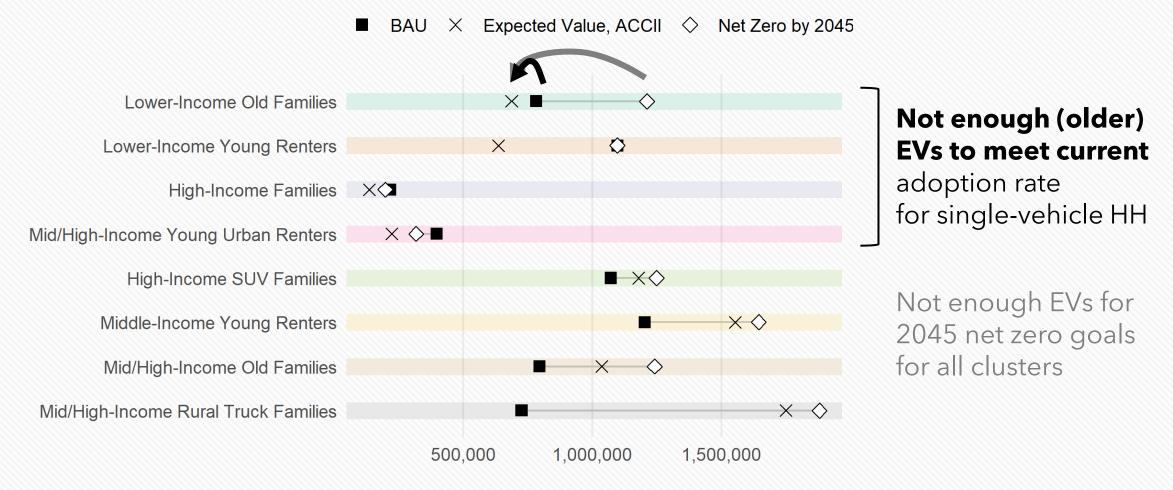


We calculate an **expected value** of adoption given similar fleet in 2035





2035 SCENARIOS Bass Diffusion & ACCII Targets



Number of Households







- Total of **8 clusters** adopting at different rates
 - Some clusters at very low rate currently
- Some are **falling short** of 2045 goals, need targeted policies
 - Rural Truck Families ~ different EV body types, charging
- There **aren't enough (older) EVs** for BAU adoption for some clusters, or for Net Zero targets across all clusters
 - Will people buy old, used ICEVs from other states?
 - Will households have fewer vehicles?

THANK YOU

Trisha Ramadoss tvramadoss@ucdavis.edu







Appendix







EV ADOPTERS 8 Clusters

High-Income SUV Families Mid/High-Income Young Renters

Mid 40s Large households Own Detached Homes Suburban 2-3 vehicles, SUVs

Late 30s Small households MUDs Urban High-Income Families

Late 40s Small households Own Homes Suburban













Middle-Income Young Renters

Late 30s Households w children MUDs or rented homes Urban/Suburban 2 vehicles, sedans



Mid/High-Income Old Families

Late 60s Small households Own Detached Homes Urban/Suburban 2-3 vehicles







EV ADOPTERS 8 Clusters

Mid/High-Income Rural Truck Families

Lower-Income Old Families

Early 50s Large households Own Detached Homes Rural/Suburban 3+ vehicles, large

60s Small households Owned homes or MUDs Suburban





Lower-Income Young Renters

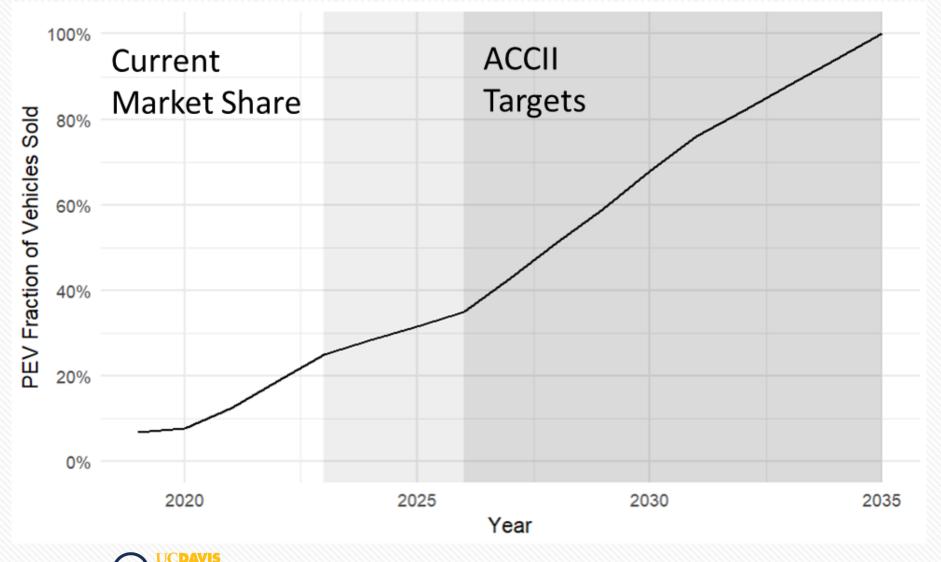
Late 30s/early 40s Small households MUDs or rented homes Urban/Suburban







ACCII Targets EV Share



Electric Vehicle Research Center