

Outline

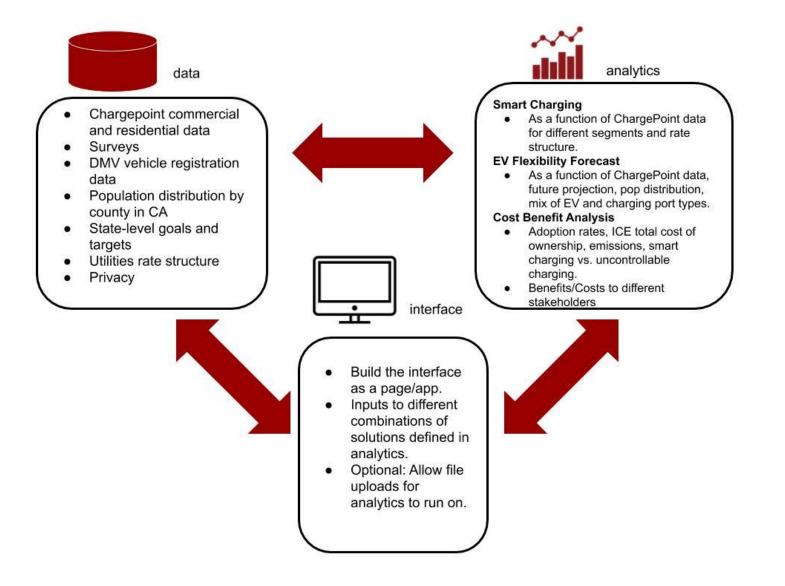


- Overview
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Overview: Goals

- Develop a predictive smart charging framework for EVs that considers future travel plans of drivers and various power system conditions.
- Perform a cost-benefit analysis for investment in charging infrastructure considering various future scenarios.
- Develop SCRIPT, a comprehensive tool that integrates the above elements and can be used by stakeholders to make decisions pertaining to new investments in charging infrastructure.

Overview: Approach

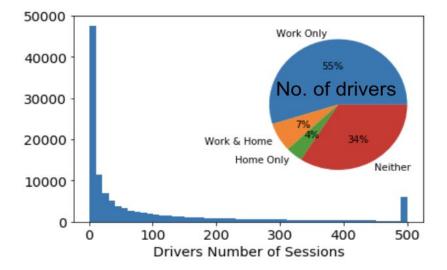


Data: General Statistics

Education Multifamily Commercial 1.0 1.0 -10 Multifamily Home Service Fleet Government (Fed, State) Healthcare 0.8 Parking 0.8 0.8 Workplace malized Pow 0.6 0.6 04 0.4 ____ Hospitality 0.2 0.2 Municipal — Parks and Recreation 0.2 Retail 0.0 Fast 10 15 20 15 20 Hour Hour Hour

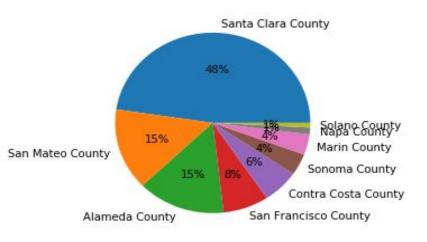
Clustered Segments

Driver's Statistics by Segment and # of Sessions



- General Statistics
 - 6.09mn sessions (2015-2019): 4.2mn from workplace, 521k residential single family, 148k multifamily, remaining from retail and public
 - 119k unique drivers
 - 9 counties

Driver's Home County





Analytics: Smart Charging Approach

Uncontrolled load [kW] χ γ K] 900 300 Controlled I 20 15 10 15 10 20 0 0 Time of day [h] Time of day [h] San Mateo - PGEe19 San Mateo - PGEcev controlled load Power (kW) Power (kW) uncontrolled load 4009 AOOF

ROOK

00:00 02:30 05:00 07:30 10:00 12:30 15:00 17:30 20:00 22:30 Time

 Data-driven method to model charging control to drastically reduce computational time

SLAC

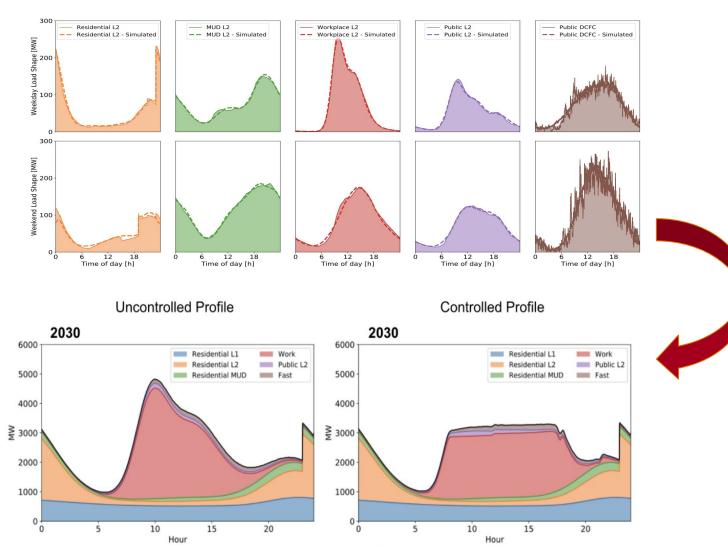
- Learn a mapping function **F** that given an uncontrollable profile generates a controllable one given an objective (e.g. rate structure, capacity limit etc).
- Benefits of proposed approach
 - Speed in estimation of controlled EV load profile
 - Scalability to millions of vehicles

YOOS

YOOt

200x

Analytics: Forecasting Approach



EV load profiles from statistics and original data in different charging segments

• Statistical modeling framework for EV load profile generation.

- Multiple inputs can be changed:
 - Aggregation Level
 - Number of EVs
 - Charging Segment Percentage
 - Battery Capacity
 - Control
 - Day Type
- Benefits of the proposed approach
 - Models can be stored and shared without any individual driver information
 - Scenarios can be generated targeting particular use cases, e.g. predominance of a charging segment etc

Analytics: Cost-Benefit Analysis

CV HEV BEV100 PHEV10 PHEV20 PHEV40

Key Inputs CBA Results Utility Marginal Net Benefits from Ratepayer Perspective, Light-duty EVs added 2018 - 2035 **EV Load Shapes Utility Rates** Costs \$2,000 \$1,800 \$1,030 \$1,600 San Mateo - PGEe19 \$1,400 Power (kW) \$1,200 </(\$ \$1,000 (2018 \$800 \$600 VPV \$400 \$200 \$0 Cost Benefit Electricity supply cost to serve EVs Utility bills paid by EV drivers 00:00 02:30 05:00 07:30 10:00 12:30 15:00 17:30 20:00 22:30 Time Costs and benefits from **EV Adoption** different stakeholder **Emissions Gas Prices Forecasts** perspectives (EV owners, ratepayers, and region LDV Population by Vehicle Type (state/county)) Compare results for smart charging versus unmanaged charging scenarios, to see value of smart charging 10 18 88

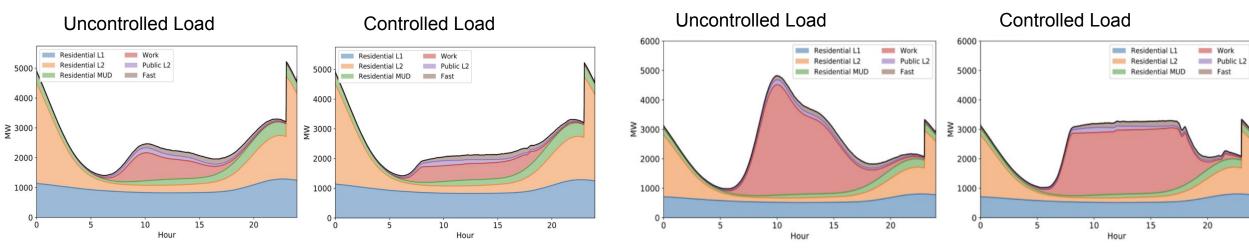
SLAC

Segment Split as % of Drivers Geographic Adoption: Number of Drivers Distribution (Res, Work, Pub L2, Pub DCFC) Base Case 2025: 1.5 mn Current dist x (80, 10, 5, 5)2030: 5 mn Population dist Low Adoption 2025: 1 mn As in Base Case As in Base Case 2030: 1.5 mn **High Adoption** 2025: 5 mn As in Base Case As in Base Case 2030: 20 mn Fast-Public As in Base Case As in Base Case (50, 10, 20, 20)Work-Public As in Base Case As in Base Case (60, 15, 15, 5)Work As in Base Case As in Base Case (50, 40, 5, 5)As in Base Case As in Base Case Equity By Population

Scenarios Analyzed

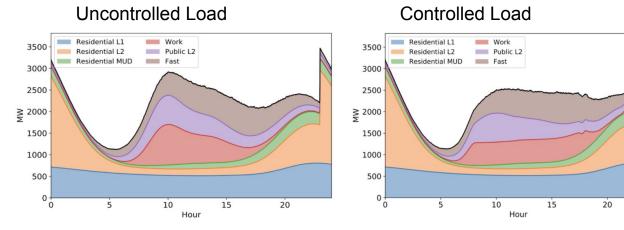
- Base Case, High Adoption, Low Adoption and Equity scenarios all rely heavily on the residential segment to meet the needs of growing EV adoption
- Fast-Public scenario presents a good tradeoff between residential and non-residential charging throughout the day.
- Work scenario significantly increases the EV load during the middle of the day which is beneficial to confront solar over generation. EV load management and coordination is simpler to implement.

Project Results and Insights: Scenarios



Base Case Scenario

Fast-Public



Work Scenario

- Assessment included the societal (TRC), ratepayer (RIM), and EV driver (PTC) perspectives
 - TRC: state as a whole, and each county, benefit overall from EV charging indicating that policymakers should continue efforts to spur EV adoption and bring benefits to California and its counties.

- RIM: all utility ratepayers who do not have EVs may still benefit from broader EV adoption: EV charging brings in additional utility revenue that outweighs the electricity supply costs, thus putting downward pressure on rates over time.
- PTC: EV drivers benefit from their choice to adopt an EV, with lower lifetime costs compared to conventional vehicles.
- Differences in benefits using smart-charging compared to not using it are minimal (~ \$100 per EV lifetime) for all stakeholders perspectives. EV owners increase benefit and ratepayers and state has slightly decrease in benefits.

- Flexibility in generating future EV demand across different charging segments can help inform utilities where to target investments.
- Understanding how EV load profiles change given a rate structure can help utilities design more appropriate rate structures to target specific segments of customers to shape the load to support grid operation.
- Increase adoption of EVs will financially benefit entire state/county, all ratepayers and EV owners.
- If charging continues to predominantly happen in the residential sector major upgrades in infrastructure will need to happen in different levels which may include both medium and low voltage systems, transformers, lines, and residential panels.
- Workplace charging is better suited for smart-charging than other segments.
- Large EV charging datasets are not widely available to research community.
- Difficult to obtain dataset that is heterogeneous and include multiple EVSE vendors and/or EV data.
- Lack of communication standards and data schema makes it difficult to obtain complete visibility of the system.