



Energy Technologies Area

Lawrence Berkeley National Laboratory

# Integrated Systems Modeling of the Interactions between Stationary Hydrogen, Vehicles, and Grid Resources

Department of Energy Annual Merit Review  
for Fuel Cell Research

Washington, D.C.  
April 30, 2019

**PI:** Samveg Saxena  
**Presenter:** Jeff Greenblatt

Project ID #  
**TA021**

## Team:

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**NREL:** Joshua Eichman, Matteo Muratori, Omar J. Guerra

**INL:** Anudeep Medam

## Timeline

- Project Start Date: June 1, 2016
- Project End Date: Sept. 30, 2019
- Percent complete: 85%

## Budget

- FY18 DOE funding received: \$0k
- Planned FY19 DOE funding: \$325k
- Total funding received to date: \$1,650k

## Barriers Addressed

- The extent to which **hydrogen** (H<sub>2</sub>) can simultaneously provide **sustainable mobility solutions and support the electric grid** remains unclear.
- The role of **H<sub>2</sub> production plants in facilitating renewable energy integration** remain unclear.

## Partners

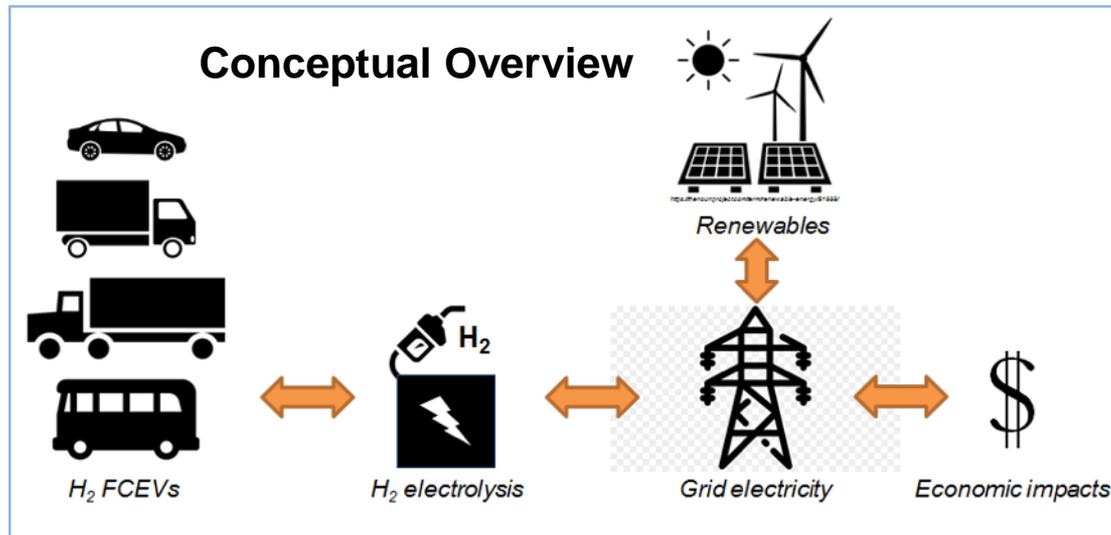


# Relevance: Integrated H<sub>2</sub> Systems for Transportation and Grid Support



## Project objectives:

- **Develop an integrated modeling capability (“H2VGI Model”)** to quantify the interactions between stationary H<sub>2</sub> generation, fuel cell vehicles, and grid support resources
- **Quantify potential grid support** from flexible H<sub>2</sub> production
- **Optimize the system configuration** and operating strategy for grid-integrated H<sub>2</sub> systems
- **Assess ability to support integration** of renewable generation
- **In FY19, focus on economic grid benefits** by exploring the value of adding medium- and heavy-duty HFCVs and more renewables

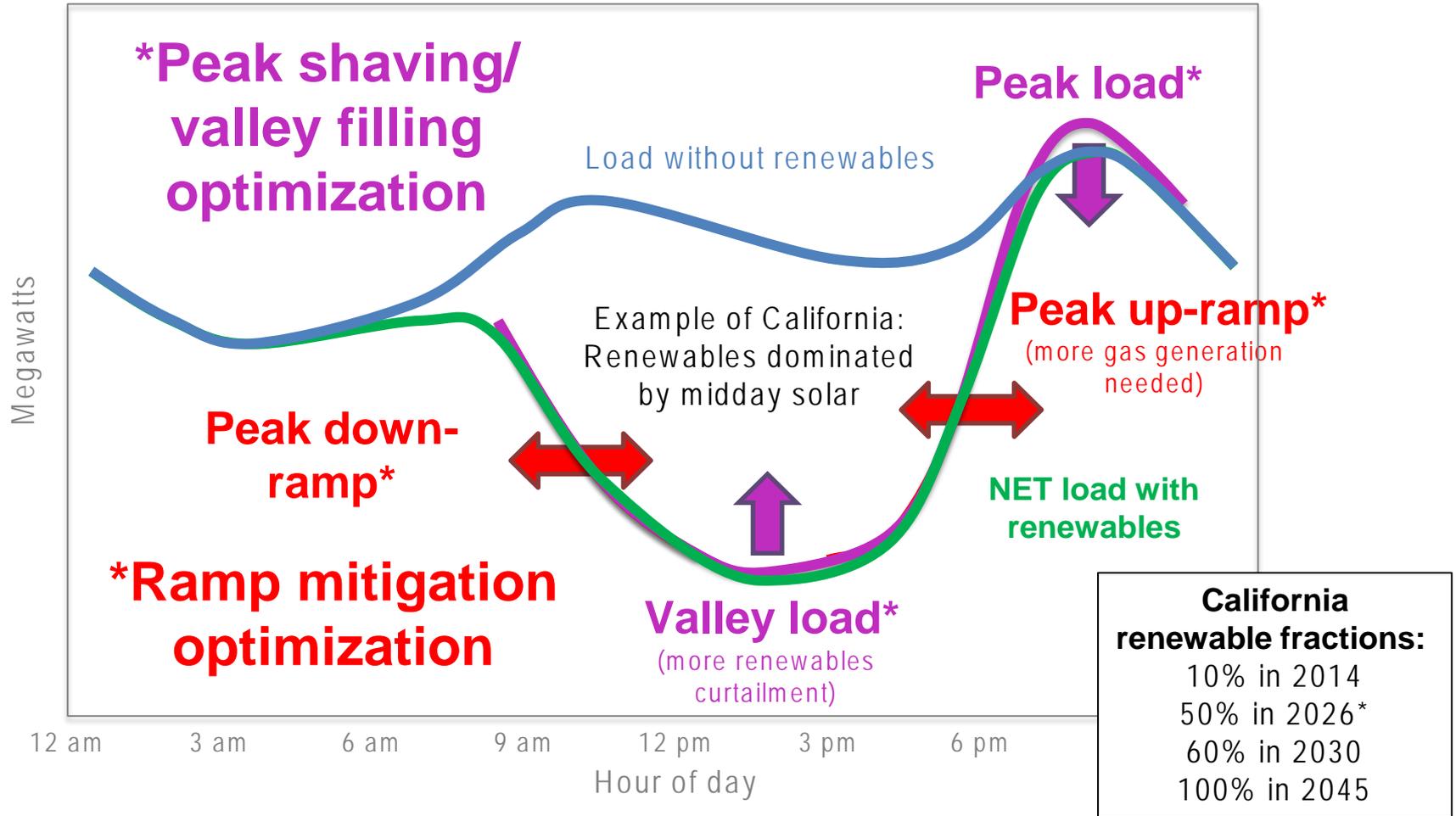


We have developed end-to-end modeling across H<sub>2</sub> FCEV mobility demand, hydrogen production, grid integration with renewables, and economic impacts/opportunities

# Relevance: Renewable Integration Challenge in California



Four important problems highlighted by the daily load or “Duck” curve:



\*50% by 2020 on track in 3 IOUs—several yrs. ahead!

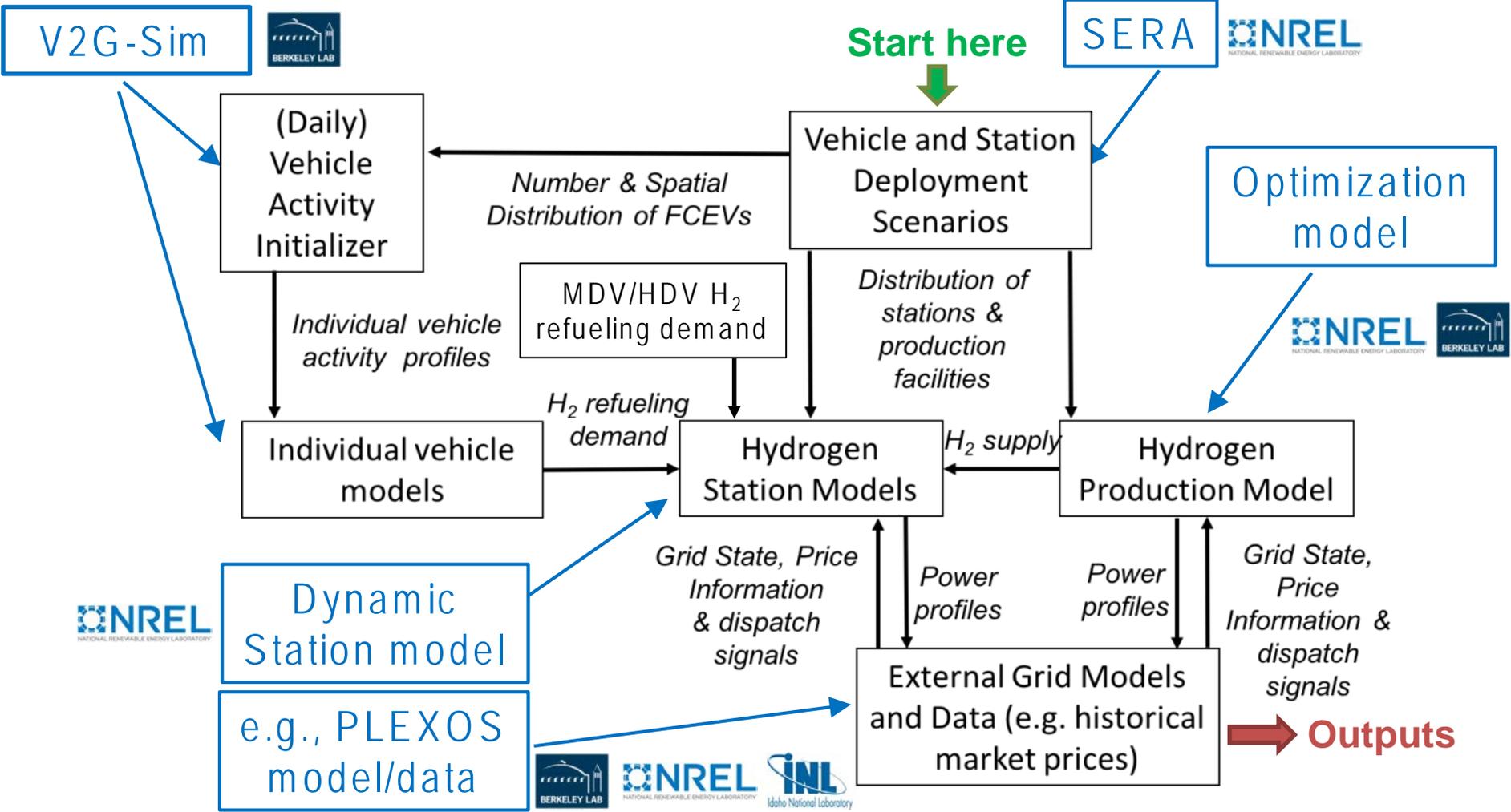
# Relevance: Stakeholders Benefits



Stakeholder	Benefits explored in this project	H2VGI role
Policy makers	Understand co-benefits of investment in H <sub>2</sub> and grid infrastructure	Support decision making
Automotive	Assess opportunities for system integration and low-cost fuel	Support value proposition
Researchers	Open-source toolset	Tool to explore case studies
H <sub>2</sub> station owners	Design of grid-integrated H <sub>2</sub> refueling stations	Quantify value of H <sub>2</sub> (additional revenues)

The proposed H2VGI model provides techno-economic analysis and decision-making support that benefits multiple industry groups and policy-making stakeholders

# Approach: H2VGI Model Structure



The H2VGI model integrates multiple operational and deployment models for FCEVs and H<sub>2</sub> generation resources with external grid models across various time scales

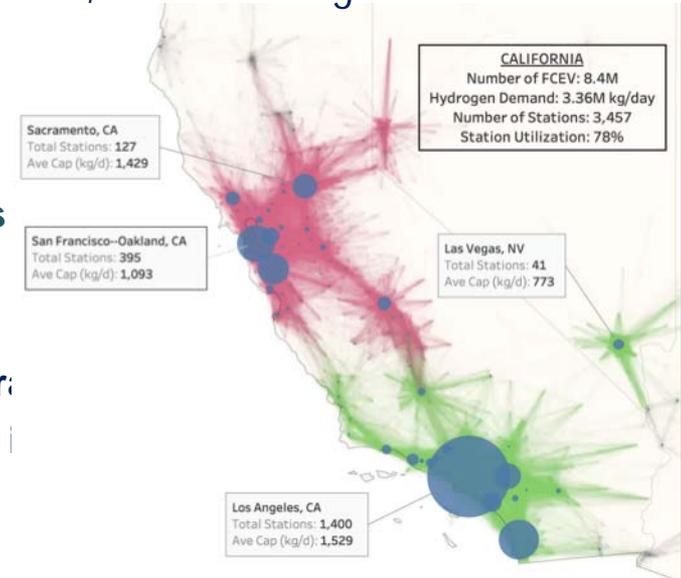
# Approach: SERA model for H<sub>2</sub> refueling station deployment and exploration of central vs. distributed H<sub>2</sub> production



\*SERA: Scenario Evaluation, Regionalization & Analysis

The SERA\* model is used to generate **self-consistent FCEV adoption and H<sub>2</sub> demand scenarios**, considering:

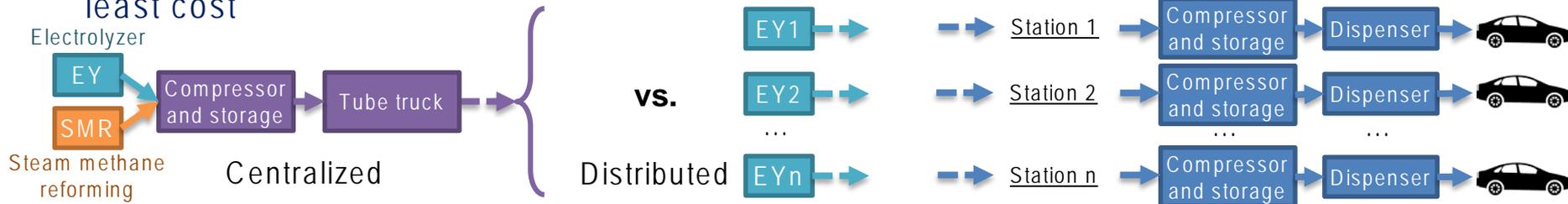
- Geospatially and temporally resolved vehicle adoption in each Urban Area in California based on demographics and early adopters metrics
- Annual empirically-based vehicle miles
- FCEV fuel economy improvement
- Vehicle stock turnover



Stations are sized and placed geographically to maximize cover  
 Distributions of fueling stations evolve over time as H<sub>2</sub> demand i

## Central vs. distributed H<sub>2</sub> production

- Scenario analysis in SERA used to examine alternative approaches for H<sub>2</sub> production at least cost



SERA provides annual FCEV adoption, H<sub>2</sub> demand scenarios, and strategic fueling station placement

# Approach: V2G-Sim and hydrogen demand (LDV example)



17,000 CA vehicles

NHTS data

UDDS

US06

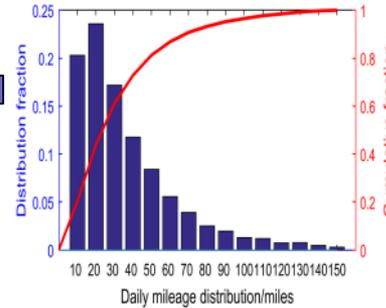
HWFET

Typical Cycles

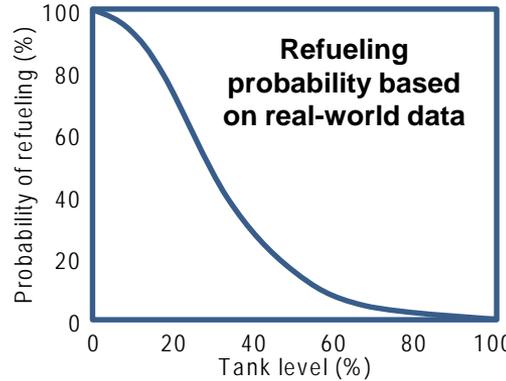
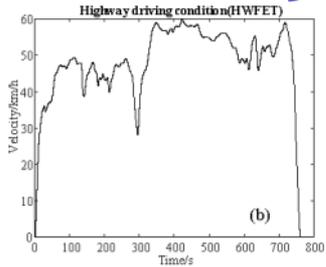
Vehicle Model

H<sub>2</sub> consumption array (from SERA)

PLEXOS input for LDVs

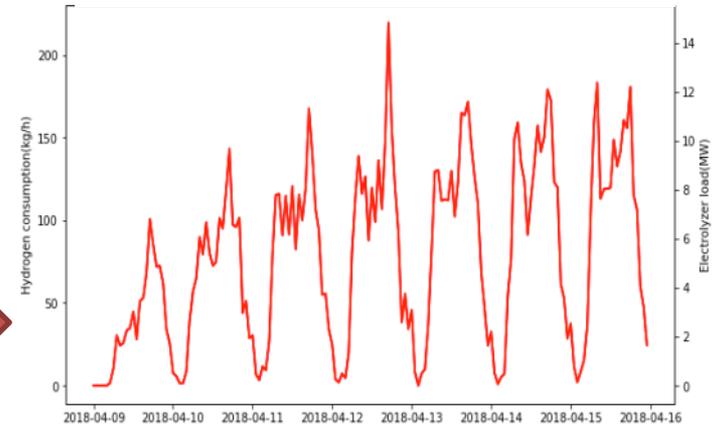


VehicleID	State	Start time (h)	End time (h)	Distance (r)	Nothing	P_max (W)	Location	NHTS HH Wt
1	Charging	0	12.08333	-1		1440	Home	208.5930918
1	Driving	12.08333	12.41667	2		-1		208.5930918
1	Parked	12.41667	14	-1		-1	Shopping/T	208.5930918
1	Driving	14	14.33333	2		-1		208.5930918
1	Charging	14.33333	24	-1		1440	Home	208.5930918
2	Charging	0	7.3	-1		1440	Home	229.8390097
2	Driving	7.3	7.483333	11		-1		229.8390097
2	Parked	7.483333	7.5	-1		-1	School/Chi	229.8390097
2	Driving	7.5	7.75	11		-1		229.8390097
2	Charging	7.75	9	-1		1440	Home	229.8390097
2	Driving	9	9.25	15		-1		229.8390097
2	Parked	9.25	9.333333	-1		-1	School/Chi	229.8390097
2	Driving	9.333333	9.833333	20		-1		229.8390097
2	Parked	9.833333	10.5	-1		-1	Medical/Di	229.8390097



(from National Fuel Cell Technology Evaluation Center)

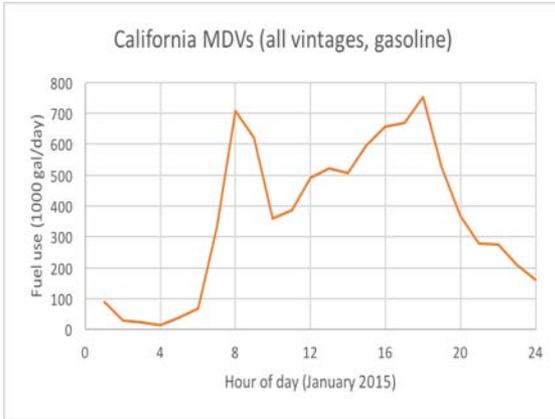
Simulated H<sub>2</sub> refueling profile over 7 days



# Approach: Algorithm for MDV/HDV sectors

## 1. Hydrogen fuel demands

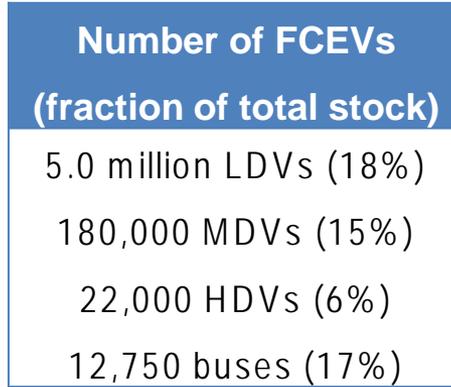
(Non-LDV data from EMFAC)



*Generate probabilistic simulations from aggregate data*

## 2. HFCV scenarios

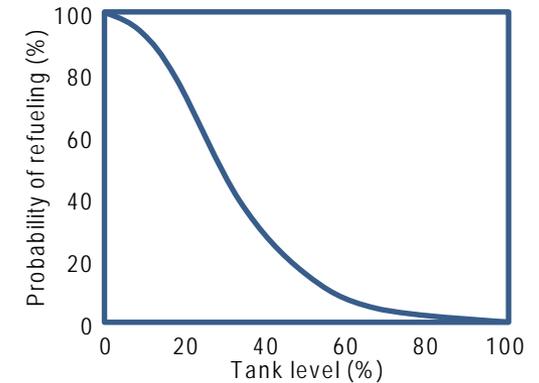
(Synthesis from CA modelers)



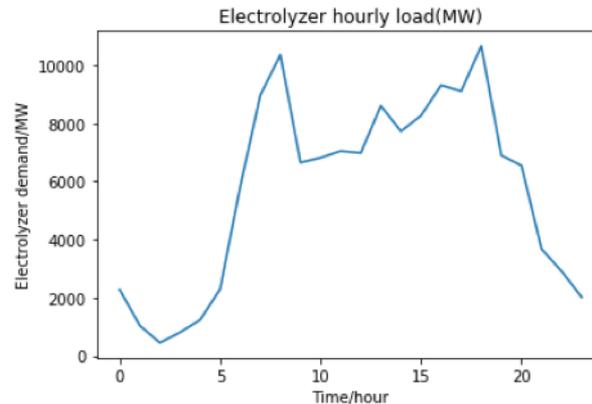
*For 2030 reference year*

## 3. Refueling algorithms

- MDVs and buses: End of shift
- HDVs: refueling probability similar to LDVs (fuel tank level)



## 4. H<sub>2</sub> electrolyzer demand

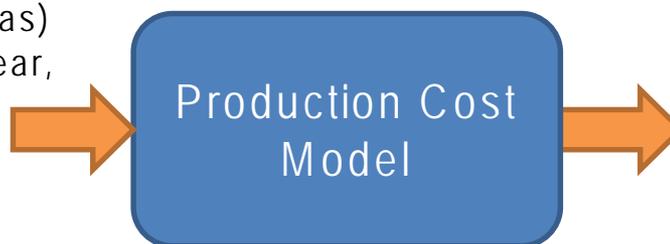


PLEXOS inputs for MDVs/HDVs

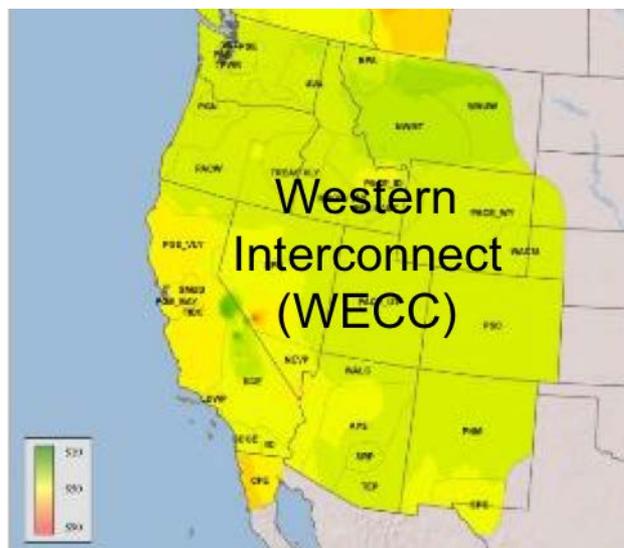
# Approach: Integrate Flexible H<sub>2</sub> Generation into the PLEXOS Integrated Energy Production Cost Model

- PLEXOS is a commercially-available, electricity system economic simulation tool that can help researchers understand issues associated with intermittent renewables integration, and novel storage technologies such as H<sub>2</sub> generation

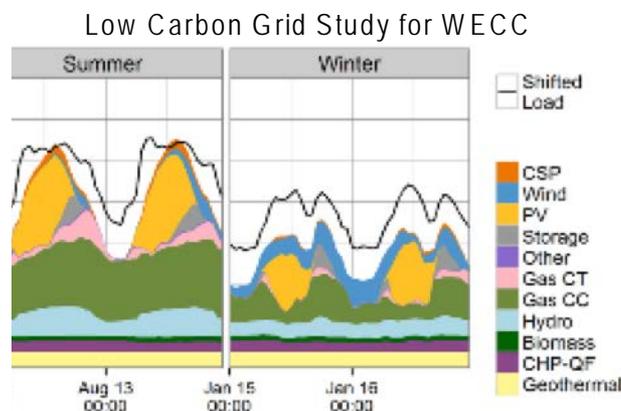
- Transmission Network (electric and gas)
- Generator properties (coal, gas, nuclear, renewables, electric storage, etc.)
- Load requirements
- Reliability requirements
- Other System Constraints



- Generator operation
- Production cost
- Fuel use
- Emissions
- Imports & Exports
- Load served
- Energy and AS Prices



*(other U.S. regions as well as international grids also available)*



## Key Features:

- Unit commitment and economic dispatch at multiple nodes/zones
- DC power flow modeling
- Time step of  $\geq 5$  minutes
- Models variety of ancillary services, market horizons, and forecast windows
- Stochastic optimization available

# Accomplishments and Progress: Key Research Activities & Questions

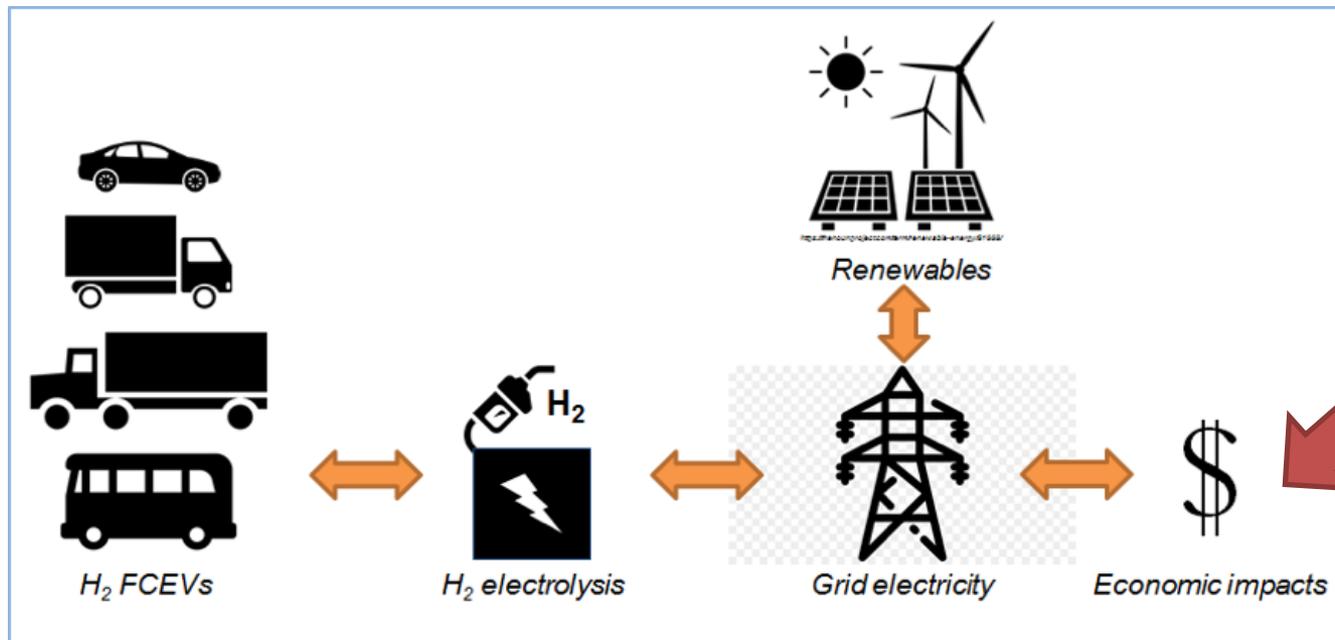


1. How do **centralized vs. distributed** hydrogen production costs compare?
2. What is the technical **potential for renewables integration** with hydrogen mobility at the system level (H<sub>2</sub>-California Duck Curve study)?
3. What is the **economic potential** of hydrogen systems to provide grid support (PLEXOS production cost model with load-balancing, ramping, flexibility)
4. How does increased demand for hydrogen from **medium- and heavy-duty vehicles** (including buses) change the economic benefits?
5. How do **higher renewable penetrations** affect the economic benefits?

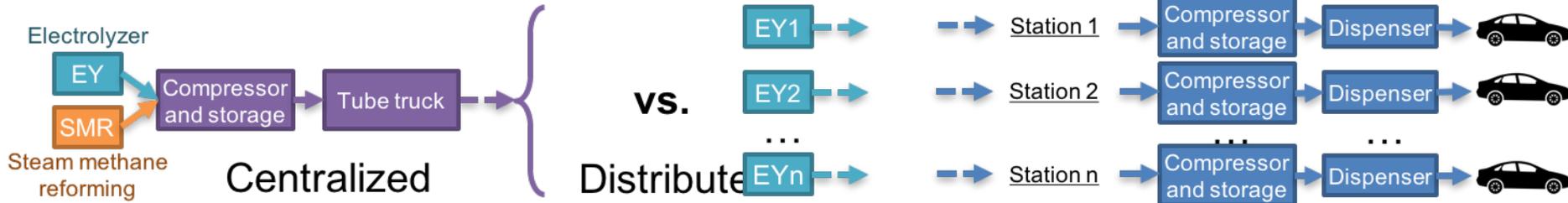
# Accomplishments and Progress: FY19 Milestones



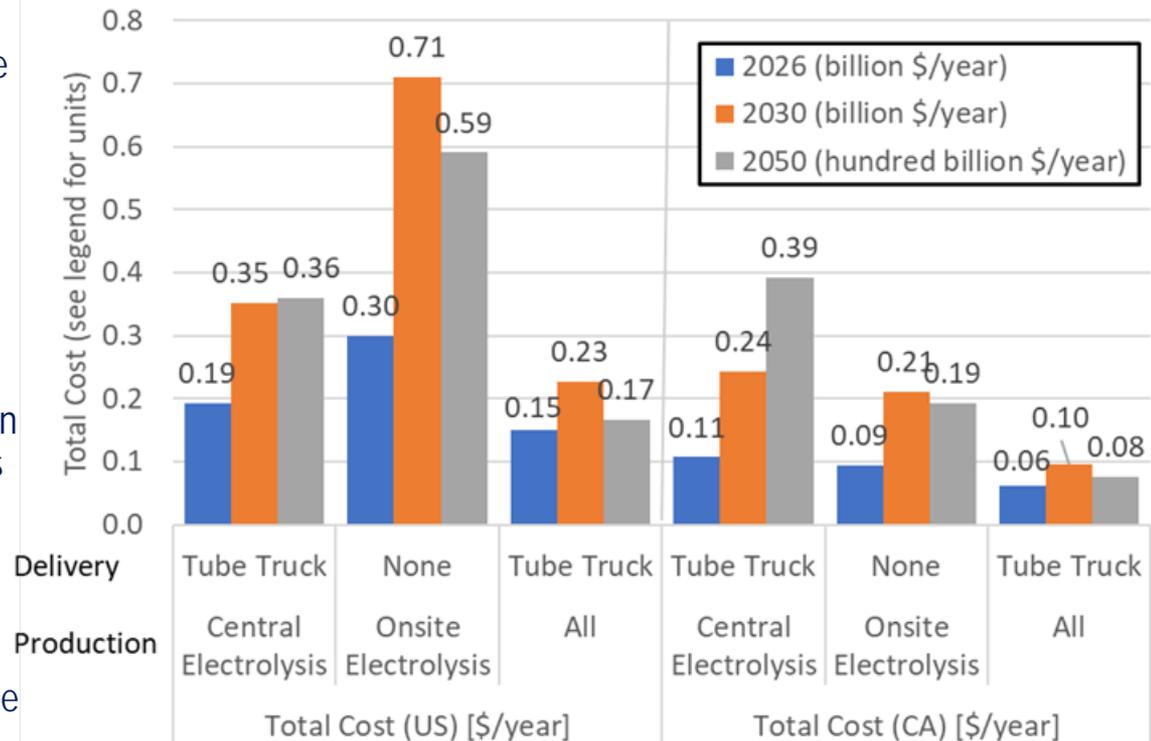
<b>Q1</b>	<ul style="list-style-type: none"><li>• Develop California scenarios of light-, medium- and heavy-duty FCEV penetrations in 2030</li></ul>
<b>Q2</b>	<ul style="list-style-type: none"><li>• Estimate H<sub>2</sub> demand and production loads for light-, medium- and heavy-duty FCEVs</li><li>• Implement scenarios in PLEXOS to quantify economic opportunities for grid services</li></ul>
<b>Q3</b>	<ul style="list-style-type: none"><li>• Generate results across a range of parameter sensitivity scenarios, including higher fractions of intermittent renewables</li><li>• Compare the relative economic benefits and renewables integration opportunities across the FCEV adoption scenarios</li></ul>
<b>Q4</b>	<ul style="list-style-type: none"><li>• Synthesize and disseminate results</li></ul>



# Accomplishments and Progress: Central vs. distributed H<sub>2</sub> comparison



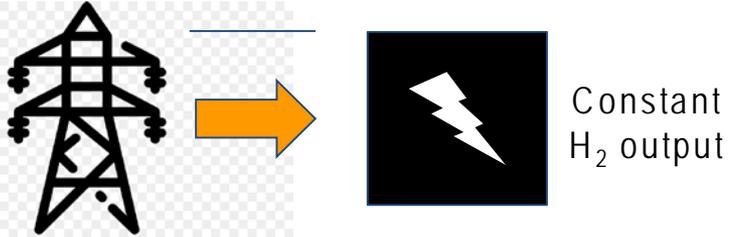
- Hydrogen infrastructure scenarios are compared for California and the U.S. using the SERA model
- Technology Scenarios include
  - Central Electrolysis
  - Onsite Electrolysis
  - All production technologies: central and onsite electrolysis; central, onsite and existing natural gas reforming)
- Allowing "All" technologies results in the lowest cost, driven by low costs for natural gas reforming
- For electrolysis cases, central is preferred for the U.S., while onsite is preferred for CA.
- Electrolysis results are driven by the delivery costs



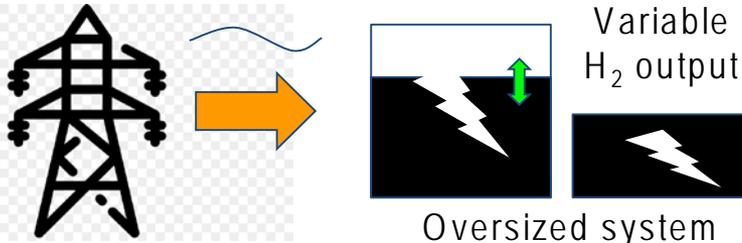
# Accomplishments and Progress: Electrolyzer H<sub>2</sub> generation can support greater renewable integration by reducing ramp rates



2025 California Net Load Impact for 5 FCEV Scenarios - Ramp Up Rates are restored to 2014 levels with Flexible Electrolyzer Generation for 0.8-1.5M FCEVs



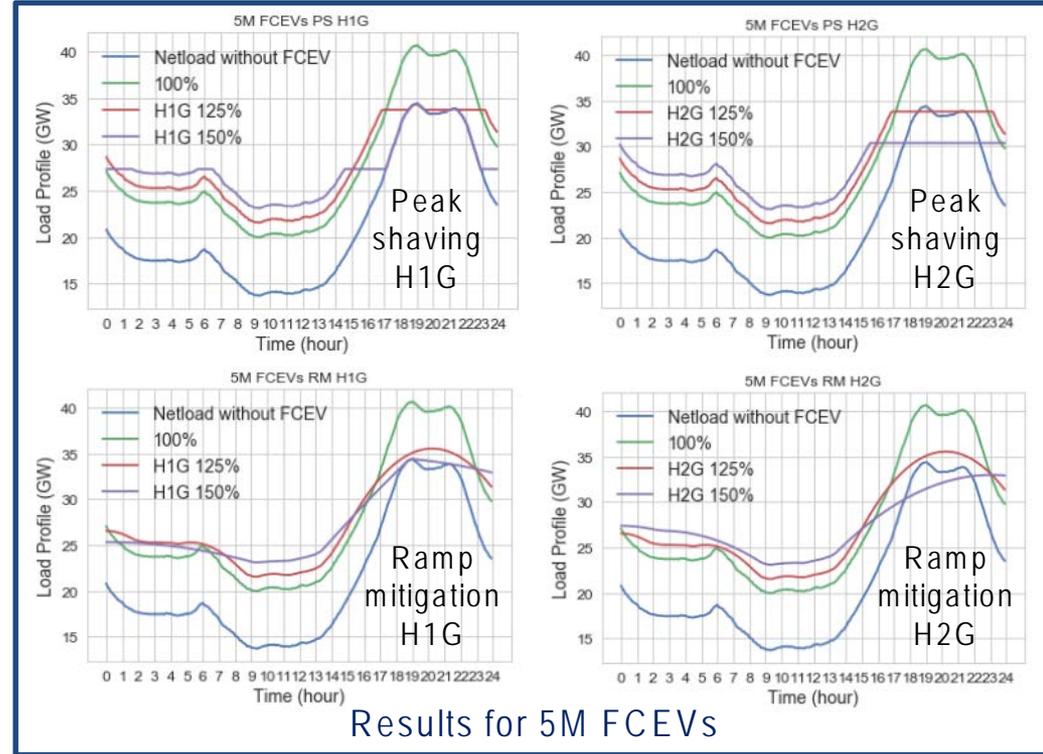
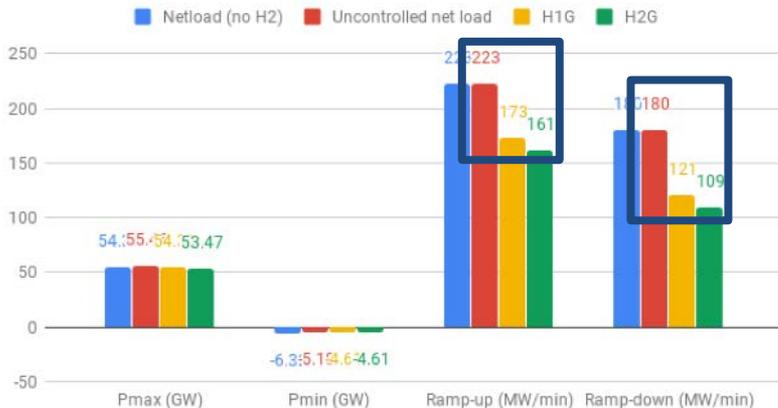
100% electrolyzer capacity



Oversized system

150% electrolyzer capacity

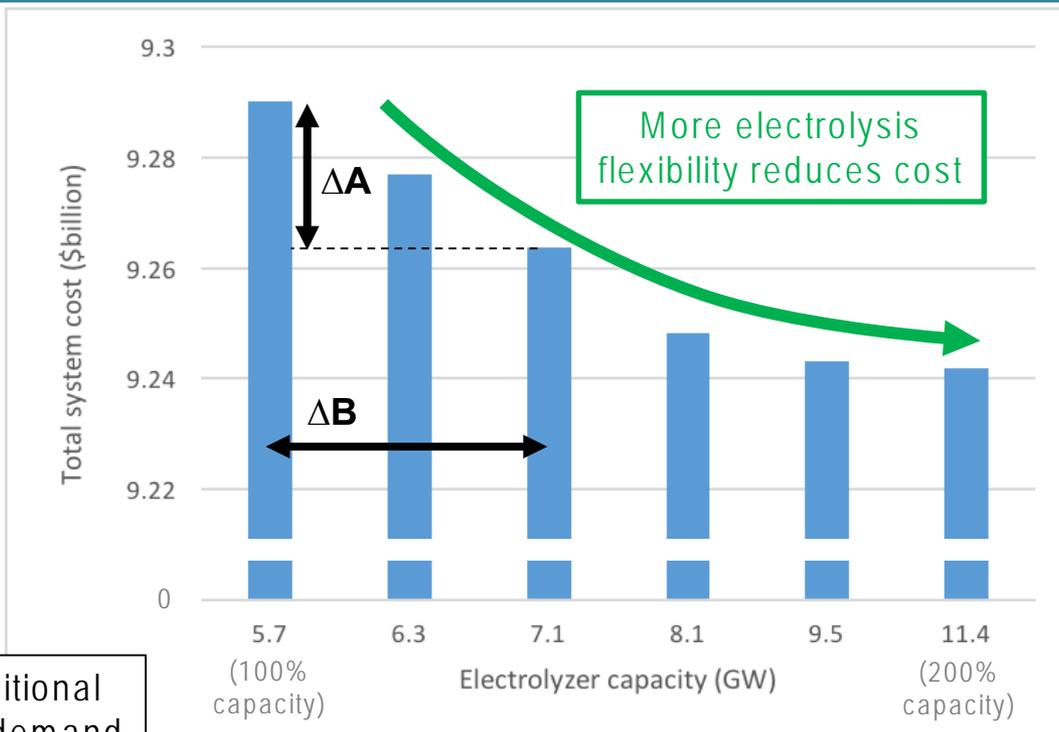
1.5M FCEVs with 150% electrolyzer capacity



## Summary results

- FCEVs can provide peak shaving/valley filling and ramp mitigation benefits, but **ramp mitigation benefits have much larger proportional reductions**
- Ramp-up rates in 2025 can be reduced to 2014 levels** at 800k-1.5M FCEVs and 125-150% electrolyzer capacity
- Ramp-up rates can be reduced to ~zero** at 10M FCEVs and 150% capacity
- H1G alone can deliver sizable benefits**, though H2G enhances impacts

# Accomplishments and Progress: Economic benefits of hydrogen electrolysis on California grids



3.1% additional electricity demand due to H<sub>2</sub>

$$\frac{\Delta A}{\Delta B} = \frac{\text{cost savings}}{\text{amt. of flexibility}}$$

■ LDVs + limited number of MDVs/HDVs

**Expanded FCEV scenario for California**

5.0 million LDVs (18%)  
 180,000 MDVs (15%)  
 22,000 HDVs (6%)  
 12,750 buses (17%)

*(work in progress)*

## Key takeaways:

- While differences in cost are small, we observe a clear trend of decreasing electricity cost with increasing H<sub>2</sub> electrolyzer capacity, due to time-of-day flexibility in when electrolyzer can run
- We expect this decrease to be more pronounced with greater H<sub>2</sub> demand, and increased amounts of renewables on the grid; *we are currently working on modeling these scenarios*

# Accomplishments and Progress: Responses to Previous Year Reviewers' Comments

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## Summary feedback:

- Provide more impact and validation of assumptions
    - Updated net load study to technical potential levels with higher FCEV adoption
  - Too much focus on modeling
    - We have placed more emphasis on results for this AMR
  - Insufficient vetting by industry
    - We held two stakeholder webinars in FY18 to solicit feedback from industry on approach and results, which, among other things, motivated us to consider vehicles beyond light-duty
  - More sensitivity analysis of electrolyzer capital cost vs. capacity
    - We have completed most of the work for this, and our final report will convert electrolyzer capacities into capital costs to arrive at total cost impacts of refueling H<sub>2</sub> FCEVs
  - Case studies could be more targeted to real-world problems
    - We have developed a set of potential future FCEV scenarios that reflect the realistic impacts of flexible H<sub>2</sub> electrolysis on grid operations, including addition of MDVs/HDVs (especially buses)
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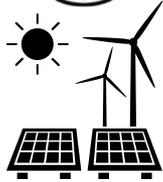
Partner	Type	Role	Project Roles
	National Lab	Sub (Within FCTO)	<b>Lead hydrogen vehicle and station deployment scenarios and station modeling; co-lead model integration, and case study modeling; support grid services valuation</b>
	National Lab	Sub (Within FCTO)	<b>Co-lead dispatch controller development for grid services; and tie-in to FCTO-TV031 project below</b>
	Industry/ Research	Sub (Outside FCTO)	<b>Provide strategic direction; contribute to research, writing, data analysis, simulation and modeling</b>

## Related Projects

1. Dynamic Modeling and Validation of Electrolyzers in Real Time Grid Simulation (FCTO-TV031, INL lead)

- Currently **low adoption rates of FCEVs** will reduce the potential grid benefits of dispatchable H<sub>2</sub> electrolysis
  - We included MDV/HDV FCEVs that have higher near-term adoption rates; as nascent FCEV markets grow, costs will fall, stimulating greater adoption
- The **lack of detailed data on refueling of MDVs/ HDVs** (unlike LDVs) hampers our ability to accurately estimate hydrogen refueling demand
  - We will continue to search for new data sources of MDV/HDV H<sub>2</sub> refueling
- **Cost, performance and reliability of H<sub>2</sub> electrolyzers** and other components may diminish adoption and grid benefits
  - Electrolyzer costs and performance are expected to improve as higher volumes of this equipment are deployed globally
- **Grid markets that do not permit H<sub>2</sub> resource participation** will limit the overall value of flexible H<sub>2</sub> production
  - The market for ancillary services is expected to grow as renewable generation shares increase, allowing greater H<sub>2</sub> resource participation

## Remainder of FY19



<https://thenounproject.com/term/renewable-energy/81668>



- Perform sensitivity analyses on MDV/HDV refueling simulations, and continue to search for MDV/HDV diesel/gasoline/hydrogen refueling data
- Integrate higher renewable generation scenario of Western Interconnection into PLEXOS and run complete set of economic analyses
- Perform an economic case-study analysis of FCEV LDV+MDV+HDV scenarios in California at higher renewable penetration levels, for each of several FCEV and hydrogen electrolysis capacity levels. Compare relative economic benefits and renewable integration opportunities.
- Synthesize and disseminate results on economic opportunities for FCEVs to provide grid services within the larger AFV opportunity space. Target high-quality peer-reviewed journal publications to summarize results.

## Beyond FY19 funding



- Apply capabilities across additional scenarios, regions, BEVs, renewables, etc.

Any proposed future work is subject to change based on funding levels

## Objective

Provide an integrated modeling capability to quantify the interactions between stationary hydrogen generation, fuel cell vehicles, and grid support resources

## Relevance

Hydrogen technologies can offer a unique ability to simultaneously support both electric and transportation sectors

## Approach/Next Steps

Addition of MDV/HDV/bus hydrogen vehicles and higher renewables to model; PLEXOS economic case studies

## Technical Accomplishments

### Years 1-2 (FY16-18)

**Model development:** Full end-to-end integration of individual FCEV H<sub>2</sub> demand, H<sub>2</sub> refueling, siting of H<sub>2</sub> stations (stationary vs. distributed), simulation of H<sub>2</sub> electrolysis in external grid model PLEXOS, and economic calculations of flexible H<sub>2</sub> electrolysis completed

### **Case study results:**

- H<sub>2</sub> electrolysis driven by FCEV demands can play a substantial role in mitigating California “duck curve”
- Flexible H<sub>2</sub> electrolysis reduces power generation cost
- Distributed H<sub>2</sub> lowers cost of delivery and storage

### Year 3 (FY18-19): Model development

- PLEXOS economic grid simulations of two-way (H<sub>2</sub>G) flexible H<sub>2</sub> electrolysis cases were completed
- MDV/HDV hydrogen vehicle penetration scenarios and methodology for estimating hydrogen refueling demand have been developed
- Integration of higher renewable penetration PLEXOS model with rest of modeling framework is in progress

# Technical Back-up Slides

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# Key assumptions for H<sub>2</sub> net load study



Parameter	Values
No. of fuel cell electric vehicles (FCEVs)	200,000 – 10,000,000
Interaction modes	H1G, H2G
Net load	2016, 2025
Electrolyzer capacity	100%, 125%, 150%
Current electrolyzer conversion efficiency	67.3 kWh per kg <sup>[2]</sup>
VMT for FCEVs <sup>[3]</sup>	10,950 miles per year
MPGe for FCEVs	67 MPGe <sup>[4]</sup>

[1] Electrolyzer capacity = percentage of rated capacity relative to capacity with constant operation (oversizing)

[2] Hydrogen component validation, [https://www.hydrogen.energy.gov/pdfs/review17/tv019\\_terlip\\_2017\\_p.pdf](https://www.hydrogen.energy.gov/pdfs/review17/tv019_terlip_2017_p.pdf)

[3] VMT based on NHTS California dataset

[4] 2016 Mirai Product Information,

<https://pressroom.toyota.com/releases/2016+toyota+mirai+fuel+cell+product.download>

FCEV Adoption Scenario	Number of FCEVs in 2025	H <sub>2</sub> Production (ton/yr)	Electrolyzer Capacity (MW)		
			100%	125%	150%
1	200,000	40,150	304	380	456
2	800,000	160,600	1216	1520	1834
3	1,500,000	301,125	2280	2,848	3,418
4	5,000,000	1,003,750	7,600	9,500	11,400
5	10,000,000	2,007,500	15,200	19,000	22,800

**H1G:** Uni-directional energy flow to electrolyzer

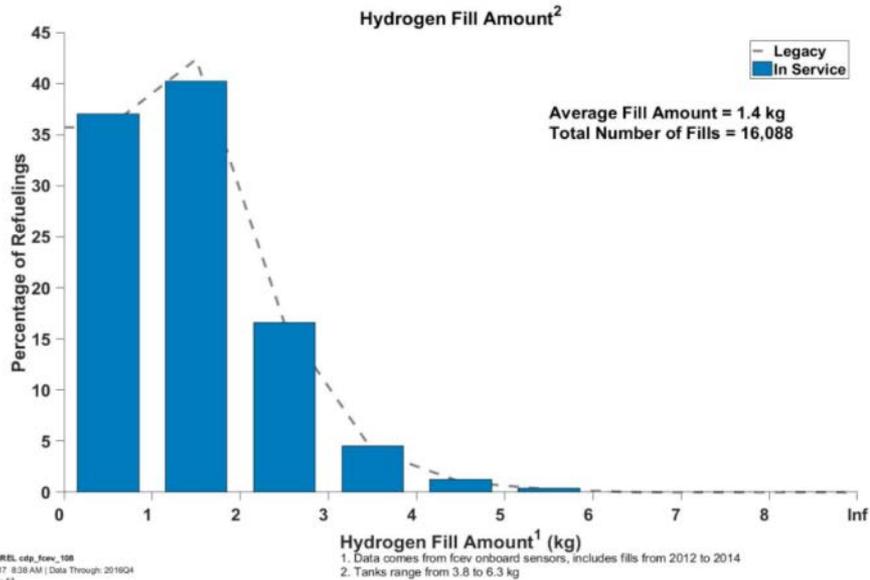
**H2G:** Reversible electrolyzer which can feed power back to grid

Amount of oversizing capacity

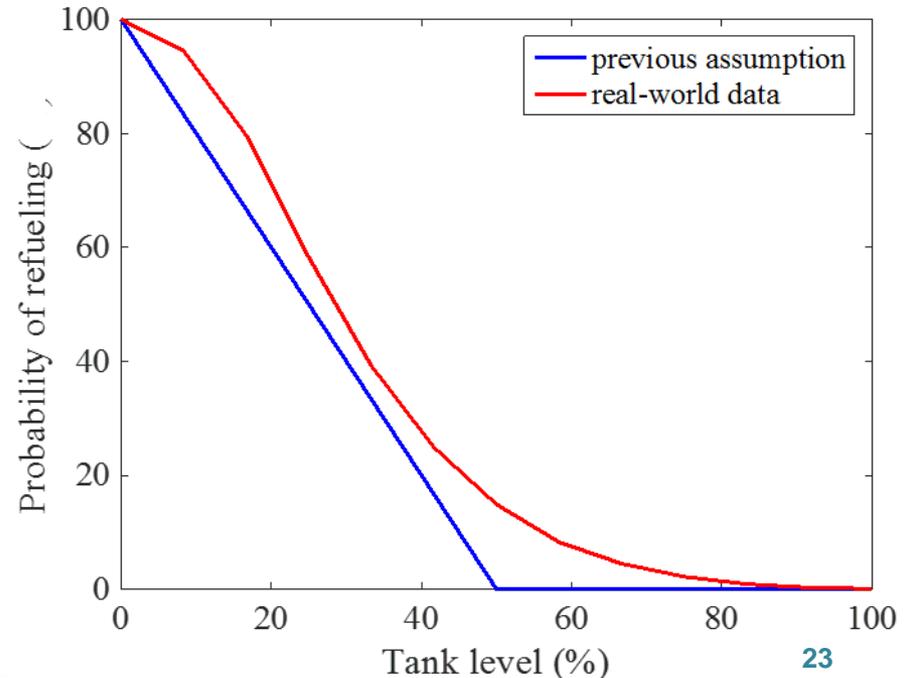
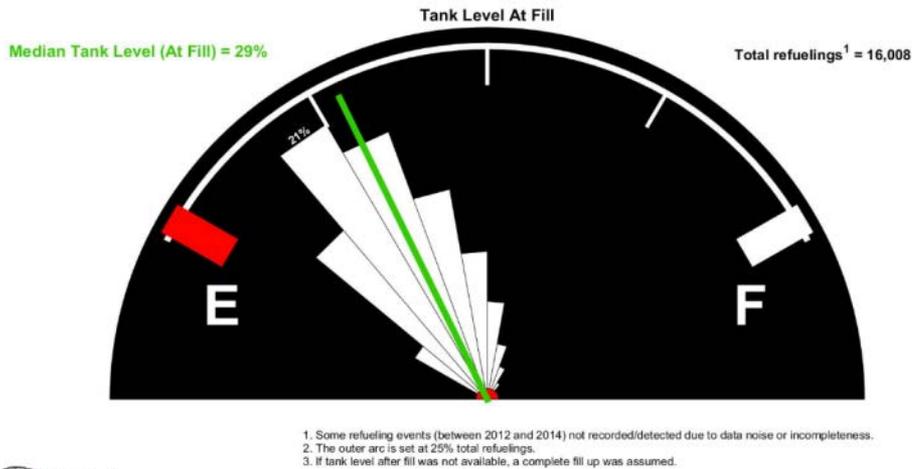
Target number of zero-emission vehicles in 2025

Target number of zero-emission vehicles in 2030

# Approach: LDV refueling model



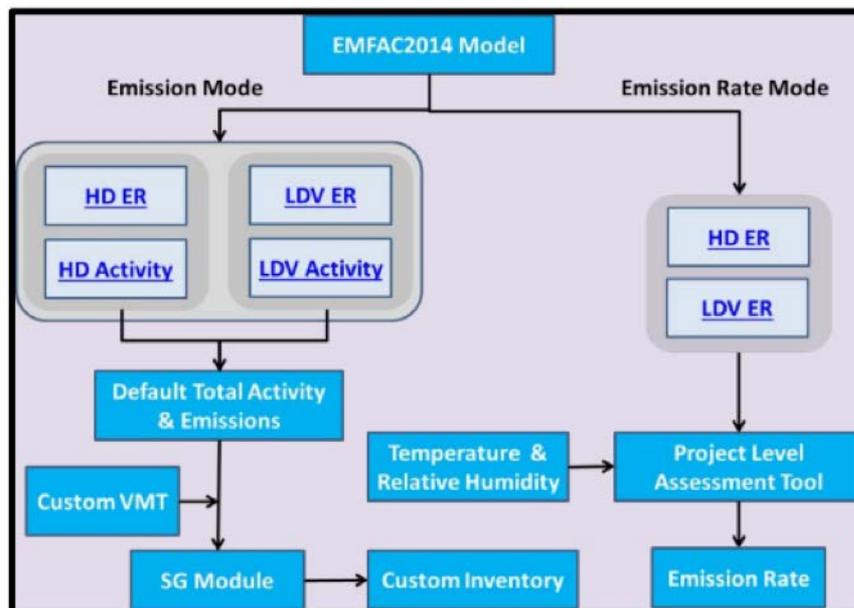
- Refine the refueling behavior model in H2VGI using the real-world data from NREL
- A preliminary refueling sub-model, which governs when individual vehicles are refueled within their travel itineraries



- **EMFAC2014 is the EPA-approved regulatory model for CA criteria pollutant emissions [1] freely available at <https://www.arb.ca.gov/emfac/>**
- EMFAC2014 has been used for state implementation plan (SIP) development and transportation conformity in California
- Continually refined inputs to EMFAC since late '90s
  - Provides VMT temporal distribution for light and heavy duty vehicles from data from metropolitan transportation organizations (MPOs) and vehicle activity data for HDV/MDV.
  - Tracks 42 vehicle types spanning light-, medium- and heavy-duty vehicles

## INPUTS

*Vehicle sales by type*  
*Fuel sales by type*  
*Regional VMT data*  
*Vehicle activity logs*  
*Veh. emissions models and testing*  
*Fuel Efficiency/Emissions policies*

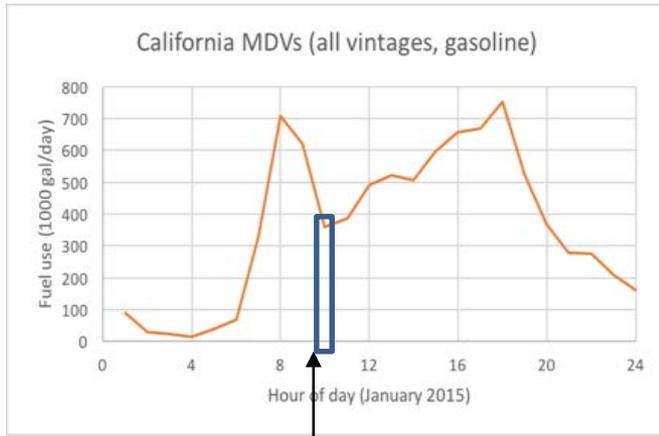


## OUTPUTS

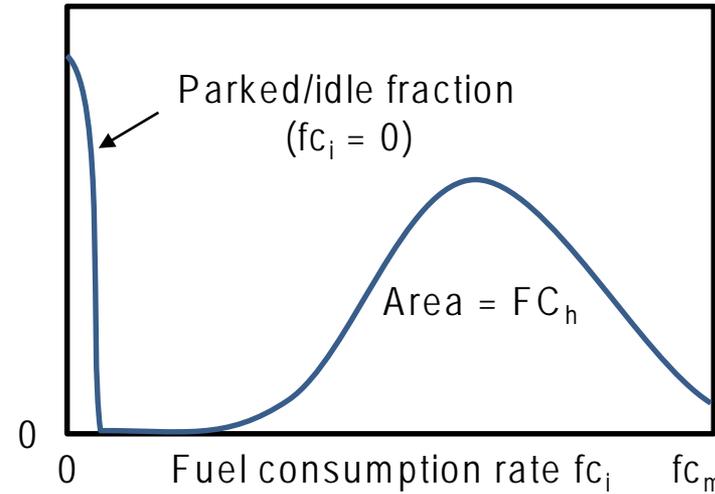
*Vehicle sales projections*  
*VMT projections by veh. type and region*  
*Emissions by veh. type and region*  
*Fuel consumption profiles by veh. type and region*

[1] <https://www.federalregister.gov/documents/2015/12/14/2015-31307/official-release-of-emfac2014-motor-vehicle-emission-factor-model-for-use-in-the-state-of-california>; [2] [https://www.arb.ca.gov/msei/emfac2014\\_nov\\_2014\\_final\\_w\\_o\\_notes.pdf](https://www.arb.ca.gov/msei/emfac2014_nov_2014_final_w_o_notes.pdf)

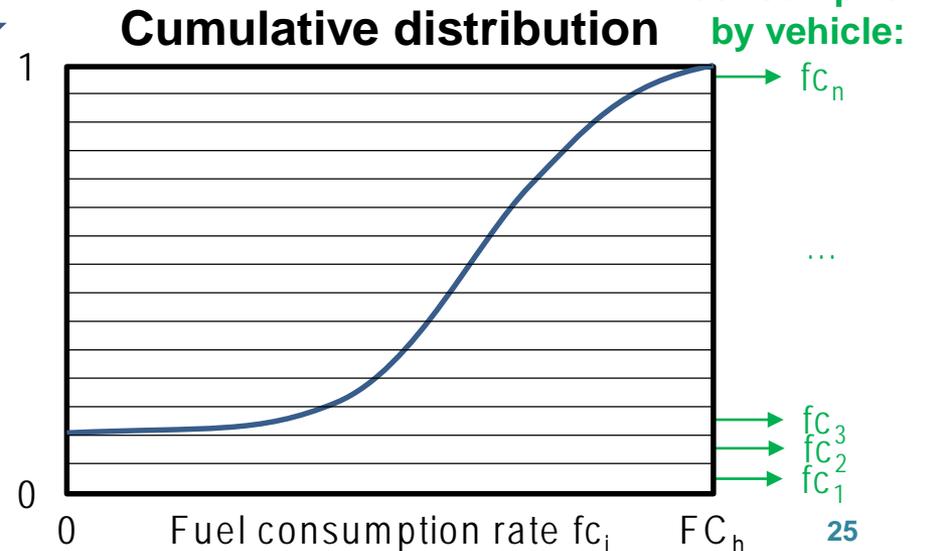
# Approach for MDVs/HDVs: Modeling distributions of fuel consumption by vehicle type



Distribution of fuel consumption rates in hour h



Probability of having a particular fuel consumption rate,  $fc_i$



Cumulative probability



Total fuel consumption in hour h =  $FC_h = \sum_{i=1}^{\# veh} fc_i$

