



Forecasting DER Adoption: Electric Grid Planning

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An aerial photograph of a residential complex. The buildings are arranged in a grid-like pattern. The roofs of several buildings are covered with dark blue solar panels. To the left, there is a multi-lane road with a green median strip. The surrounding area includes trees and other buildings. A semi-transparent black banner with white text is overlaid across the middle of the image.

The grid is decentralizing

Energy Decentralization is Growing

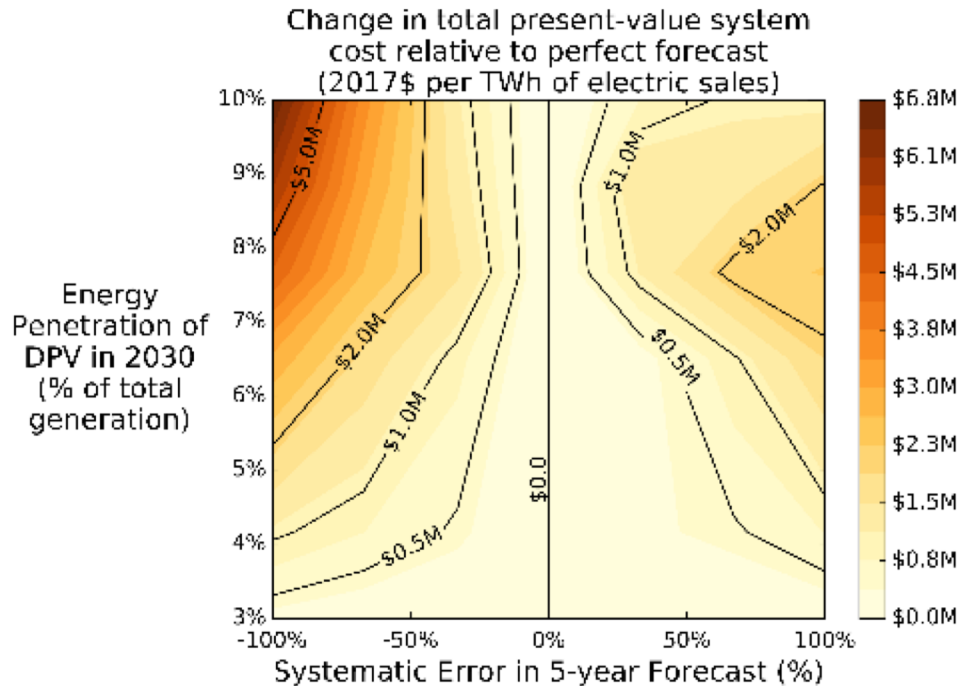
Several trends in energy decentralization:

- Distributed generation
- Rise of electric vehicles
- Price-responsive loads (e.g. demand response, smart home)
- Advanced sensors and controls

This has important electric grid planning implications:

- Forecasting net load
- Advanced Rate Design
- Distribution & Transmission Grid Integration

The Cost of Misforecasting DERs is High



System planning costs (\$/TWh) due to systematic DPV misforecast for the Western Interconnection through 2030

A recent study demonstrated the cost of mis-forecasting DPV capacity is high, with an average net present cost of **\$2.3m/TWh** of utility sales

Misforecasting costs are created by either **overbuilding** generation and T&D resources, or **underbuilding** the system leading to lower resource adequacy.

Source: *Estimating the Value of Improved Distributed Photovoltaic Adoption Forecasts for Utility Resource Planning*, NREL, May 2018 (Gagnon et al. 2018)



How do we better plan for DERs?

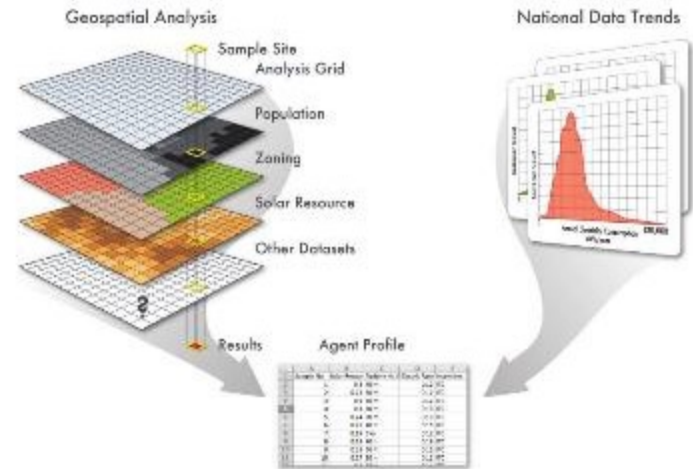
dGen: NREL's Agent-Based Model to forecast DER Adoption



1. Numer of Sample Points



2. Geographic Scale



<https://www.nrel.gov/analysis/dgen/>

Forecasting DER adoption for grid planning

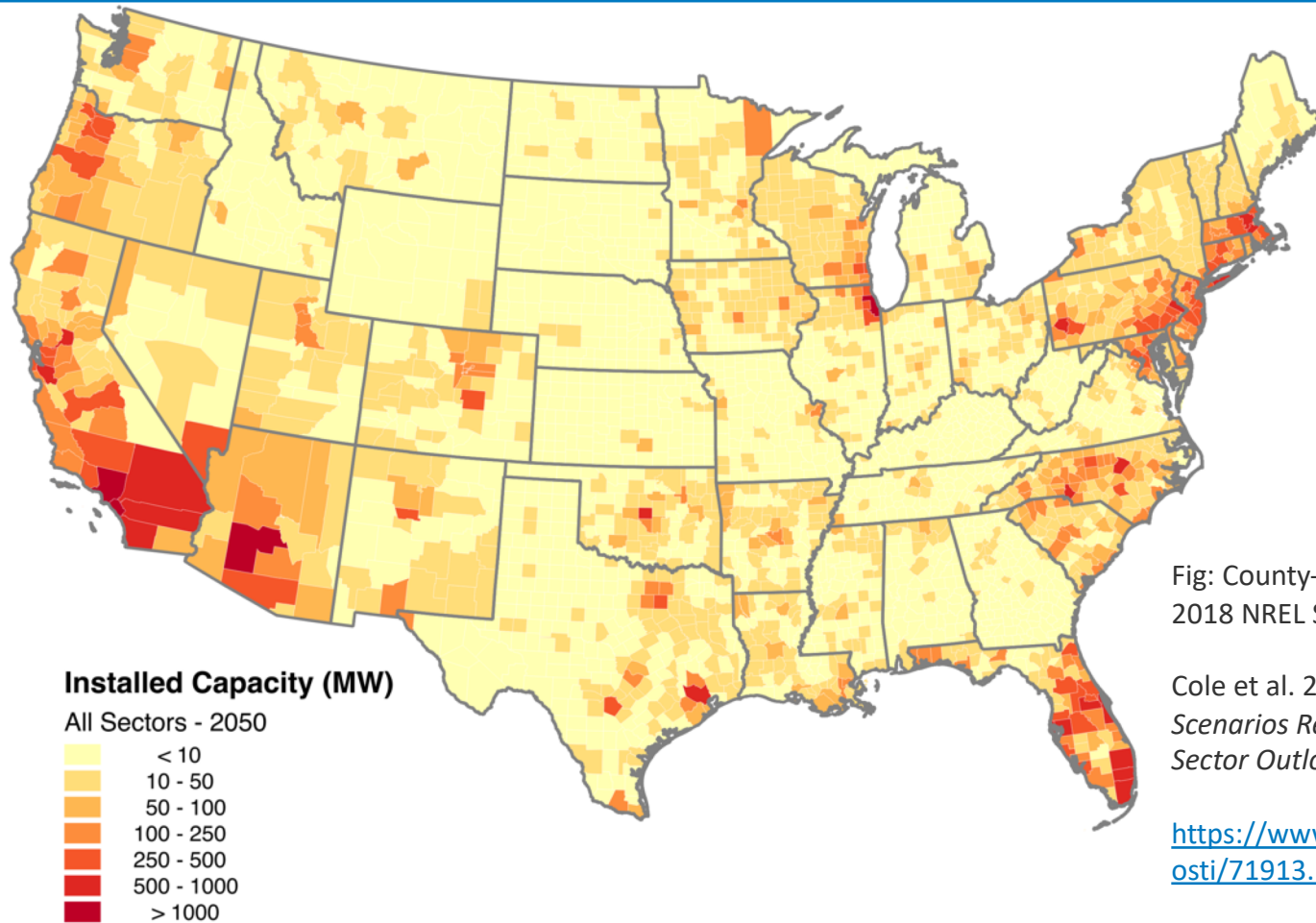
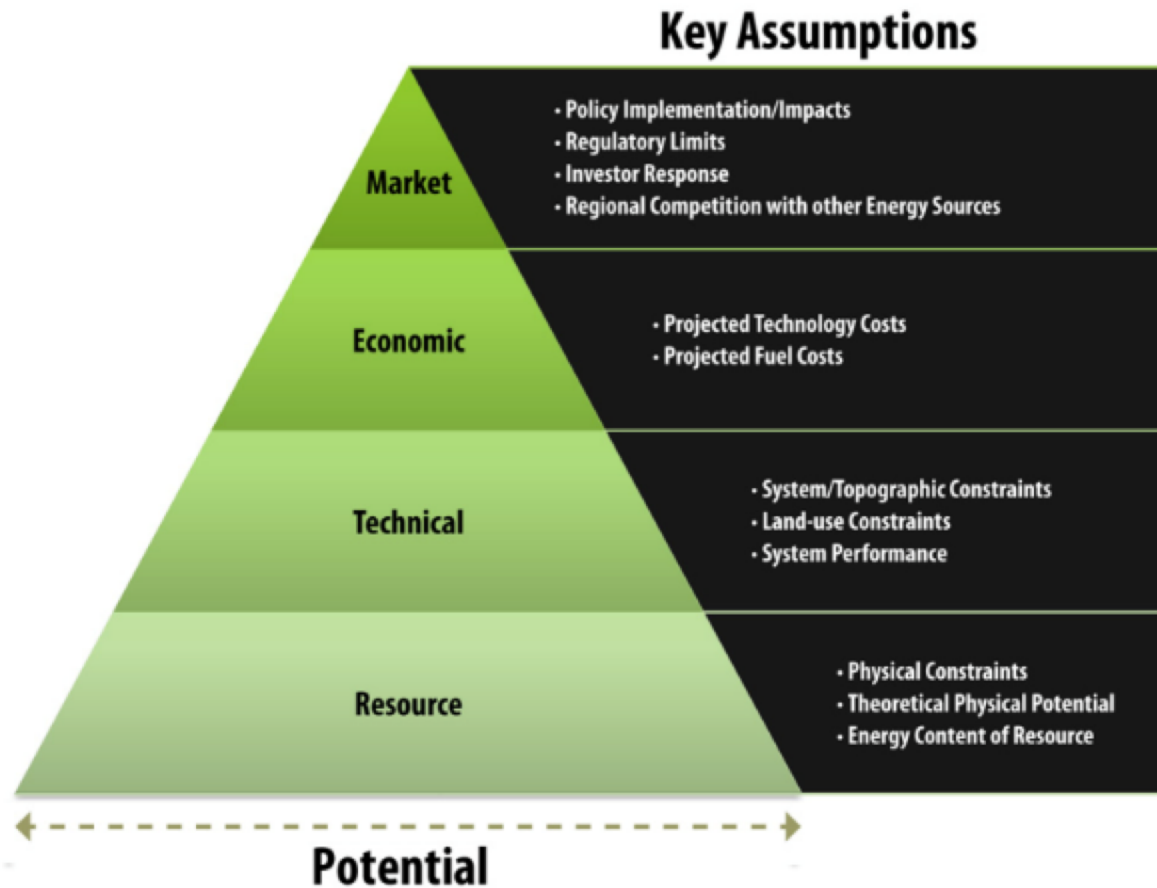


Fig: County-level forecast for 2018 NREL Standard Scenarios

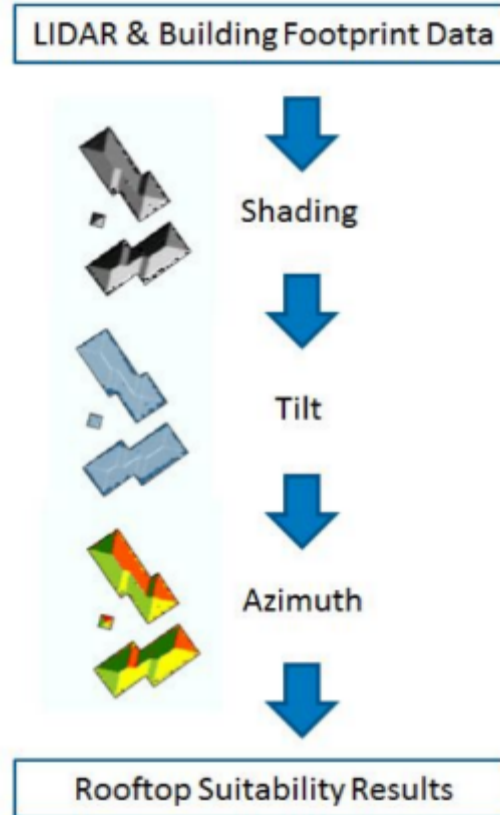
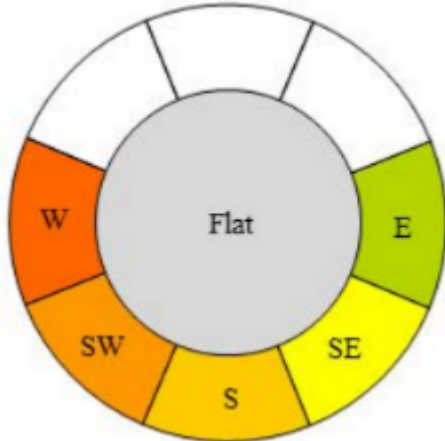
Cole et al. 2018. *2018 Standard Scenarios Report: A US Electricity Sector Outlook*.

<https://www.nrel.gov/docs/fy19osti/71913.pdf>

Framework for Modeling DER Adoption



Assessing Rooftop Solar Technical Potential

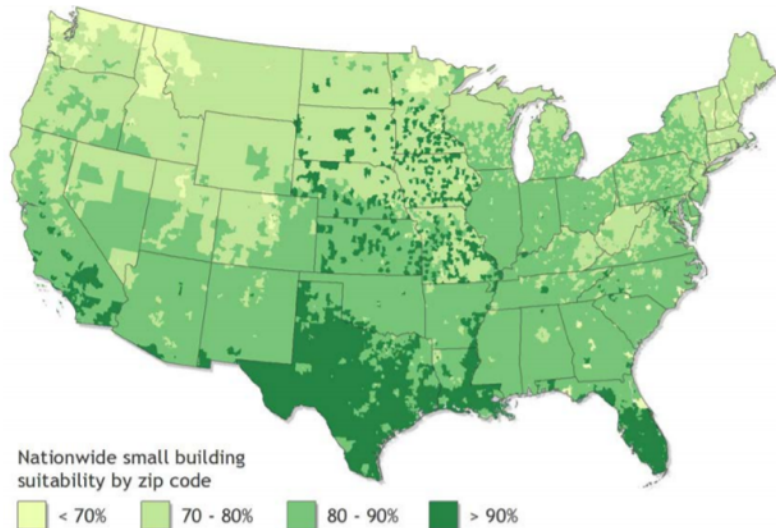


Clockwise:

- (1) Raw LiDAR imagery of buildings
- (2) Developable area estimated for each building in dataset, then aggregated at regional level
- (3) Suitability based on roof plane orientations, tilt, size, and shading

Rooftop solar technical opportunity is large

Approximately 1.1 TW of technical potential, mostly in small buildings (i.e. residential homes)



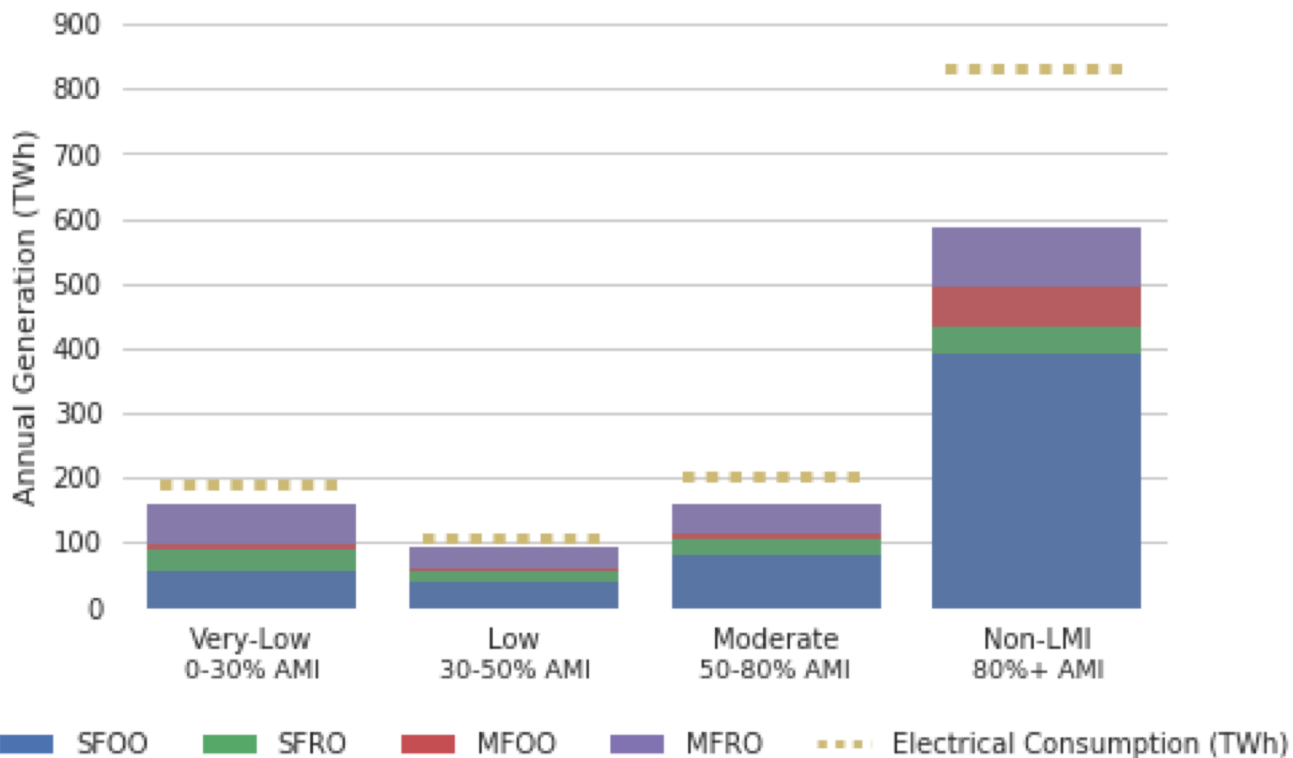
Building Class (Building Footprint)	Total Suitable Area (Billions of m ²)	Installed Capacity Potential (GW)	Annual Generation Potential (TWh/year)
Small (< 5,000 ft ²)	4.92	731	926
Medium (5,000–25,000 ft ²)	1.22	154	201
Large (> 25,000 ft ²)	1.99	232	305
All Buildings	8.13	1,118	1,432

- The average **small building** had 52 m² (8.3 kW) of developable area, and 79% were “suitable”
- The average **medium building** had 952 m² (152 kW), and 52% were suitable
- The average **large building** had 4,178 m² (668 kW), and 52% were suitable

Rooftop solar can meet most residential demand

In the residential sector rooftop solar can technically meet most electrical demand, especially low-income.

But, multi-family (MF) and renter-occupied (RO) buildings are a large source of the potential and are typically ineligible for solar adoption.



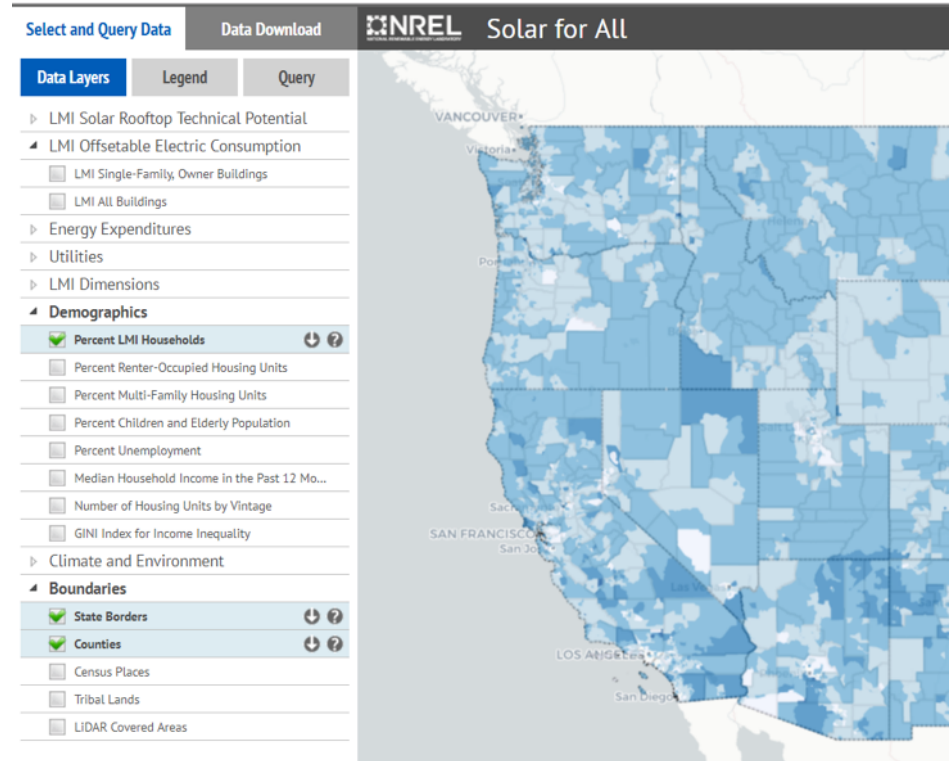
All data used in the study is publicly available

Download the REPLICA dataset!– Tract-level solar technical potential by income, tenure, and building type, joined with 10 additional datasets to provide socio-demographic and market context (e.g. energy expenditures, demographics, etc.).

<https://data.nrel.gov/submissions/81>

SolarForAll web application - Explore, download, and intersect data in interactive web application

<https://maps.nrel.gov/solar-for-all/>



Screenshot of SolarForAll app

What predicts adoption decisions?

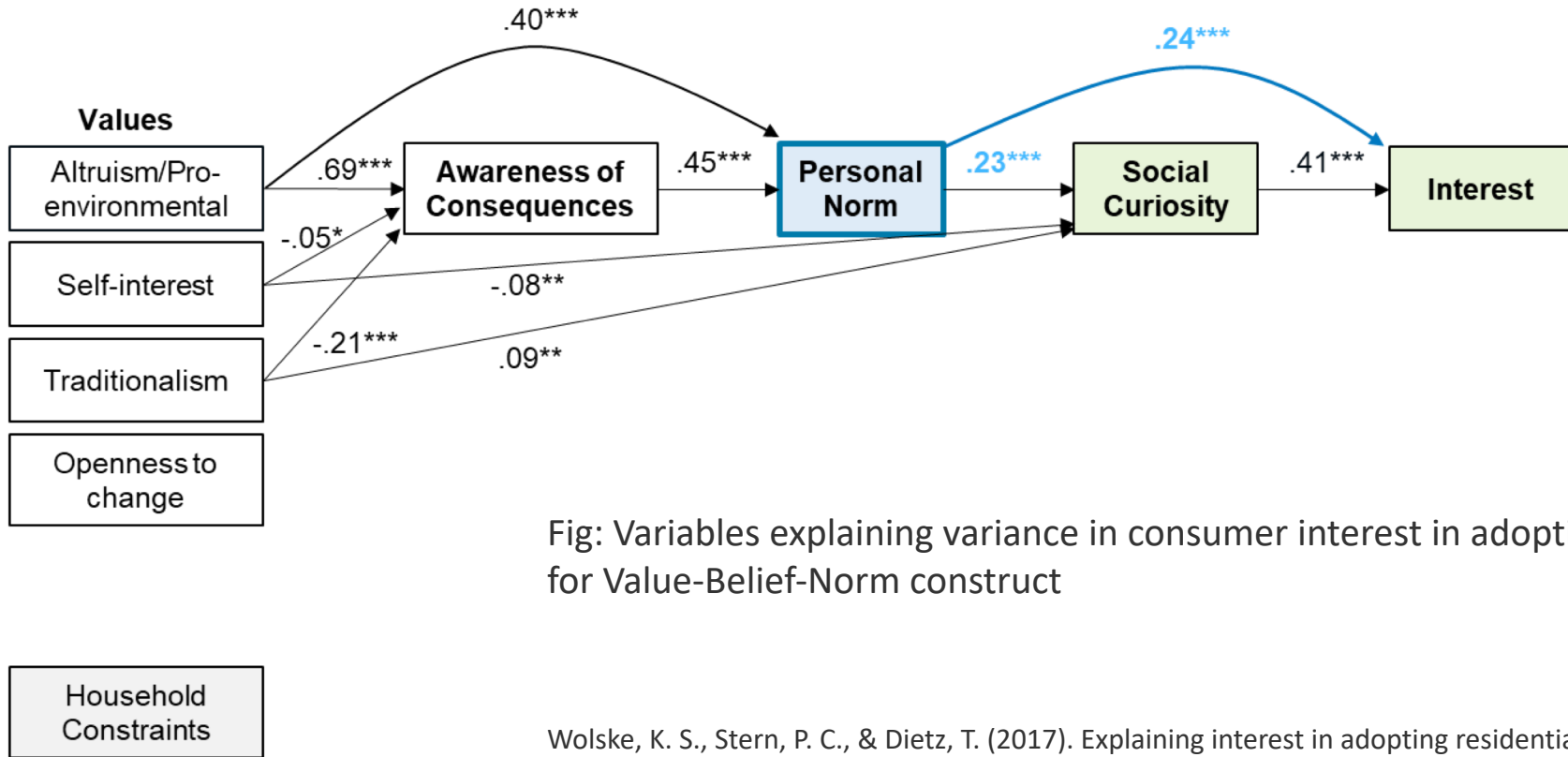


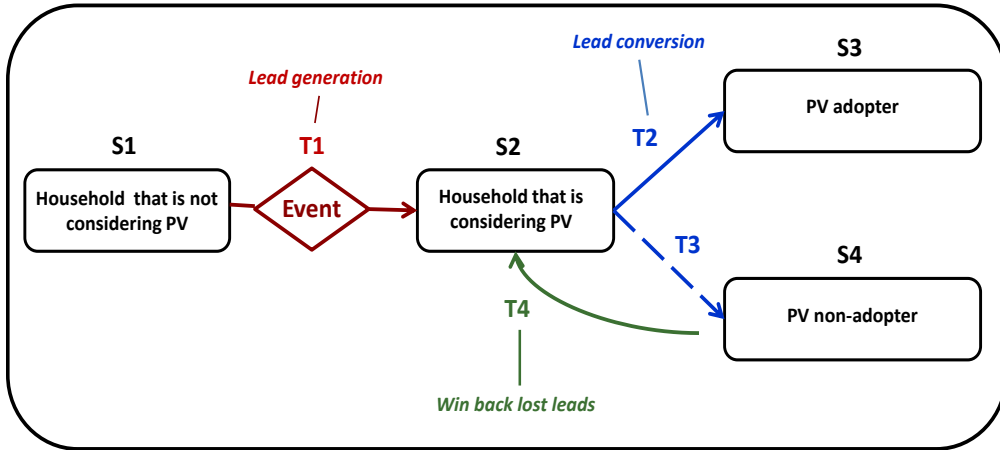
Fig: Variables explaining variance in consumer interest in adopting solar for Value-Belief-Norm construct

Wolske, K. S., Stern, P. C., & Dietz, T. (2017). Explaining interest in adopting residential solar photovoltaic systems in the United States: Toward an integration of behavioral theories. *Energy research & social science*, 25, 134-151.

What do we know about DER adoption?

- Most consumers are primarily motivated by savings on utility bills (Sigrin et al. 2014; Moezzi et al. 2016)
 - Modeling prices and policies is important
- Consumers are influenced by spatial and social “peer effects” (Bollinger & Gillingham 2012; Wolske et al. 2017)
 - Motivates spatially-granular modeling
- Many of the variables that predict adoption decisions are non-demographic, e.g. pro-environmental norms, innovativeness, social support (Wolske et al. 2017)

Survey data is publicly available



Survey	Survey Responses				Total
	AZ	CA	NJ	NY	
General Population Survey	351	338	315	337	1341
Considerers Survey (non-adopters)	113	187	109	182	589
Adopter Survey	109	1181	185	187	1587
	573	1706	607	706	3592

Download the survey data: <https://data.nrel.gov/submissions/68>

Learn more about the study: <https://www.nrel.gov/solar/seeds/>




Open Sourcing dGen Model

The RiDER project seeks to advance the state-of-art of long term resource planning by open sourcing **NREL's dGen model**, an agent-based model of DER customer adoption.

- Model release scheduled for September 2020
- Develop county-level projections of distributed solar and storage deployment for each of the ISO/RTO participants' service territories

Want to learn more?

Contact: Benjamin.Sigrin@NREL.gov

A photograph of a row of modern, colorful townhouses (red, green, yellow) with solar panels on their roofs. A large, leafless tree stands in the foreground, partially obscuring the view. The scene is set on a residential street with parked cars and a sidewalk. A dark semi-transparent banner is overlaid across the middle of the image, containing white text.

Substantial research gaps remain

Ongoing research needed

- Developing granular data sets (i.e. premise-level) and computational methods to simulate adoption and effects on the distribution system
- Anticipating how consumers will use DER technologies and their combinatorial possibilities, e.g. DPV + EV + DR
- Integrative modeling to including DERs in load forecasting and resource and infrastructure planning
- Understanding the value of DERs and how this changes with grid evolution
- Continuing to develop and refine methods to conduct Integrated Distribution Planning