

Office of ENERGY EFFICIENCY & RENEWABLE ENERGY

SOLAR ENERGY TECHNOLOGIES OFFICE

2022 SETO PEER REVIEW

# **Systems Integration Program Overview**

January 31, 2022

energy.gov/solar-office

Guohui Yuan, Program Manager

## What is System Integration?



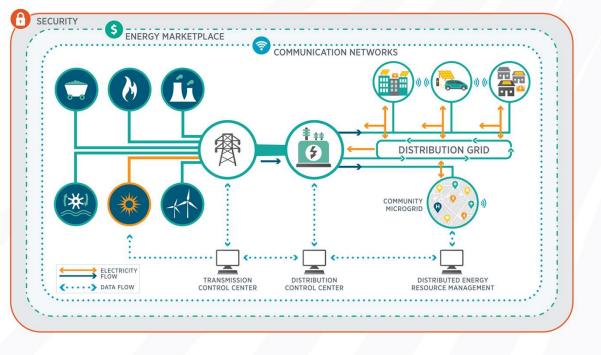
Next-Generation Inverters Enable Solar Energy Integration - YouTube

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# **SETO Systems Integration (SI) Program**

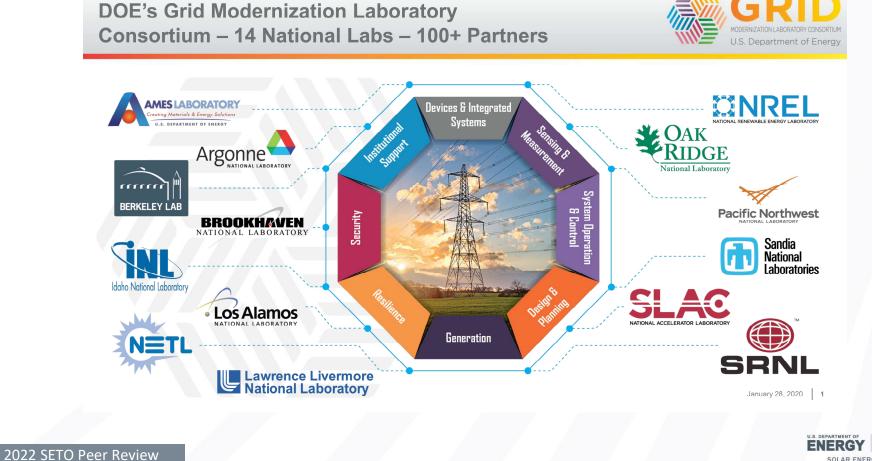
The Systems Integration (SI) subprogram supports research, development, demonstration, and deployment (RDD&D) of technologies and solutions – focusing on technical pillars data, analytics, control, and hardware - that advance the reliable, resilient, secure and affordable integration of solar energy onto the U.S. electric grid.



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## **GMI – DOE-Wide Collaboration**



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## **Systems Integration Team**





Guohui Yuan

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**David Walter** 

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## **System Integration Key Research Areas**

#### System Planning

- Develop methods and tools for short- and long-term power system planning with high solar contribution.
- •Address issues in system reliability, resource adequacy, generation variability, system flexibility.
- Include power system modeling, solar and load forecasting, and interconnection standards.

#### System Operation

- Develop real time situation awareness and control solutions for high-level solar integration
- Address operation issues for both bulk power and distribution systems
- Include operation data integration, grid services, system stability and protection, power flow analysis, and control optimization

#### PV for Resilience & Cybersecurity

- Develop solutions to ensure the continuity of electric power service and faster recovery during grid disruptions.
- •Address physical weatherrelated hazards as well as cybersecurity threats
- •Include integrated solutions with solar PV, energy storage, and other DER.

#### Power Electronics & Enabling Technologies

- Develop new foundational hardware, software, and system technologies to enable solar grid integration.
- Include power electronics, AI/ML and data analytics, sensing and communications, computing, and advanced testbeds.

# **Research Programs**

- <u>FY22 SETO Lab Call</u> transient/dynamic modeling, open data, NSRDB, reliability and cybersecurity standards
- <u>FY21 SI & Incubator FOA</u> grid-forming consortium, BTM solar integration
- <u>FY20 SETO FOA</u> resilient community microgrids, cybersecurity, hybrid PV plants
- <u>FY19 SETO Lab Call</u> all SI topics
- <u>FY19 GMLC Lab Call</u> resilience models, sensing and measurement, cyber security
- <u>FY19 SETO FOA</u> grid services, system protection, grid-forming inverter, cyber security
- <u>ASSIST FOA</u> situation awareness, and resilience for critical infrastructures
- <u>Advanced Power Electronics FOA</u> Improving PE efficiency, reliability, control; WBG devices
- <u>GMLC-RDS Lab Call</u> Resilient distribution system design, demonstration, and value analysis



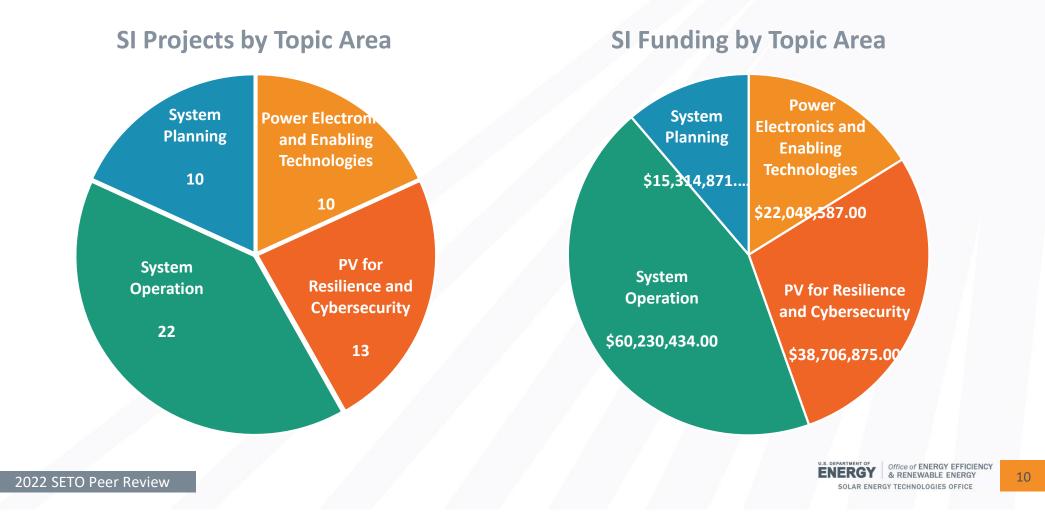
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## **Systems Integration (SI) Peer Review Portfolio**



# Justice, Equity, Diversity & Inclusion (JEDI)

#### **JEDI Strategy for SI:**

- Diversify Merit Reviewer pool
- Diversify selection of Awardees
- Include DEI requirements in program designs
- Enhance community resilience through Technology demonstrations

#### **Recent JEDI Successes for SI:**

- Bronzeville, Chicago microgrid project successfully completed final testing (January 2022)
- Diversity of SI subprogram team
- 14 applications for SI focus area of MSI STEM Research and Development Consortium (MSRDC)



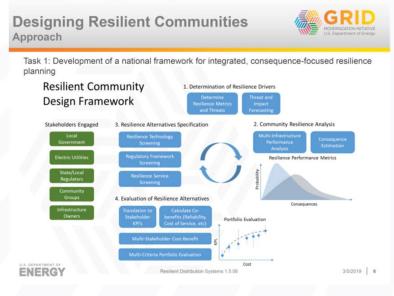
7.7 MW community microgrid that will provide service to approximately 770 customers in the historically Black neighborhood of Bronzeville, Chicago. Photo courtesy of ComEd



# **Stakeholder Engagement**

- Program-level
  - Actively listening
  - Stakeholder workshops and webinars
  - Technical workshops
- Project-level
  - Include TRCs, IABs, SAGs, surveys to solicit diverse stakeholder voices to guide research
  - Build in stakeholder engagement tasks and milestones.
  - Transparency in research methodologies
  - Disseminate results in public reports, online content, training webinars, and demonstrations

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#### Source: Bobby Jeffers & Robert Broderick)



DOE-led Stakeholder meeting in Puerto Rico



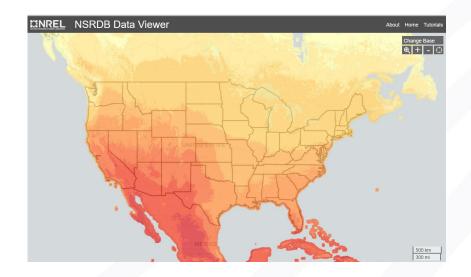
# Challenges



## **Solar Generation Variability and Uncertainty**

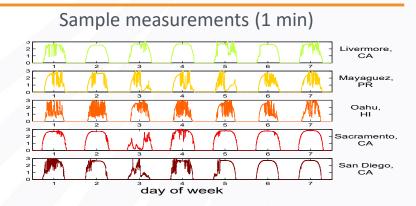
Solar Irradiance Data (GHI, DNI):

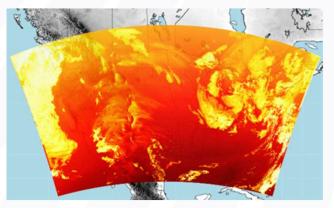
- Historical = NSRDB
- Real time = satellites and ground sensors
- Future = forecast



2019 Annual Mean of GHI from NSRDB (2km x 2km, 5 min, Terabytes) <u>Home - NSRDB (nrel.gov)</u>

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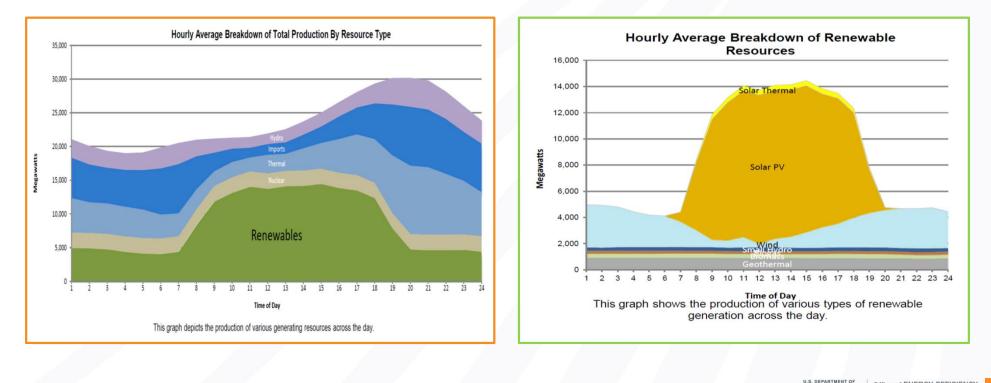
WRF-Solar<sup>®</sup> NCAR Research Applications Laboratory RAL (ucar.edu) Run on HPC U.S. DEPARTMENT OF ENERgy Office of ENERgy EFFICIENCY & RENEWABLE ENERgy SOLAR ENERgy TECHNOLOGIES OFFICE

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# **Operating a Decarbonized Electricity Grid**

Daily renewable profile (CAISO, April 24, 2021) 

Served 94.5% of the load served by RE at 2:28pm for 4 seconds ٠



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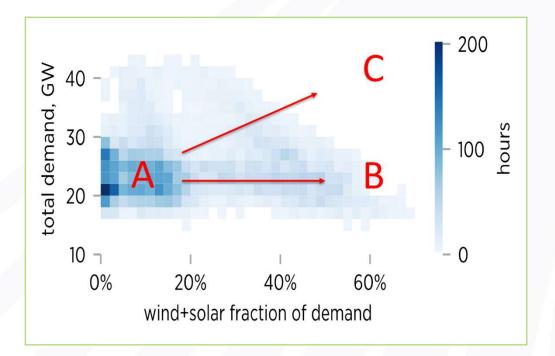
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## **Operating a Decarbonized Electricity Grid (continue)**

Power system	System size	Peak solar + wind <i>power</i> contribution	Annual solar + wind <i>energy</i> contribution
U.S. WECC	163 GW	36%	13%
U.S. ERCOT	80 GW	58%	20%
U.S. SPP	51 GW	69%	28%
U.S. CAISO <sup>4</sup>	44 GW	70%	20%
Australia NEM	35 GW	50%	21%
Ireland	7 GW	84%	36%
Oahu	4 GW	58%	22%
Maui	0.5 GW	80%	37%

Solar Energy Technologies Office Multi-Year Program Plan | Department of Energy

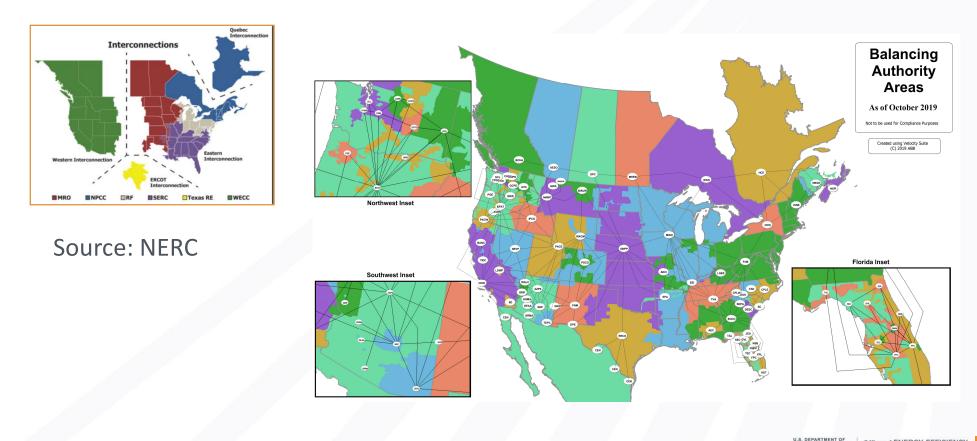


The frequency of occurrence of solar and wind power contributions at different demand levels in CAISO for 2019. For a vast majority of the operation periods, solar and wind penetration is low (Area A). Occasionally solar and wind provide a higher contribution to the generation supply but only at lower demand levels. (Area B). In the future, as solar and wind reach much higher deployment, the system will operate at high demand most of the times (Area C).

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# **Scalability of Solar Integration on U.S. Electric Grid**



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## **Natural Disasters and Cybersecurity Threats**





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# **Grid Stability and Resilience**

## **Major Events**

- May 2021, Odessa disturbance
  - Transmission fault
  - ERCOT solar output drops from 4.5GW to 3.5 GW in <1 min</li>
- February 2021, TX winter storm power outage
- August 2020, CA rolling blackout
- 8/09/2019, UK blackout
  - lightening strike, 45 minute outage for 1.1 million customers
  - 737MW offshore windfarm output reduction
  - 150MW of small embedded generation disconnected; further 350MW of embedded generation disconnected
- 10/09/2017, Southern CA Canyon 2 Fire
  - transmission fault
  - 900 MW of solar PV resources lost; PV inverters trip off due to momentary cessation in response to voltage transients
- 9/28/2016, South Australian blackout
  - Extreme weather (high wind, high temperature)
  - 456 MW wind generation reduction
  - 850,000 customers lost power for hours
- 8/16/2016, Southern CA Blue Cut fire
  - transmission fault
  - 1200 MW of solar PV resources lost; PV inverters trip off due to frequency during transients



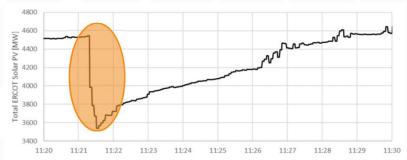


Figure I.5: ERCOT BPS-Connected Solar PV during Disturbance [Source: ERCOT]

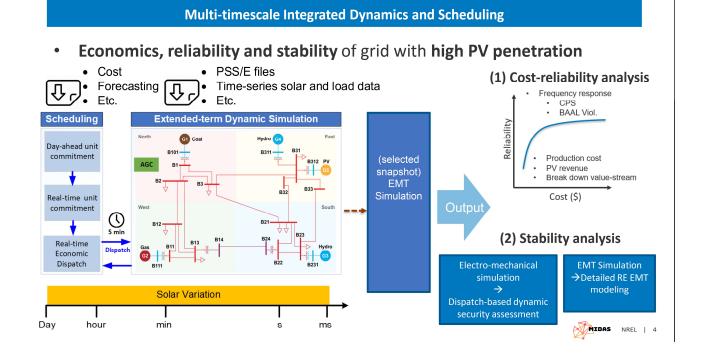


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# **System Planning**



# Modeling 100% Renewable Grid



What is MIDAS Solar?

#### Maui Grid



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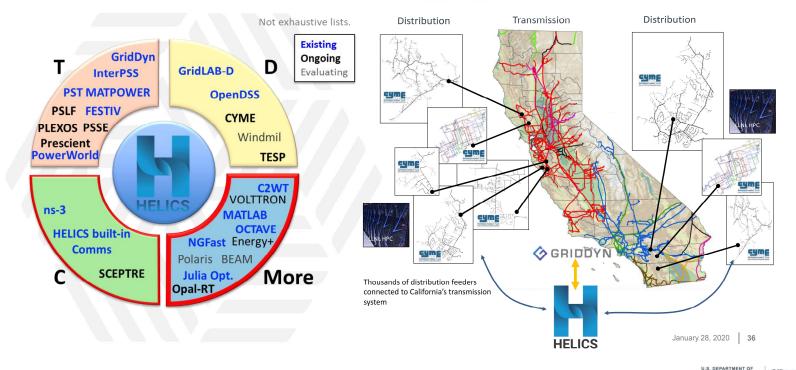
(Source: Jin Tan, NREL)



## **Multi-Domain Co-Simulation Platform**

HELICS middleware enables coupling of transmission, distribution, communications and other models





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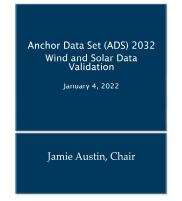
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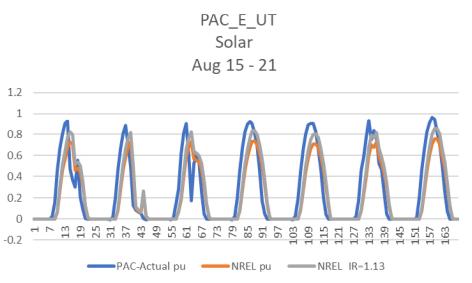
# **Develop and Validate 2032 WECC-ADS Solar Datasets**

- Use existing NREL models and historic wind/solar data to create utility-scale and BTM solar datasets for the entire WECC region
- Validate with actual plant-specific data
- Support long-term system planning and wind/solar development

WECC

• Close collaboration between DOE, NREL, PNNL, and WECC staff







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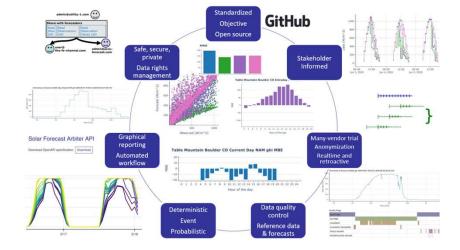
# **Unlocking the Value of Solar Forecasting**

- Solar Forecasting Prize
  - Bringing together forecast providers a

#### **Solar Forecast Arbiter**

A paradigm shift in forecast evaluation

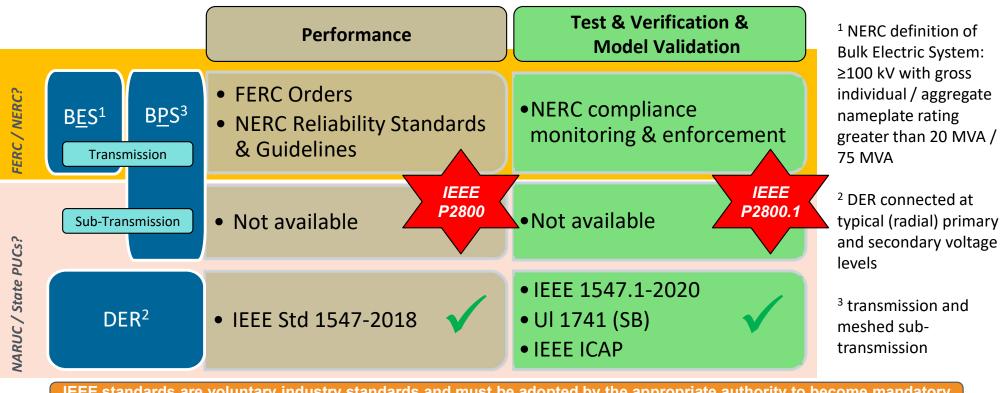




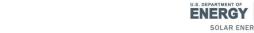
(Source: University of Arizona)



### **Interconnection Standards Development**



IEEE standards are <u>voluntary industry standards</u> and must be adopted by the appropriate authority to become mandatory (e.g., Transmission Owners, NERC, FERC).



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(Source: IEEE P2800 WG, Jens C. Boemer, et al)

# **System Operation**

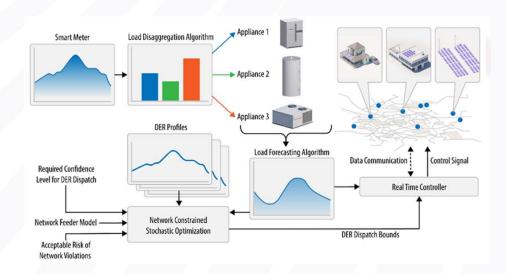


### **Control of behind-the-meter DERs with AMI Data Integration**

### **Project Description**

- **Goal:** Develop and field-validate a control technology to enable optimal provision of grid services from BTM solar PV and other DERs.
- **Innovation:** 1) Smart meter as a controller with improved controllability and observability of BTM DERs for utilities. 2) Hierarchical control architecture with careful consideration towards data communication and computational complexity tradeoffs.
- **Approach:** 1) Leverage ground truth whole house consumption data to develop and validate load disaggregation and control algorithms. 2) Parallel hardware development. 3) integration, lab validation, field demonstration.

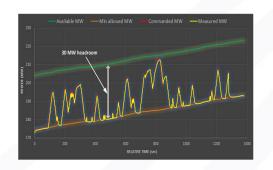
## **Solution Architecture (Eaton)**





### **Demonstration of Essential Reliability Services from Solar PV**

- NREL/CAISO/First Solar partnering in the 300-MW PV System Commissioning Test
- Winner of NARUC Innovation Award in 2017
- 4-sec AGC signal provided to PPC
- 30 MW headroom
- Tests were conducted for 30 minutes at:
  - o Sunrise
  - Middle of the day
  - Sunset
- 1-sec data collected by plant PPC







"These data showed how the development of advanced power controls can enable PV to become a provider of a wide range of grid services, including spinning reserves, load following, voltage support, ramping, frequency response, variability smoothing, and frequency regulation to power quality."

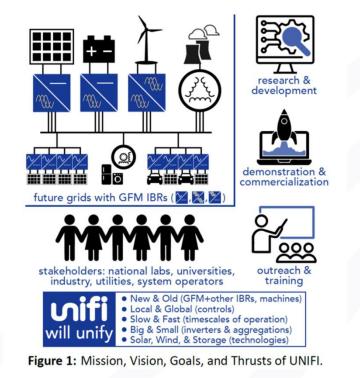
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# **UNIFI Grid-Forming Technology Consortium**

### NREL-Led, 5-Year, \$25M Program



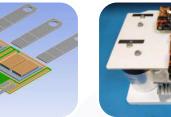


# **Power Electronics**



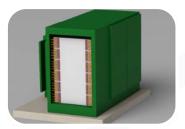
## **Power Electronic Hardware Technologies**





Transformer-less MV PEBB (University of Arkansas)

- a) reductions in the lifetime costs
- b) improve device reliability
- c) enable versatile control functionalities



Multiport DC Transformer (GTech)



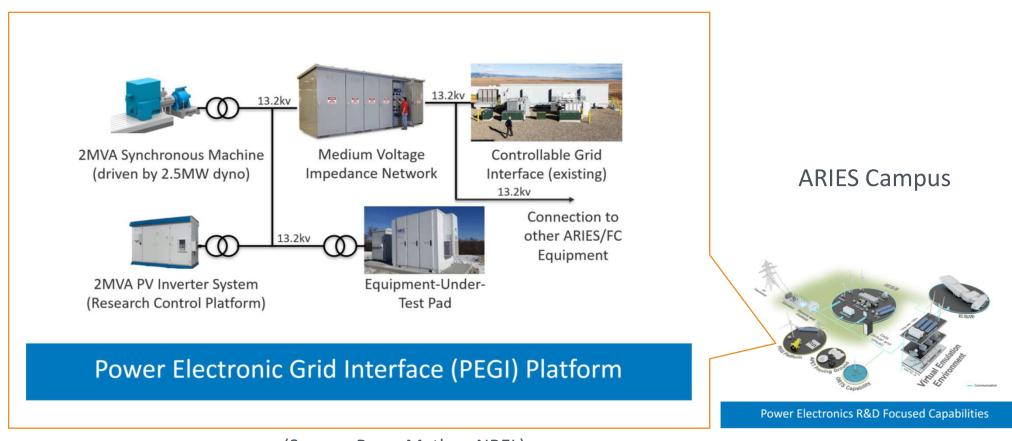
Heat Sink design with Additive Manufacturing (ONRL)



Highly-Reliable Residential PV Inverter (UMD)

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# **Power Electronics Grid Interface (PEGI)**

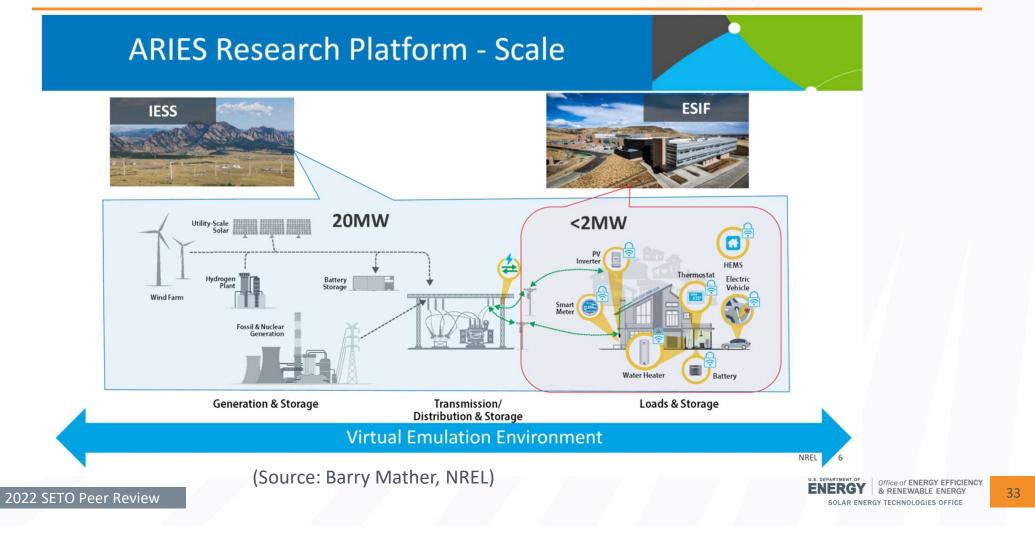


(Source: Barry Mather, NREL)

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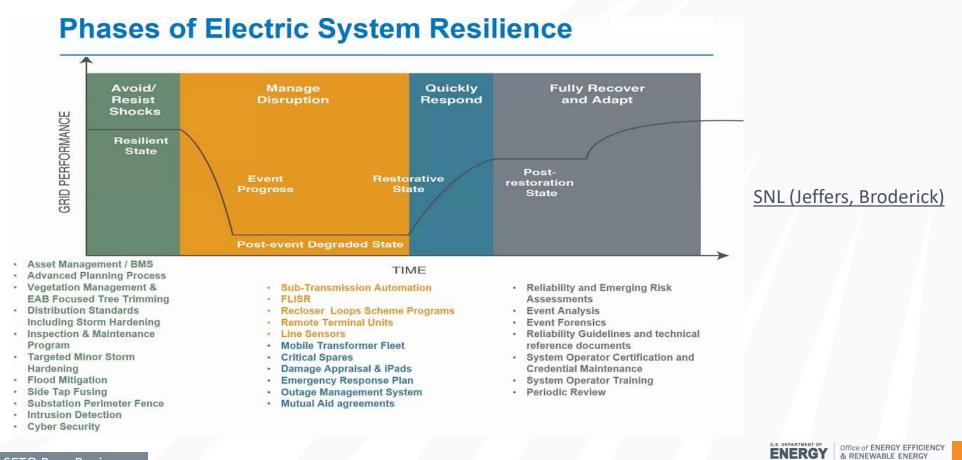
## **Investing in World Class Test Facility**



# **PV for Resilience**



## **Consequence-Based Resilient System Design**



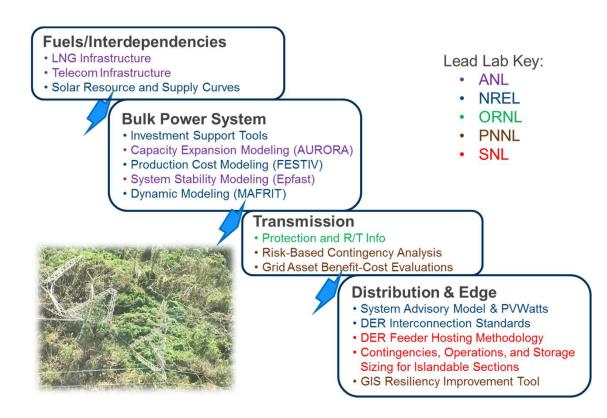
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# **Building Resilient Power System in Puerto Rico**

**Objective:** DOE Office of Electricity and SETO have tasked national laboratories to perform near-, medium-, and long-term modeling activities to support the rebuilding of a more resilient electric power grid system in Puerto Rico after the devastation of Hurricane Maria in late September 2017.

#### Phase 2 Approach:

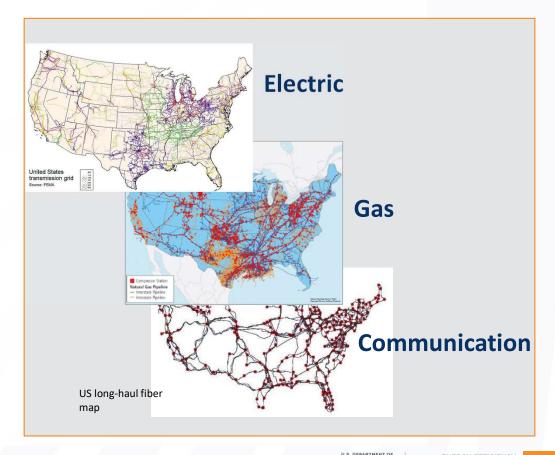
- 1. Build on insight from research in Hawaii and elsewhere
- 2. Develop integrated portfolio
- 3. Rigorous modeling and analysis
- 4. Broad stakeholder engagement (federal, state, local community, and industry)



## North American Energy Resiliency Model (NAERM)

**Goal:** To identify electric critical infrastructure throughout North America and to **understand vulnerabilities and interdependencies with the interconnected system** to allow DOE to partner with industry, national labs, and other federal agencies to develop strategic initiatives to protect from cyber and physical threat while furthering energy dominance for the United States.

*Collaboration with OE, Wind, and Water Technology Offices* 



# Grid Resilience with a 100% Renewable Microgrid

#### **Project Description**

- **Goal:** Advance the state of the art in grid resilience demonstrating a 100% renewable microgrid
- Innovation: 1) optimize distributed energy resource operations, 2) enable islanding operations powered only by renewable energy, 3) reduce PV curtailment from islanding operations.
- **Approach:** 1) Install **grid-forming inverters + ESS** to support seamless islanding and blackstart without diesel backup generators. 2) **Field test and validate** an enhanced microgrid control system. 3) enhance the Real-Time Digital Simulator (RTDS) model for the Borrego Springs Microgrid; leverage power hardware in the loop (PHIL) simulation.

#### **SDG&E Borrego Spring Microgrid**

(~40MW solar, 1.5MW/3MWh BESS, fuel cell, electrolyzer, backup diesel gensets)



# Cybersecurity



# **Cybersecurity a Key Challenge and an EERE Priority**

#### SANDIA REPORT **Goal 1: Accelerate Cyber Resilience** Unlimited Release Printed December 2017 **R&D of EERE Operational Technologies** Roadmap for Photovoltaic Cyber Security Jay Johnson 1.1 Improve cybersecurity defenses and SANDIA REPORT resilience. Prepared by Condia National Laboratories Amountemark New Mexico 87185 an Unlimited Release Printed December 2017 Cyber Security Primer for DER Vendors. **1.2 Mitigate vulnerabilities** Aggregators, and Grid Operators 1.3 Next-generation cyber resilient Christine Lai, Nich U.S. DEPARTMENT OF ENERGY SANDIA REPORT technologies. Unlimited Release Printed February 2019 **Goal 2: Increase EERE Stakeholder Recommendations for Trust and EERE Cybersecurity** Encryption in DER Interoperability Standards **Multivear Program Cybersecurity Awareness** James Obert, Patricia Cordeiro, Jay Johnson, Gordon Lum, Tom Tansy, Max Pala Plan Sandia National L 2.1 Improve situational awareness. 2.2 Enhance EERE technology cybersecurity maturity. **Report to Congress 2.3 Identify opportunities for EERE** October 2020 Th Sandia National Laboratories stakeholder participation in cyber incident response exercises. United States Department of Energy Washington, DC 20585 U.S. DEPARTMENT OF U.S. DEPARTMENT OF ENERGY Office of ENERGY EFFICIENCY & RENEWABLE ENERGY

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# **Cybersecurity Strategy for Solar Integration**

- Develop a holistic approach in information technology (IT) and operation technology (OT) risk management
  - Apply NIST Cyber Security Framework (CSF) and DOE's cybersecurity maturity model (ES-C2M2)
  - moving from a cybersecurity approach that focuses primarily on utility companies to one that includes endpoint device manufacturers and third-party system integrators.
- Build community awareness and **information sharing** mechanisms
  - equipment standards and vigorous testing, validation, and certification
  - supply chain cybersecurity, e.g. solar inverters and control software
- Leverage DOE and national labs technical expertise, research and testing facilities, and funding resources
- **Collaboration** within DOE and with other federal agencies, state and local, and industry
  - November 2021 : SETO-SEIA Cybersecurity Summit: Securing Our Solar Future Today
  - SETO funded project to work with NARUC and NASEO to develop state solar cybersecurity toolkits.
  - Ongoing INL-SEIA partnership



. Adapted from Jovanna Helms at LLNL https://www.nist.gov/programs-projects/cybersecurity-framework https://www.nist.gov/document/2018-04-16frameworkv11core1xlsx



### **Firmware Cybersecurity Analysis Tools and Capabilities**

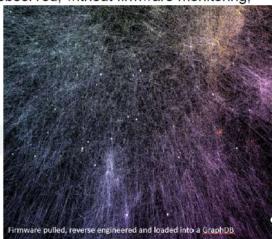
# 5.1.1 Firmware Command and Control Innovation and Impact



- Innovation: ML based firmware baselines show all functions used; agile embedded response integrated with bidirectional sharing of structured threat to security operations enable the protection of the electric grid critical functions
  - Current state of the art: reloading firmware when unexplained behavior is observed; without firmware monitoring; manual sharing of static indicators with field device operations

#### Contributions Advancing the State of the Art:

- Insight into embedded systems operations
- Operate through detection and remediation vs offline reloads of firmware;
- ✓ In-situ response; Detection based on ML firmware code behaviors;
- Connectivity to Upstream Data Analytics
- ✓ Impact:
  - ✓ Visualized Firmware for Analysis provides insights previously unknown
  - ✓ Agile Embedded Detection and Response



 Firmware C2 will share indicators locally and remotely with upstream energy security operations centers; identify adverse conditions indicating a cyber attack with response while maintaining operational functionality

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(Source: Rita Foster, INL)



## **DER Cybersecurity Standards Development**

SYSTEMS INTEGRATION TRACK (PV for Resilient Distribution Systems)

#### PROJECT NAME: DER Cybersecurity Standards Development

Last five digits of project number: 34216 Principal Investigator (PI): Jay Johnson PI Email: jjohns2@sandia.gov

#### BACKGROUND / INDUSTRY IMPACT

 This team is working directly with industry to develop consensus distributed energy resource (DER) cybersecurity recommendations and best practices that act as a basis for new/revised DER cybersecurity standards.

#### **PROJECT OVERVIEW / OBJECTIVES**

 The DER Cybersecurity Workgroup brings together interoperability and cybersecurity experts to discuss improvements to DER devices, gateways, aggregators, utilities and the US power system.

#### METHODS

 The group convenes subgroups to facilitate discussions between stakeholders and establish cybersecurity recommendations in the areas of device security, reference network architectures, data-in-flight requirements, access controls, etc.

#### **KEY OUTCOMES / MILESTONES**

- NREL report with recommendations for DER certification protocols.
- EPRI report on a DER communication reference architecture.
   Sandia report on improvements to trust and
- encryption in IEEE 2030.5.

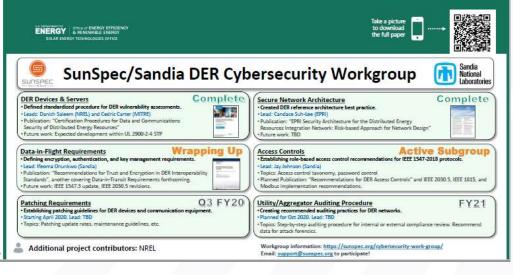
#### CONCLUSION / REMAINING RISK

- Please join the subgroups to develop the nextgeneration of cybersecurity requirements for robust, secure DER interoperability!
- It is a challenge to find appropriate standards development organizations to codify the recommendations.

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Creating **DER cybersecurity recommendations** and **best practices** to secure solar assets and act as the basis for future standards.



#### (Source: Jay Johnson, SNL)



# **AI/ML and Data Analytics**



### **Apply Data Science and Advanced Computing Technologies**

#### Don't lose sight of the problems to solve

- Solar forecasting, control optimization, threat detection
- Data science and AI/ML as enabling technologies
- Energy system is a cyber-physical system with IT/OT

#### Leverage multiple computing platforms

- high performance computing (HPC)
- public and private cloud
- edge computing, embedded computing, quantum computing

#### **Practical consideration**

- Balance complexity with practicality
- Combine data- and physics-based techniques
- Transition from lab research to real world
- Standard data interfaces for interoperability

#### Data management

- Respect data privacy and security
- Education and collaboration
- Collaboration: OE, AITO, NSF, NOAA, industry, Office of Science/ASCR

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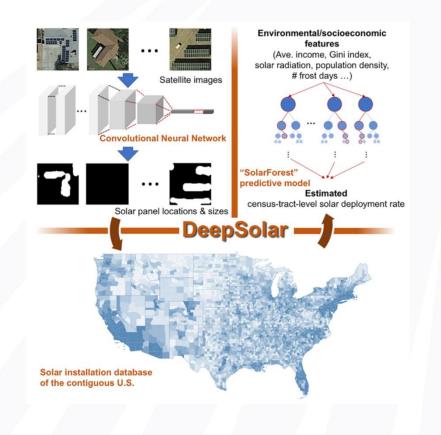


# **DeepSolar**

**Stanford** is currently working on a SETO-funded project to apply CNN techniques to public and multi-modal data, including satellite imagery and street views, to develop a highfidelity database which maps solar energy resources (including temporal and subtype information) and the associated infrastructure. This is built on the previous DeepSolar deep learning framework to automatically localize solar photovoltaic panels from satellite imagery and estimate their sizes.

#### By the numbers

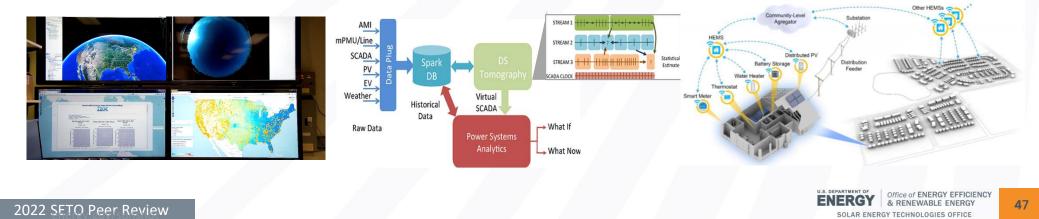
Typical image tile size	15 m – 22 m	
Typical image resolution	15 cm	
Training set	~370,000 images	
Validation set	~13,000	
Test set	93,500	
Total Installations in U.S.	1,470,000	
Prediction accuracy	~90%	



Jiafan Yu, Zhecheng Wang, Arun Majumdar, and Ram Rajagopal, Joule 2, 2605–2617, December 19, 2018

## **Apply AI/ML Technologies in Solar Grid Integration**

- IBM Watt-SUN Using machine-learning, the same technology behind the Jeopardy! playing robot Watson, IBM improved solar forecasting accuracy by as much as 30%.
- SLAC Developing a suite of open source software tools to enable utilities to anticipate, absorb and recover from extreme events, applying AI and ML for distribution grid planning and monitoring (i.e.
  ML-based power flow, switch detection, solar disaggregation, forecasting, topology detection, network re-configuration)
- NREL Using smart meter data and AI techniques, the team develops algorithms that can learn to identify homeowner preferences and enable day-ahead load schedules. The algorithms evaluate how to best use variable solar energy to pair with flexible building loads like electric water heating or electric vehicle charging.



## **In Summary**

- Key SI programmatic goal:
  - Develop technologies and solutions to enable the reliable, resilient and secure operation of a 100% clean energy grid.
- Top priorities
  - Advance inverter-based technologies to provide essential grid reliability services.
  - Develop cybersecurity tools to protect solar assets and electricity grid.
  - Apply ML/AI and data analytics methods in system planning and operation
- Support DOE's implementation of Infrastructure Investment and Jobs Act (IIJA)) provisions



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(Source: NREL Image Gallery)

