



SOLAR ENERGY
TECHNOLOGIES OFFICE
U.S. Department Of Energy

Accelerating PV Cost Reduction Through an Open-Source Software Ecosystem

PV Performance Modeling Collaborative
May 2, 2018

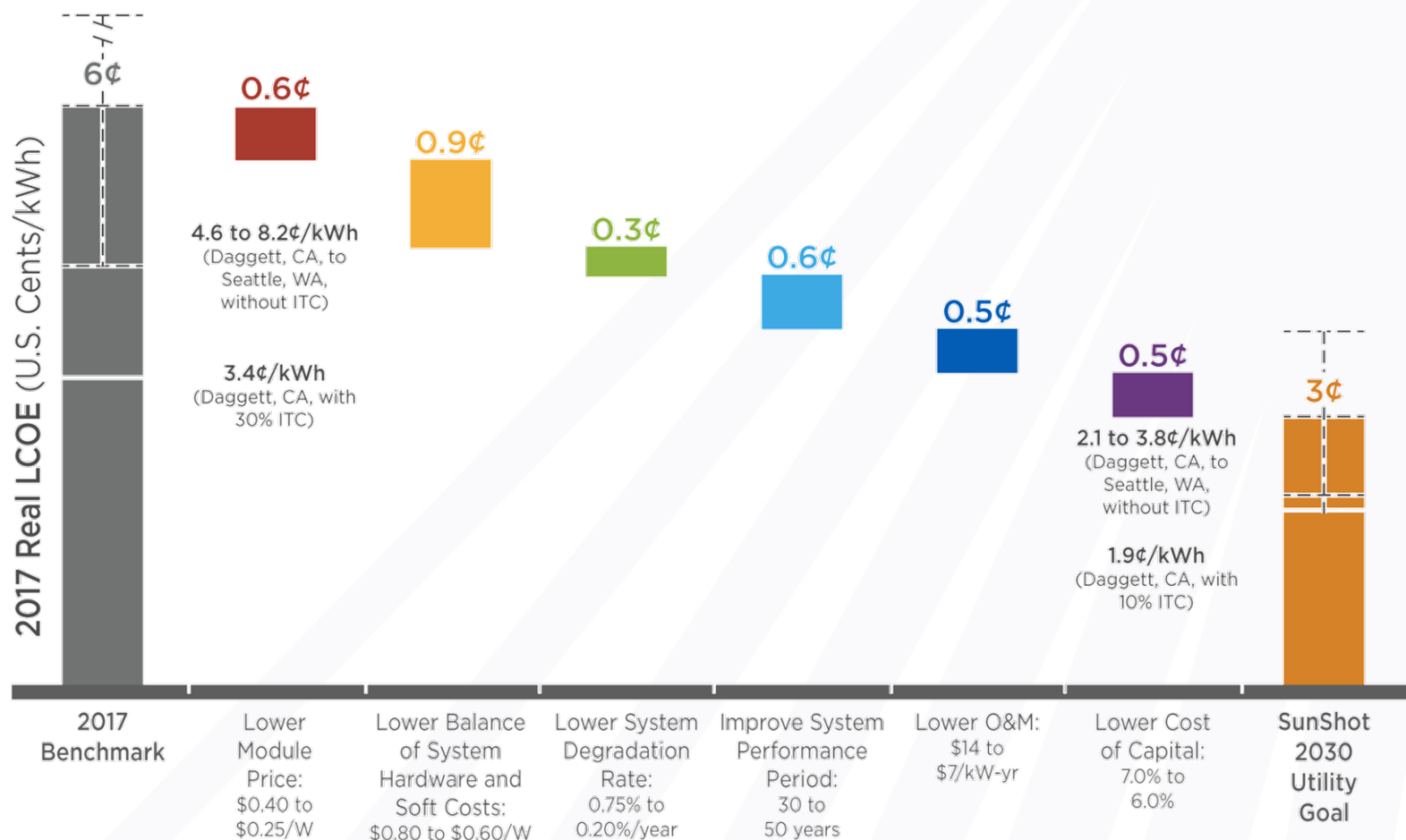
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U.S. Department of Energy

energy.gov/solar-office

Outline

- DOE Cost Goals and Performance Modeling
- Supporting a Modeling Ecosystem
- Orange Button and Beyond for Data Standards
- Current Open-Source Modeling Tools
- DuraMAT as Collaboration Model
- Putting the Pieces Together

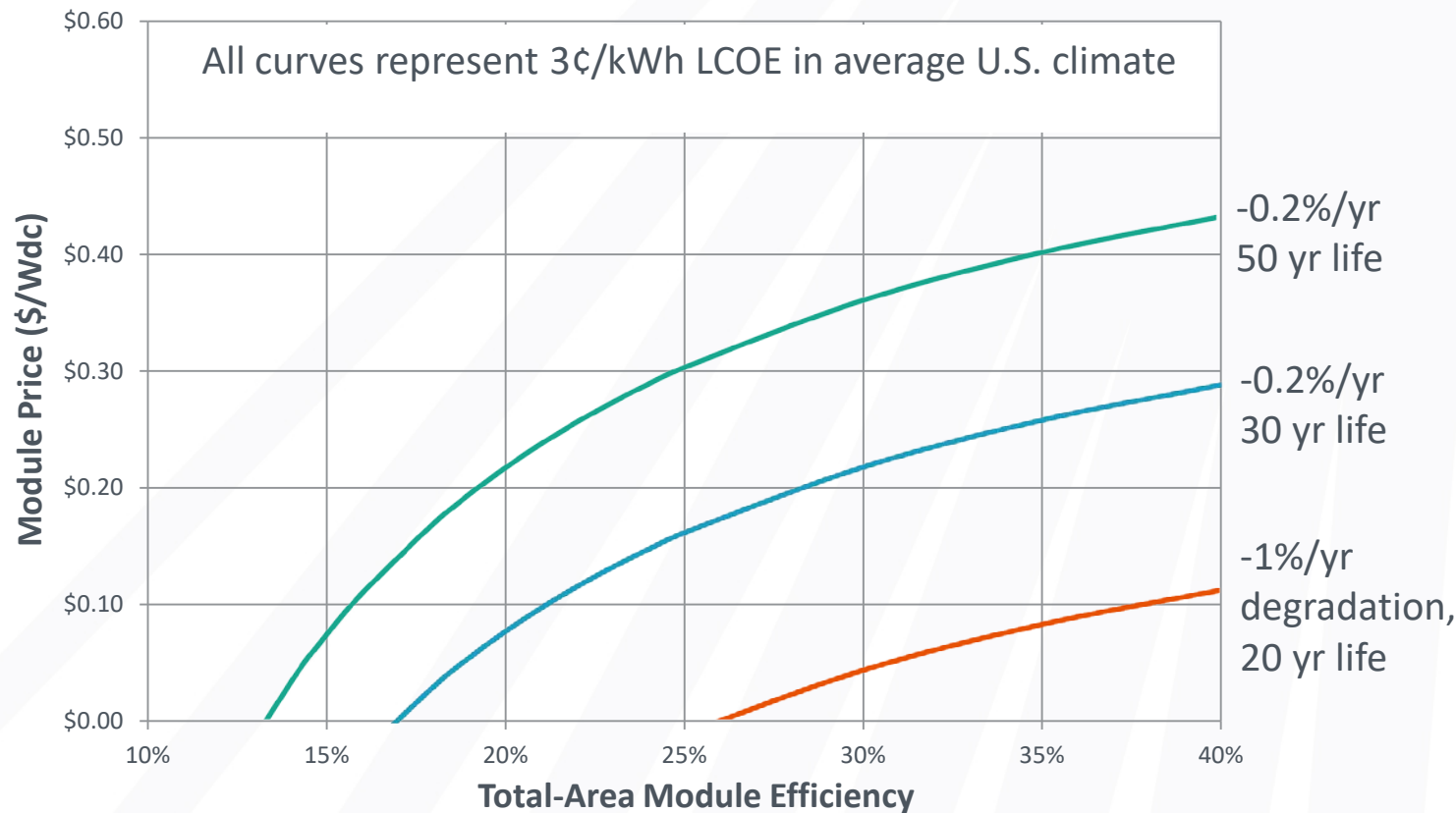
SETO Cost Targets and Uncertainty in Energy Yield



- Reduced uncertainty in performance modeling,
 - Increase system performance, lower O&M / financing

Many Technology Pathways to \$0.03/kWh

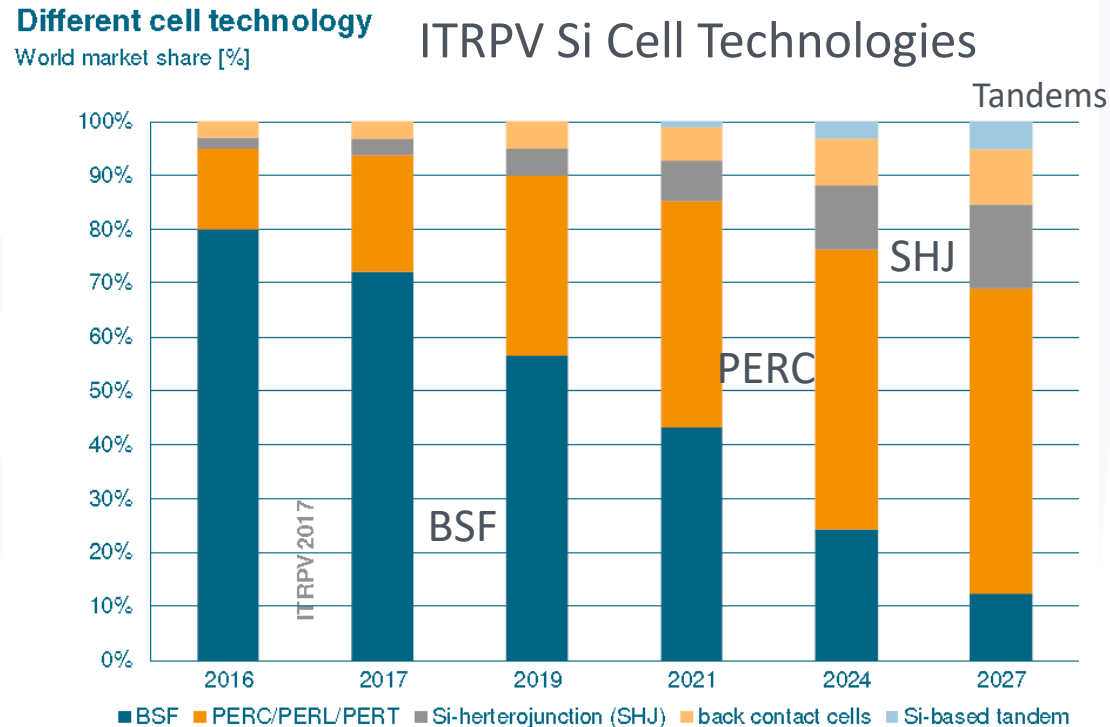
- Cost and performance tradeoffs open up numerous pathways.
- All pathways require sustained, multifaceted innovation.



Scenarios assume: 7% WACC, 2.5% inflation, \$4/kW-yr O&M, 21% capacity factor

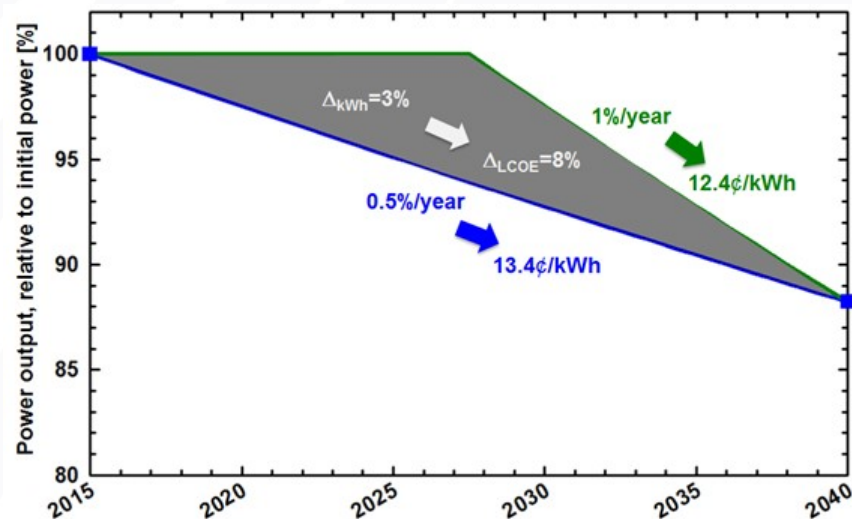
High Performance PV Technologies

- The industry is moving rapidly toward PERC technologies
- Heterojunction, and IBC technologies will continue to higher performance
- Similar estimates for Bifacial modules and systems



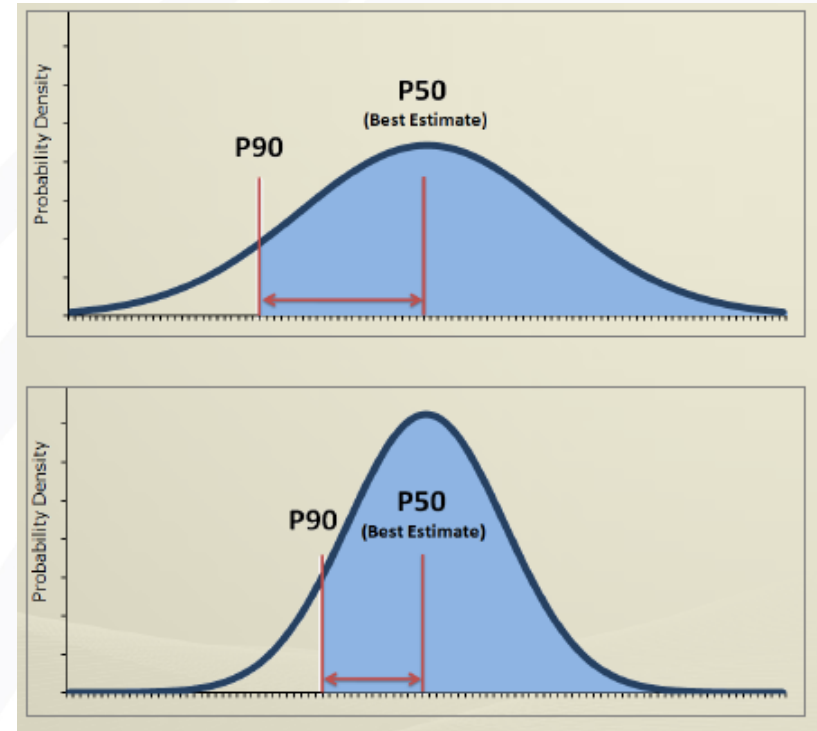
Evolution of Module and System Designs

- System performance and degradation models need to be updated to reduce risk of new technologies
- New cell and module architectures
 - Degradation models for PERC, Heterojunction, etc.
 - Performance models for bifacial modules and systems
- Anti-soiling, anti-reflection coatings
 - Durability and performance of module coatings
 - Spectral and angular dependence
- Require close interaction between innovations in module design and performance modeling and characterization



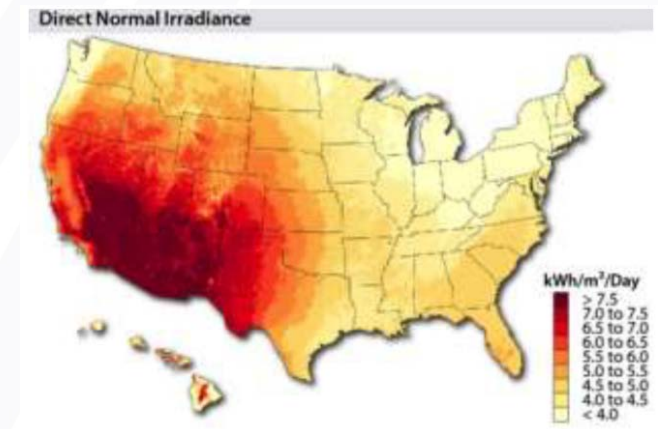
Uncertainty in System Performance

- Uncertainty in system performance leads to higher risk for PV developers, financiers and operators
- Exceeding these estimates provides increased revenues and system value
- Decreasing uncertainty can help to lower the cost of solar electricity
- DOE motivation is to support the field toward developing tools and data formats to reduce variability of PV system development estimates and field performance of PV systems



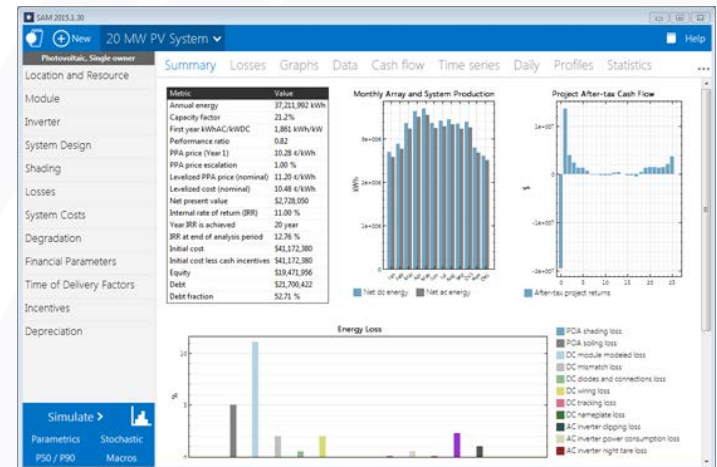
Data Format Standardization and Resource Databases

- Orange Button (Sunspec, NREL,...)
 - Industry-driven data standards to reduce market inefficiencies and lower costs
- NSRDB (NREL)
 - Serially complete collection of meteorological and solar irradiance data sets for US
- The Open PV Project (NREL)
 - Database of contributed public data for photovoltaic (PV) installation data for the US
 - Utilized by LBNL for their annual *Tracking the Sun* report
- PVDAQ – PV Data Acquisition (NREL)
 - PV performance data collected by NREL for systems throughout US



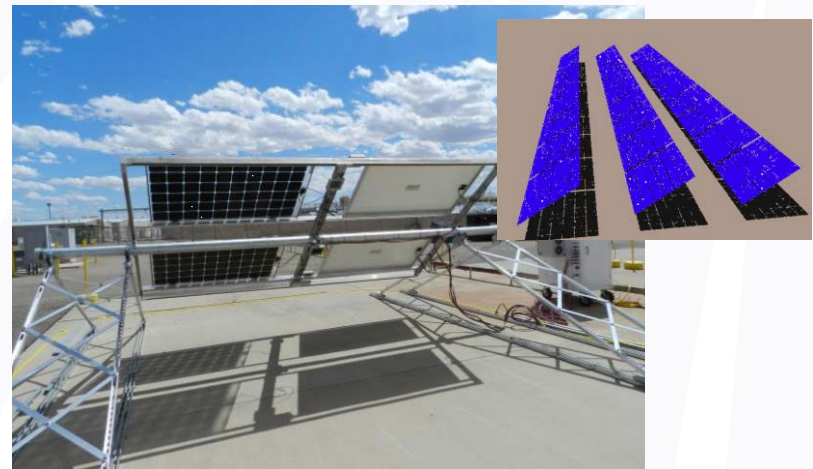
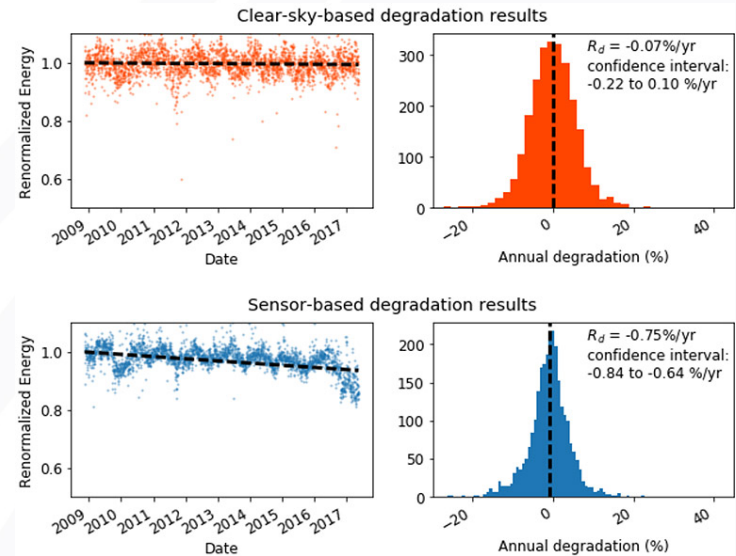
Available Performance Modeling Tools

- PVLIB (Sandia)
 - PV performance modeling functions for simulating performance of PV systems
- SAM (NREL)
 - Detailed performance and financial model to facilitate decision making
- PVWatts (NREL)
 - Basic solar modeling tool that calculates PV energy production based on minimal inputs



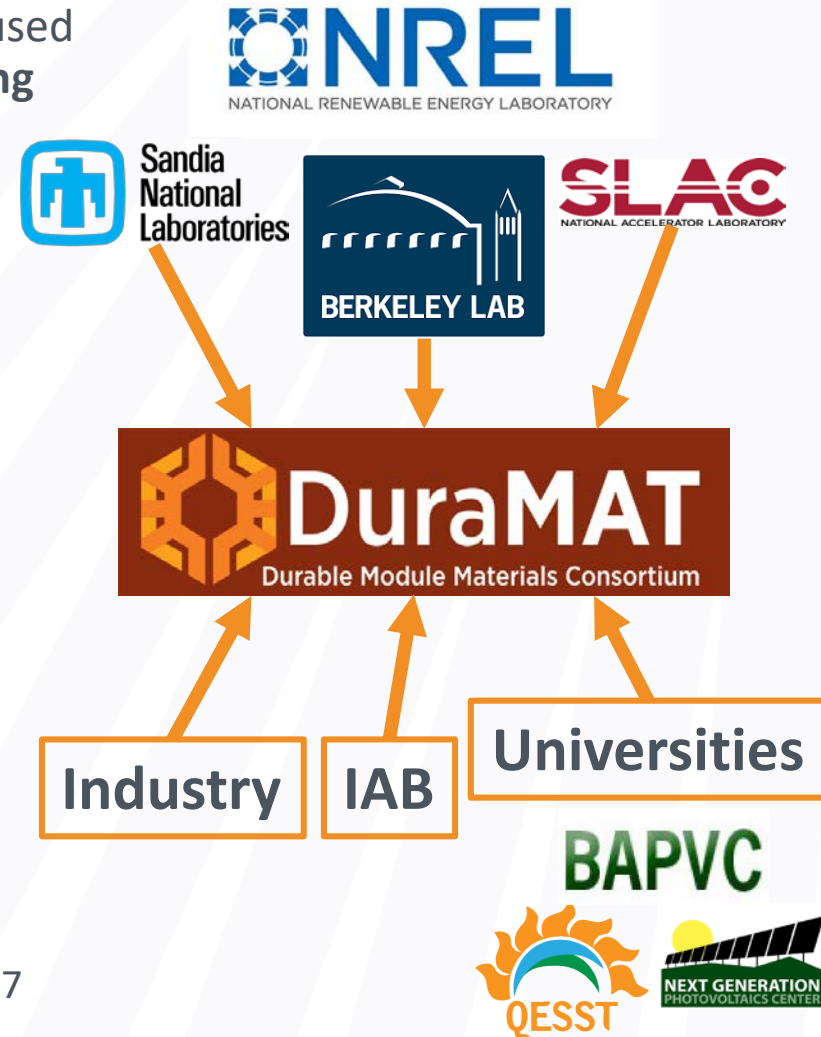
Available Performance Modeling Tools

- RdTools (NREL)
 - Analysis of photovoltaic time-series data, used primarily to evaluate system degradation rates
 - Uses PVLIB functions
- Pecos (Sandia)
 - Monitor system performance of time series data
- Bifacial Performance Models (Sandia, U. Iowa, NREL)

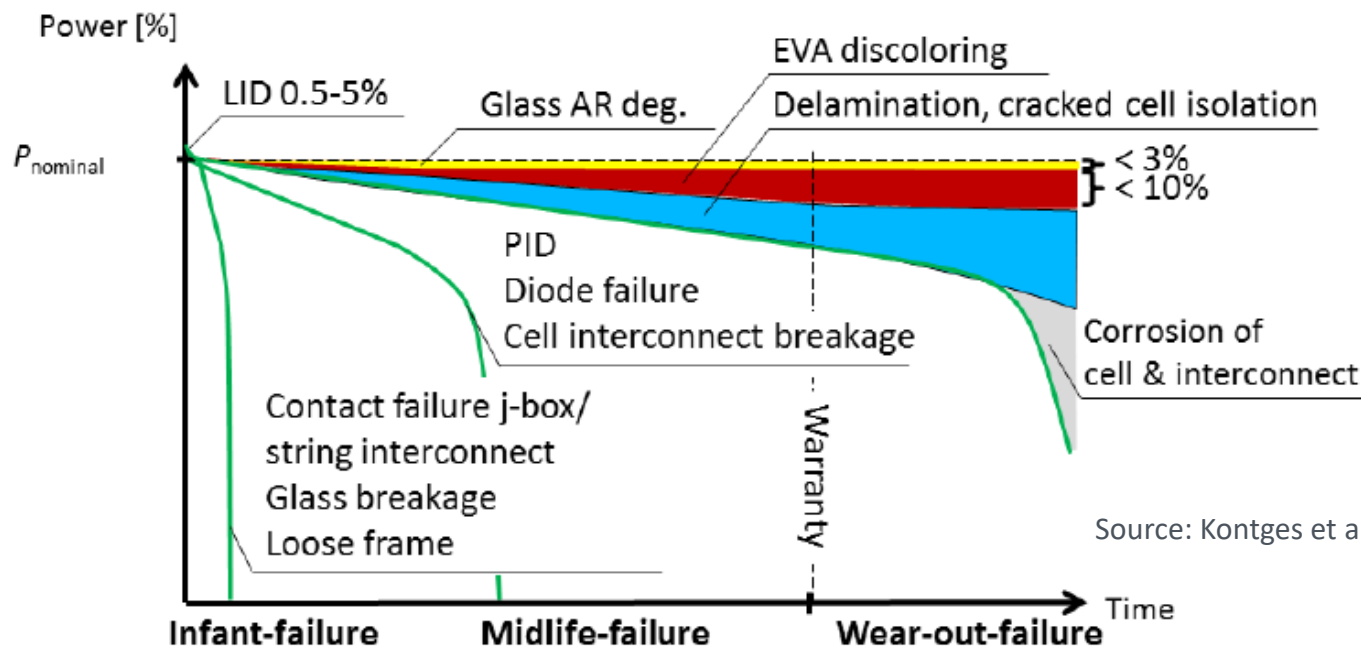


The DuraMAT Consortium – Durable Module Materials

- 5-year Energy Materials Network consortium focused on precompetitive research into **module packaging**
 - Teresa Barnes at NREL Director
 - Margaret Gordon at Sandia Deputy
- **Who Is Involved**
 - PV industry: R&D goals
 - National Labs: capability expertise
 - Universities: research infrastructure
- **Goal**: Accelerate PV module material design and improve durability
- **Industrial Advisory Board (IAB)**
 - 15 members, open to new members
 - Guides scope of projects and research focus
- Projects underway
 - 6 national lab capability development projects
 - 8 university research projects
 - 3 collaborative industry-lab projects, funded in 2017
 - 4 Spark projects (2 active, 2 selected)



Reliability and Durability Research Challenges



- Connect **specific bills of materials** and **climates** to degradation patterns?
- Can we connect **field performance** to **BOM** and **system** components?
- Develop more accurate and shortened **accelerated tests**?
- Can **physical models** describe the degradation mechanisms induced by accelerated tests and field exposure?

DuraMAT Lab Capabilities



Data Mgmt. and Informatics

Lead: Anubhav Jain, LBNL

Infrastructure: Build data hub

Demonstration Project: PVDAQ



Predictive Simulation

Lead: Kevin Leung,
Sandia

Demonstration Project: Build full-size
high aspect ratio module simulation
toolset



Materials Forensics

Lead: Mike Toney, SLAC

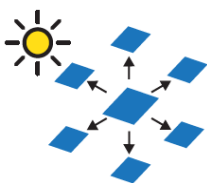
Demonstration Project: Multi-
functional anti-soiling/AR coating,
backsheet degradation, encapsulant
adhesion



Module Prototype and Testing

Lead: Peter Hacke, NREL

Demonstration Project: Combined
Accelerated Stress Test of backsheets



Field Testing

Lead: Bruce King, Sandia

Demonstration Project: Development of
non-destructive field test methods
Infrastructure: Upgrade data transfer

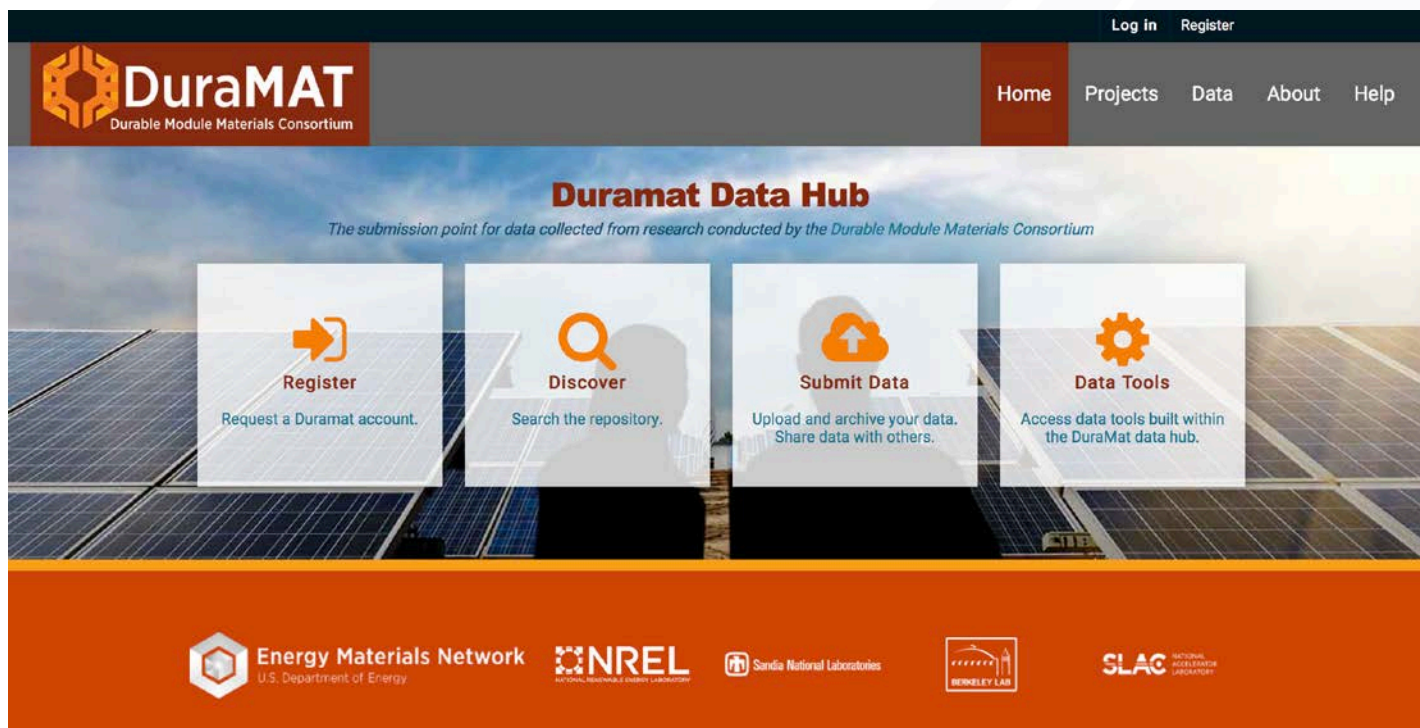


Technology to Market

Lead: Mike Woodhouse, NREL

Infrastructure: Provide economic
guidance impacts of capabilities and
projects, critical industry issues

DuraMAT Data Hub – A path Toward Integration



- C-KAN database platform and analysis tools up at:
 - <https://datahub.duramat.org>
- Anubhav Jain and Ben Ellis @LBNL, Robert White @NREL

DuraMAT Data Hub Vision

- Design, build, and deploy a secure data hub for highly heterogeneous data from many institutions that allows access and analysis to enable new discoveries

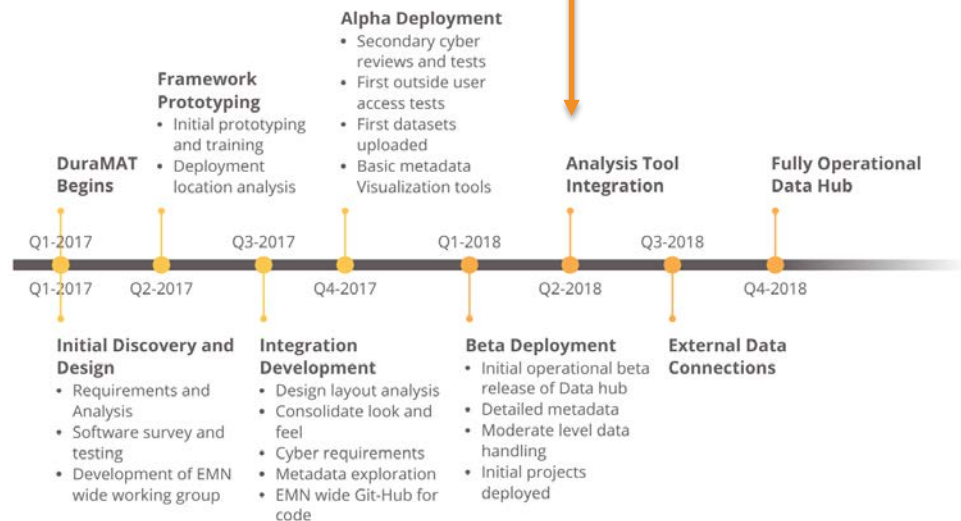
- Goals for Data Hub

- Scalable custom data platform
- Leverage “big” time-series data
- Include BOM and system components
- Standard data and metadata formats
- Data visualization
- Data security



- Next steps:

- PVDAQ performance data
- Building out analysis tools
 - Cloud based
- Stakeholder feedback / input
- Integration of PV Lifetime / RTC
- Integration w/ PVLIB & RdTools



DuraMAT Datahub Dashboard: Initial Analysis Tools

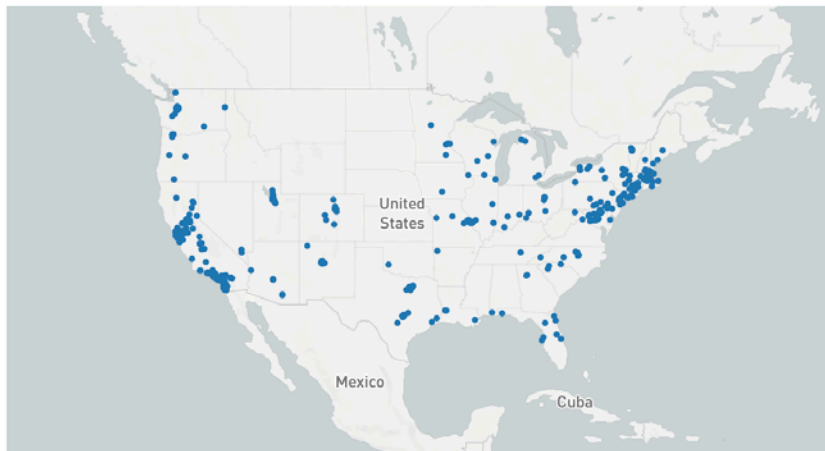
[Home](#) [Degradation](#) [Clear sky detection](#) [Submit an issue](#) [DuraMAT](#) [DataHub](#)



PV Degradation Dashboard

Explore PV performance and degradation data over time. Select sites on the map by clicking them or by selecting them in the table to the right. Sites can be de-selected by clicking them on the map a second time, or by un-checking them in the table. Once you have selected the desired sites, scroll down for additional options and analysis. Summary statistics for the sites you have chosen will be presented at the end.

Systems overview



<input type="checkbox"/>	ID	System Na	System Siz	State	County	Latitude	Longitude	Active Days
<input type="checkbox"/>	1095	FewsFord	2160	North Car	Orange	36.106698	-79.14550	1920
<input type="checkbox"/>	1384	Eric's Syst	2760	Minnesota	Ramsey	44.914573	-93.16252	2575
<input type="checkbox"/>	1421	Bartfamily	3360	Maryland	Harford	39.483937	-76.30159	2551
<input type="checkbox"/>	1519	Ohiobiker	9870	Ohio	Hocking	39.575973	-82.40938	1759
<input type="checkbox"/>	1533	University	16660	Washingto	Pierce	47.230402	-122.5327	2994
<input type="checkbox"/>	1740	Bill's 2 axi	11040	Pennsylva	Lebanon	40.346434	-76.42364	2194
<input type="checkbox"/>	1865	chewie8ha	7650	Pennsylva	Chester	39.957501	-75.91735	2268
<input type="checkbox"/>	2088	Marlborou	6900	Massachu	Middlesex	42.349708	-71.59400	2235
<input type="checkbox"/>	2258	Ocean PV	10340	New Jerse	Monmout	40.246036	-74.03071	2063
<input type="checkbox"/>	2912	Kaneohe	3961	Hawaii	Honolulu	21.399945	-157.8064	1993

Interactive map of tracked systems

- Zoomable
- Select sites for further analysis

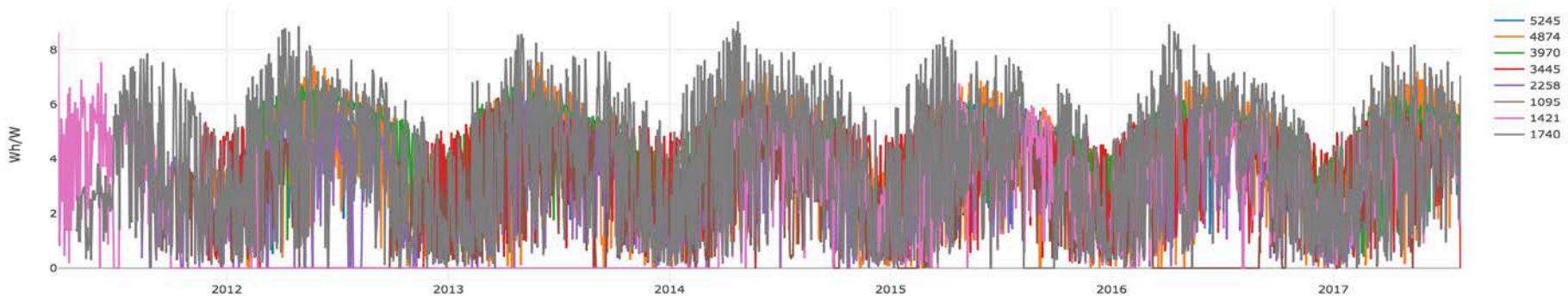
System metadata

- Filterable/searchable
 - Select sites for further analysis

Time-Series System Performance Data

Selected Sites

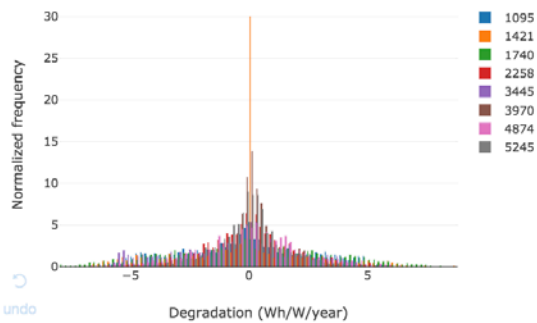
Set data filters, smoothing strategies, and degradation rate calculation methods



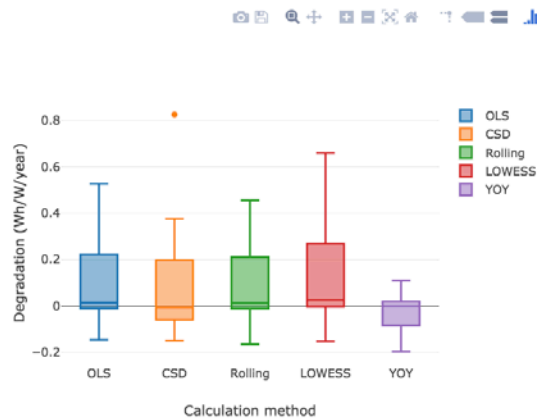
Visualize raw system data

Planning to include more rate calculation methods and data cleaning methods from open-source tools (RdTools, PVLlib, Pecos, etc)

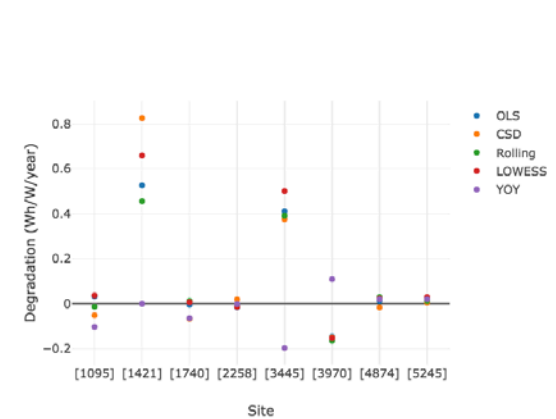
YOY degradation



Degradation by calculation method



Degradation by site



IV Monitoring and Analytics Dashboard

IV Curve Analytics

Explore statistics of mismatching and PV parameters over time. Summary tab is only affected by which strings are chosen. Scatter and density plots can be further explored by plotting parameters against one another. Set number which strings and axes to plot and press 'Run analysis' button. If any parameters are changed, you must press 'Run analysis' again to update the plots. Be patient if you have selected more than a few strings!

Select individual systems to investigate

Select strings: 1 2 3 4

X-axis values: Irrad

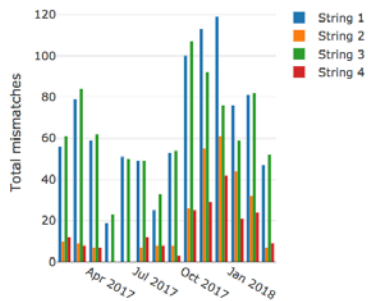
Y-axis values: Ff

Filter outliers (IQR): True False

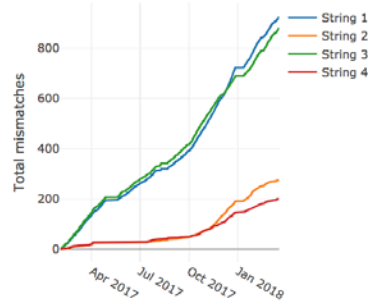
Set parameters:

Summary | Scatter plots | Density plots

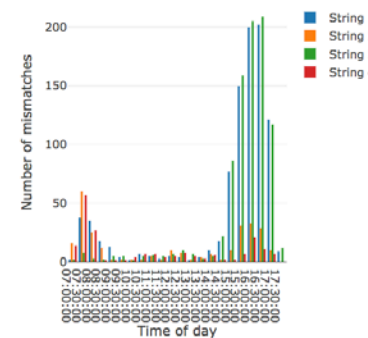
Monitor mismatching events in string-level IV curves



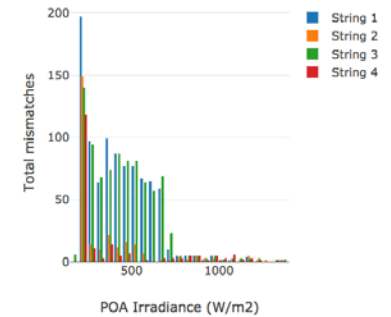
Mismatches per month over system lifetime



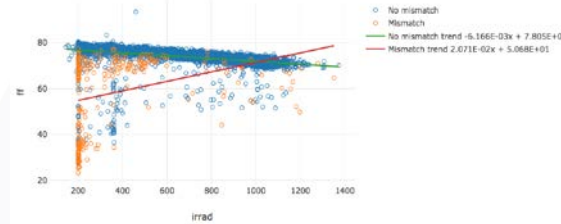
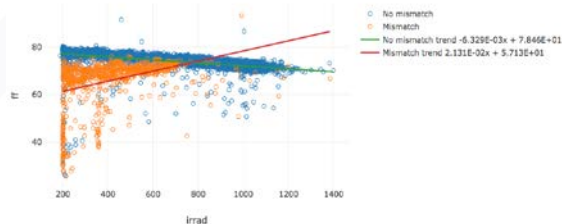
Cumulative mismatches over system lifetime



Mismatching incidents by time of day



Mismatching incidents per irradiance



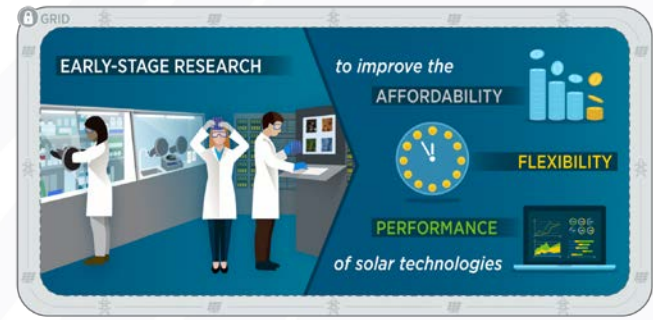
- **DuraMAT Data Hub**
 - What **dream dataset** would you like to see in the Data Hub?
 - What types of **analytic tools** would be most helpful?
 - What dataset related to module durability would you be **open to contributing to the Hub?**
- **Expanding DuraMAT Capabilities**
 - Are there capabilities from industry, universities, or national labs that **you could contribute to the DuraMAT network?**
 - What other **capabilities would you like to see?**
- **DuraMAT Research Funding**
 - Are there **R&D projects or tools** that you could propose to DuraMAT funding opportunities to work with the capability network?
 - Next industry and academic funding opportunity coming in soon
 - www.duramat.org

Toward an Integrated System Performance Platform

- DOE sees an opportunity to **leverage the DuraMAT Data Hub** as a resource to **integrate open tools and platforms**
 - Leverage activities across the program
 - Integrate performance data, system design, accelerated testing, and field testing
- Provide **web-based time-series performance database** and **toolset** to build an analysis platform for system performance and design
 - With opportunities for both **public (open)** and **proprietary data**
 - Analysis of large time-series performance datasets to **identify degradation mechanisms** and **establish degradation rates** for products and systems based on BOM and components
- **Hub** for **qualification** data and **performance** data to bridge the gap between the two sides of the PV industry
 - Link PV modules and systems due diligence to field performance
 - Enable improved system reliability and reduce risk and finance costs through open data formats, database, and tools

DOE SETO 2018 Funding Opportunity Announcement

- SETO issued 2018 FOA for \$105.5M in funding
 - Projects that address the affordability, flexibility, and performance of solar technologies on the grid
 - www.energy.gov/eere/solar/



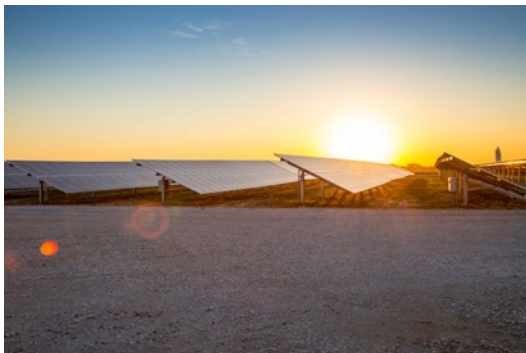
- Rapidly approaching due dates:
 - **Friday, May 4th**, 3PM Eastern –Letter of Intent
 - **Wednesday, May 9th**, 3PM Eastern – Concept Paper
 - June 26th, 3PM Eastern – Full and SIPS Applications due
 - Selection notifications expected in September



- FOA Topics
 - Topic 1: Advanced Solar Systems Integration Technologies
 - Topic 2: Concentrating Solar Power Research and Development
 - Topic 3: Photovoltaics Research and Development
 - Topic 4: Improving and Expanding the Solar Industry through Workforce Initiatives



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Thank You!

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