

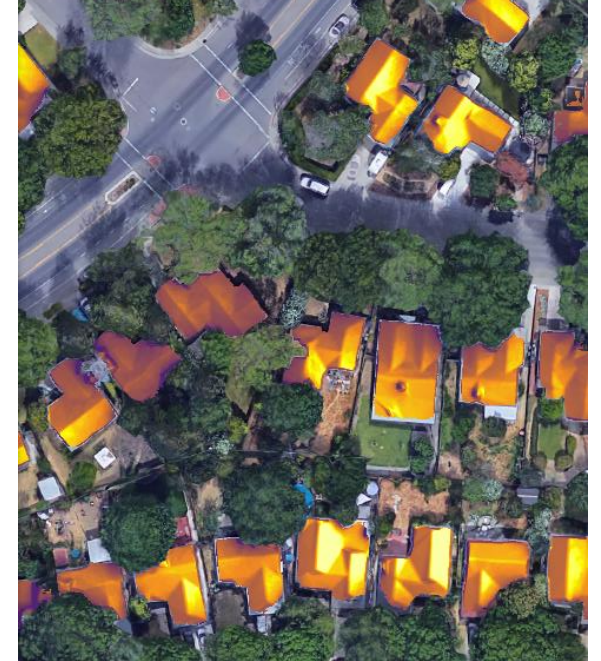
# PV Performance Modeling: A 10-Year Retrospective

## *PVPMC 10 – Albuquerque, NM*

Ben Bourne | May 2, 2018

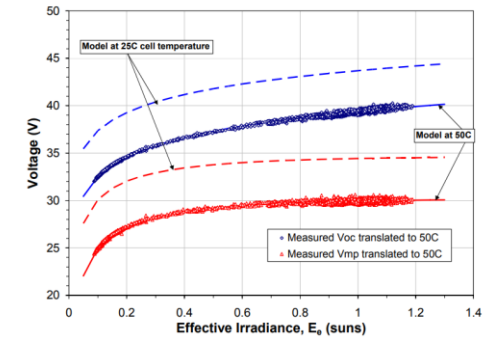
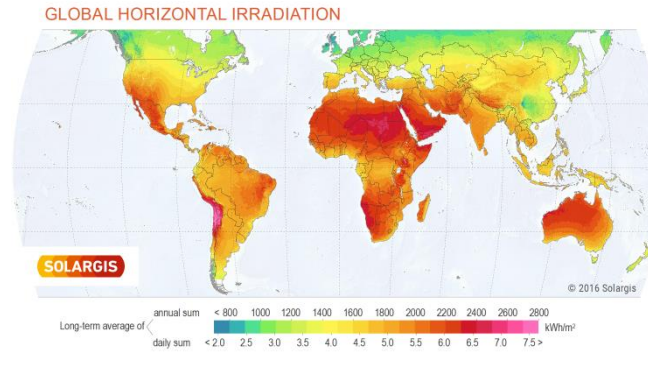
# PV Performance Modeling: A 10-Year Retrospective

- Objectives of the PV modeling community
  - Minimize modeling bias error for valuating PV project investments
  - Minimize uncertainty to improve customer confidence and financing terms
- State of PV performance modeling in 2007
- Where we focused our efforts between 2007 & 2018
- Most impactful gains during the past 10 years
- Remaining gaps that need our attention



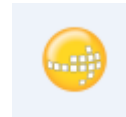
# PV Performance Modeling: A 10-Year Retrospective

- Solar Resource Data
- Environmental Losses
- PV Module & Array Models
- Balance of System Losses
- PV Performance Characterization & Data Management
- PV Modeling & Design Tools



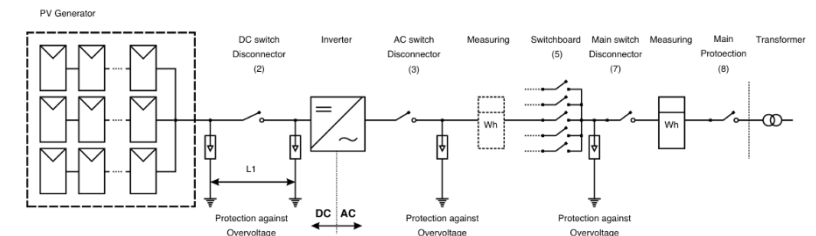
aurora

PVWatts<sup>®</sup> Calculator



HelioScope

PLANT PREDICT



# Solar Resource Data

## Synthetic TMY

## Ground TMY

## Satellite TMY/TS

## Sky Models

2007

<ul style="list-style-type: none"> <li>- Meteonorm</li> </ul>	<ul style="list-style-type: none"> <li>- National Solar Resource Database (NSRDB)/TMY2 (US)</li> <li>- European Solar Resource Atlas (ESRA)</li> </ul>	<ul style="list-style-type: none"> <li>- PVGIS (Monthly)</li> <li>- 3Tier</li> <li>- Solar Radiation Data (SoDa)</li> <li>- SolarGIS</li> </ul>	<ul style="list-style-type: none"> <li>- Radiative transfer clear sky models (Bird, SMARTS, Rest2, ESRA)</li> <li>- Direct beam models (DISC, DIRINT)</li> <li>- Attenuation (Linke turbidity, Air Mass, AOD, water vapor)</li> <li>- Diffuse transposition (Perez, Hay-Davies)</li> </ul>
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<ul style="list-style-type: none"> <li>- Emergence of satellite data for model improvement</li> </ul>	<ul style="list-style-type: none"> <li>- Increasing number of prospecting stations</li> <li>- Growing fleet of commercial PV ground met stations</li> </ul>	<ul style="list-style-type: none"> <li>- Improved satellite resolution</li> <li>- More ground calibration data</li> </ul>	<ul style="list-style-type: none"> <li>- IR channel in satellite data used to improve albedo interpretation</li> <li>- Improved NWP models</li> <li>- Aerosol depth (AOD) ground measurements</li> </ul>
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2018

<ul style="list-style-type: none"> <li>- Meteonorm (enhanced by satellite data)</li> </ul>	<ul style="list-style-type: none"> <li>- NSRDB/TMY3</li> <li>- <b>Site-Adapted TMY</b></li> </ul>	<ul style="list-style-type: none"> <li>- 3Tier</li> <li>- SolarGIS</li> <li>- PVGIS</li> <li>- SolarAnywhere</li> <li>- NSRDB</li> <li>- NEDO (Japan)</li> <li>- HelioClim/SoDa</li> </ul>	<ul style="list-style-type: none"> <li>- Sufficient model accuracy (annual)</li> <li>- Seasonal bias remains</li> <li>- Uncertainty in data limiting continued backcast &amp; forecast accuracy (ground data, satellite resolution &amp; coverage, atmospheric scattering &amp; absorption)</li> </ul>
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# Environmental Losses

## Soiling Losses

## Snow Losses

## Shade Losses

2007

- Fixed-rate soiling
- Dynamic model (Kimber *et al.*)

- No models available

- PVSyst – Inter-array shade tool
- PVWatts - Shade vs. GCR response curves (from SunPower)
- No diffuse shade models



- GW of PV fleet data in arid and wet climates
- Soiling measurement devices
- Robotic washing
- Anti-soiling coating research
- Analytical diagnostic methods

- GW of PV fleet data in winter climates
- Snow accumulation tests & publications

- 3D data & tools becoming publicly available for use & integration
- Diffuse shade understanding & model development
- Shade-resistant technologies (micro-inverters, cross-tied cSi modules, etc.)

2018

- Soiling well understood in most NA/EU locations (wet & dry)

- Rain data critical in dry climates
- Still very few publicly-available dynamic soiling models
- Challenges in desert climates

- In-house industry calculators
  - DNV-GL snow model
  - SunPower dynamic model (PVSIm)

- Snow data critical for effective model accuracy

- Many industry tools with shade capabilities

- Still little-to-no technology-specific shade response distinction among the most prominent tools
- High uncertainty from site conditions

# Optical Models & Surface Treatments

	Angular Response	Bifacial Models	Anti-Soiling Coating
2007	<ul style="list-style-type: none"> <li>- Fresnel model</li> <li>- Sandia polynomial AOI modifier function – <math>f(\text{AOI})</math></li> <li>- PVSyst point/interpolation model</li> </ul>	<ul style="list-style-type: none"> <li>- Early bifacial modules in production</li> <li>- No bifacial models available</li> </ul>	<ul style="list-style-type: none"> <li>- No anti-soiling solutions available</li> </ul>
↓	<ul style="list-style-type: none"> <li>- Technologies with cell-surface texturing and/or anti-reflective glass coatings no longer follow basic Fresnel equations</li> </ul>	<ul style="list-style-type: none"> <li>- Limited but emerging interest in BF technologies</li> <li>- Ray-tracing models used to characterize BF response</li> <li>- View factor (VF) models for speed</li> <li>- IEC 60904 updated for BF testing</li> </ul>	<ul style="list-style-type: none"> <li>- Increasing PV development in high-soiling environments (Middle East + isolated soiling environments)</li> <li>- Anti-soiling coating technologies emerging</li> <li>- Anti-soiling studies (NREL, TUV, ASU)</li> </ul>
2018	<ul style="list-style-type: none"> <li>- Models have the ability to distinguish between PV cell/glass/laminate designs</li> <li>- Need to accommodate <math>f(\text{AOI}) &gt; 1</math></li> </ul>	<ul style="list-style-type: none"> <li>- Bifacial models being offered and implemented in modeling tools                             <ul style="list-style-type: none"> <li>• Open source – NREL, SunPower</li> <li>• PVSyst</li> </ul> </li> <li>- Validation work still needed</li> </ul>	<ul style="list-style-type: none"> <li>- Production coatings</li> <li>- Promising results – with cost trade-off</li> </ul>

# PV Module & Array Performance Models

	PV Model	Thermal Model	Spectral Response
2007	<ul style="list-style-type: none"> <li>- Diode-equivalent models</li> <li>- Sandia Array Performance Model (SAPM)</li> <li>- 5-Parameter</li> <li>- PVWatts constant-efficiency model</li> </ul>	<ul style="list-style-type: none"> <li>- Energy balance methods (Fuentes, PVSyst)</li> <li>- Empirical methods (Sandia)</li> </ul>	<ul style="list-style-type: none"> <li>- EQE</li> <li>- Sandia Air Mass Modifier – f(AMa)</li> </ul>
↓	<ul style="list-style-type: none"> <li>- Loss Factors Model (Steve Ransome / Gantner)</li> <li>- Analytical methods for quantifying system degradation</li> </ul>	<ul style="list-style-type: none"> <li>- Very little focus on thermal model improvements</li> </ul>	<ul style="list-style-type: none"> <li>- Impact of atmospheric water content on cell spectral response (First Solar)</li> </ul>
2018	<ul style="list-style-type: none"> <li>- Degradation element accounts for changing voltage &amp; current electrical response over time</li> <li>- Still no “perfect” PV model</li> </ul>	<ul style="list-style-type: none"> <li>- Poor industry guidance for modeling product-specific thermal performance</li> <li>- <i>Need a test standard for deriving thermal response coefficients</i></li> <li>- High uncertainty in wind speed data and model use</li> </ul>	<ul style="list-style-type: none"> <li>- First Solar’s precipitable water model</li> <li>- Sandia f(AMa) does not accurately characterize module spectral response in all locations</li> </ul>

# Balance of System Losses

	DC Wiring Losses	Inverter Model	AC Collection Losses	Grid Interaction
2007	<ul style="list-style-type: none"> <li>- Constant wiring loss</li> <li>- Simple dynamic wiring loss model</li> </ul>	<ul style="list-style-type: none"> <li>- Constant efficiency</li> <li>- Simple <math>\eta(P, V)</math></li> <li>- Simple operating limits</li> </ul>	<ul style="list-style-type: none"> <li>- Constant AC wiring loss</li> <li>- Constant transformer loss</li> <li>- Combined xfmr losses</li> <li>- No nighttime &amp; aux load losses</li> </ul>	<ul style="list-style-type: none"> <li>- No models available</li> <li>- Unavailability not factored into energy models</li> </ul>
↓	<ul style="list-style-type: none"> <li>- Complex configurations</li> <li>- Optimized stringing</li> <li>- DC Optimizers</li> <li>- Combine-as-you-go DC harnessing</li> </ul>	<ul style="list-style-type: none"> <li>- Microinverters</li> <li>- Temperature-dependent capacity</li> <li>- Multiple MPPTs</li> <li>- Power Factor control</li> </ul>	<ul style="list-style-type: none"> <li>- TL inverters</li> <li>- Storage integration</li> </ul>	<ul style="list-style-type: none"> <li>- Reactive power control</li> <li>- Grid curtailment</li> <li>- Grid interconnection limits</li> <li>- Storage integration</li> </ul>
2018	<ul style="list-style-type: none"> <li>- Constant wiring loss</li> <li>- Simple dynamic wiring loss model</li> <li>- Design-specific dynamic loss model</li> </ul>	<ul style="list-style-type: none"> <li>- Many in-house post-processors for handling complex array/grid interaction</li> <li>- Need updated general modeling approach</li> </ul>	<ul style="list-style-type: none"> <li>- Constant AC wiring loss</li> <li>- Constant transformer loss</li> <li>- Combined xfmr losses</li> <li>- Nighttime &amp; aux load losses considered</li> <li>- Most tools don't provide all grid-interaction dynamics</li> </ul>	<ul style="list-style-type: none"> <li>- Grid control schemes need to be implemented</li> <li>- System downtime and external curtailment always difficult to predict – <i>timing, duration, magnitude</i></li> </ul>



# PV Performance Characterization & Data Management

	Characterization Methods	Characterization Data	Data Management
2007	<ul style="list-style-type: none"> <li>- STC (indoor, outdoor)</li> <li>- PTC (indoor)</li> <li>- Sandia outdoor performance test to support SAPM</li> </ul>	<ul style="list-style-type: none"> <li>- Diode model coefficients                             <ul style="list-style-type: none"> <li>• Lab measurements</li> <li>• best-fit</li> </ul> </li> <li>- SAPM coefficients</li> <li>- CEC/PTC ratings</li> </ul>	<ul style="list-style-type: none"> <li>- Sandia/SAM DB</li> <li>- Photon</li> <li>- CEC</li> </ul>
↓	<ul style="list-style-type: none"> <li>- IEC 61853 1-4                             <ul style="list-style-type: none"> <li>• Efficiency vs. irradiance</li> <li>• Temperature coefficients</li> <li>• Spectral response</li> <li>• Angular response</li> </ul> </li> <li>- IEC 60904 update for Bifacial</li> </ul>	<ul style="list-style-type: none"> <li>- Methods for deriving model coefficients from IEC matrix data</li> <li>- Split-cell technologies change the efficiency profile of c-Si technologies</li> </ul>	<ul style="list-style-type: none"> <li>- PV_LIB Toolbox established by Sandia – <i>open-source, documented, peer-reviewed model code for industry use, collaboration and standardization</i></li> </ul>
2018	<ul style="list-style-type: none"> <li>- IEC 61853 test suite adopted by accredited labs</li> <li>- Need to extend 61853 efficiency characterization to bifacial test standard</li> </ul>	<ul style="list-style-type: none"> <li>- IEC 61853 matrix-to-model conversions                             <ul style="list-style-type: none"> <li>• PAN file generation</li> <li>• Sandia coefficient generation</li> </ul> </li> </ul>	<ul style="list-style-type: none"> <li>- IEC 61853 test data need an owner and QC/use standards</li> <li>- IEC 61853 standard needs to be supported &amp; required by industry tools</li> </ul>

# PV Modeling & Design Tools

## Desktop Energy Tools

## Web-Based Energy Tools

## Design Tools

## Open-Source/API

2007

- PVSyst
- SAM
- SolarPro
- PVGrid

- PVWatts
- PVGIS

- None

- None

**Challenge: Feature development vs. Model Integration, Validation & Uncertainty Reduction**



- Slower growth & development than industry growth

- Tool feature advancement
- Web-based for access & scalability
- 3D shading functionality
- Simple residential calculators

- Design feature plug-ins
  - Shade
  - CAD Drawings
  - BOM

- Creation of modeling collaboration, open-source models & code, simulation & database APIs

2018

- **PVSyst**
- SAM
- SolarPro
- RdTools (Degradation)

- PVWatts
- Helioscope
- Aurora
- PVSIM
- PlantPredict
- Google Project Sunroof

- Helioscope
- Aurora
- PVComplete
- SolarPro

- SAM/PVWatts (NREL)
- SimEng/PVAPI
- SolarGIS
- PVWatts
- PlantPredict

# PV Performance Modeling: Biggest Gains & Remaining Gaps

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- Biggest 10-year gains
  - Satellite-based solar Resource data accuracy & accessibility, but at significantly higher cost
  - Web-based energy modeling, design tools, & shading calculators
  - Quantitative methods for degradation analysis
  - IEC 61853 test standard
  - PV\_LIB Toolbox
- Environmental loss gaps
  - Dynamic soiling and snow models need to be implemented in leading industry tools
  - Tools need to account for technology-specific performance: shade-response, low-light response, thermal behavior, etc.
  - Long-term Shade losses are dependent on long-term site conditions – tree management, future development, etc.
- Thermal model gaps
  - Need to establish use standards for wind speed in energy modeling
  - Need a test and derivation standard for thermal response coefficients
- Data management gaps to support test standards
  - Tool developers need to require lab test data and to distinguish all attributes of various technologies
  - PV industry needs an IEC 61853 data warehouse owner

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