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PV Module Model Calibration Using Monitored Data

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Overview

- Goal: extract parameters for module performance models from outdoor electrical measurements
- Best models are obtained using a 2-axis tracker
- Can we obtain 'good enough' models using fixed tilt racking?



Data from systems at fixed tilt

Most common
↓
Least common
Most common
↓
Least common

■ Weather

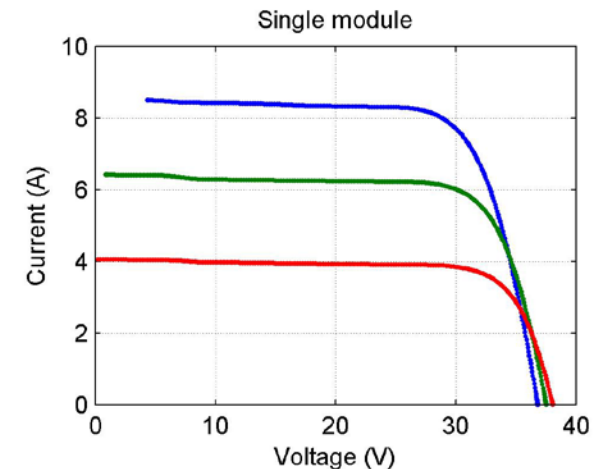
- POA irradiance, air temperature, wind
- GHI (pyranometer)
- DNI, DHI, spectrum

■ Electrical output

- AC Power & voltage
- DC Power & voltage at MP only
- IV sweeps (interrupted inverter operations, reference modules)

We use these data

- Data are filtered for agreement between I_{SC} and POA irradiance
- I_{SC} is often extrapolated at high irradiance



Models Considered

■ Single Diode Model (De Soto)

- IV curve described by single diode equation

$$I = I_L - I_0 \left[\exp \left(\frac{V + IR_s}{nV_T} \right) - 1 \right] - \frac{V + IR_s}{R_{sh}}$$

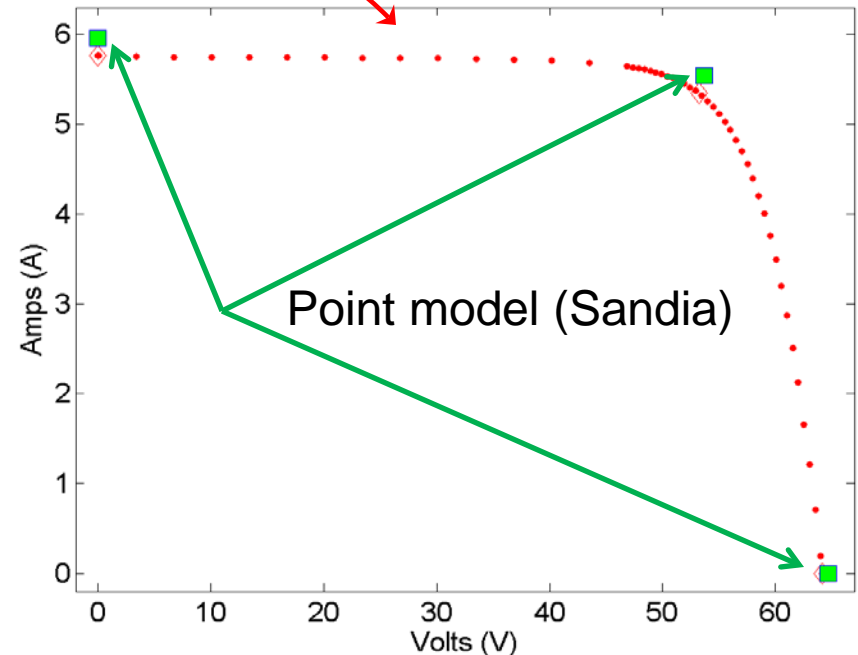
- “5 parameters” – for each IV curve
- Additional equations describe how parameters change with irradiance, temperature

■ Point Model (Sandia)

- Empirical expression for I_{SC} , V_{OC} , P_{MP}

$$I_{MP} = I_{MP0} (C_0 E_e + C_1 E_e^2) (1 + \alpha_{IMP} (T_C - T_0))$$

$$V_{MP} = V_{MP0} + C_2 n N_S \delta(T_C) \ln(E_e) + \\ C_3 N_S (n \delta(T_C) \ln(E_e))^2 + \beta_{VMP} (T_C - T_0)$$



[1] W. De Soto, S. A. Klein, and W. A. Beckman, "Improvement and validation of a model for photovoltaic array performance," Solar Energy, vol. 80, pp. 78-88, 2006.

[2] D. L. King, E. E. Boyson, and J. A. Kratochvil, "Photovoltaic Array Performance Model," Sandia National Laboratories, Albuquerque, NM SAND2004-3535, 2004.

Model Fitting Procedure (SAPM)

- Example: estimating I_{SC0} and spectral modifier $f_1(AM_a)$

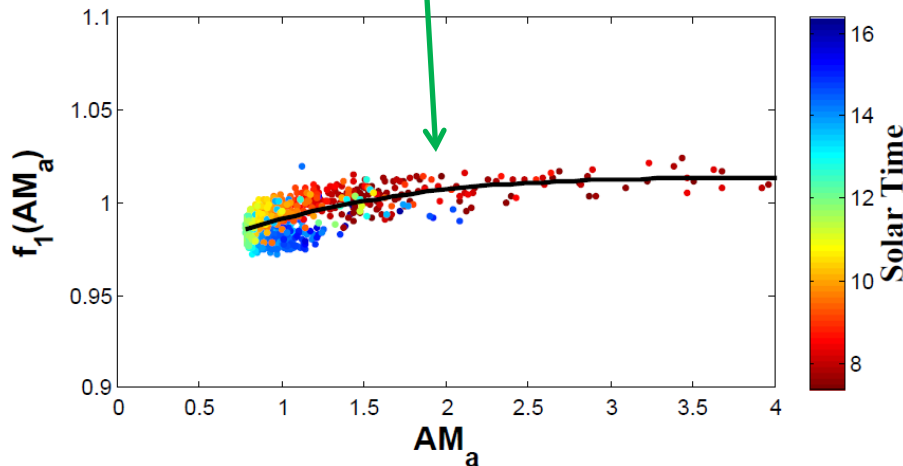
$$I_{SC} = I_{SC0} f_1(AM_a) E_e (1 + \alpha_{SC} (T_c - 25))$$

Measured
IV curve

Measured POA
irradiance

Datasheet
value

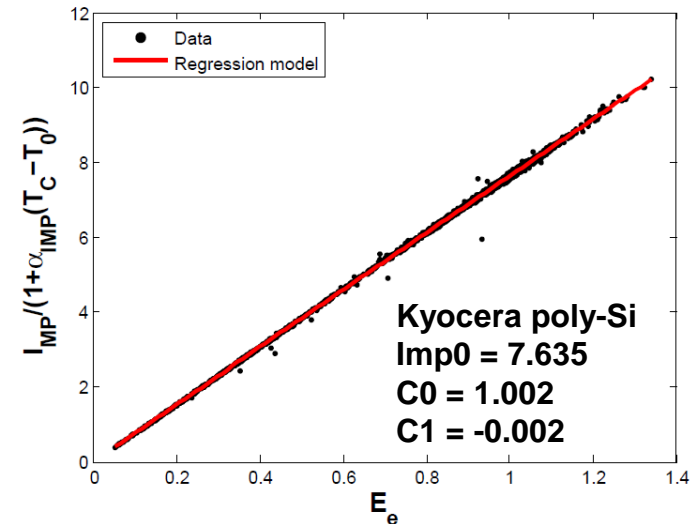
From measured
Back-surface temp.



C. Hansen, D. Riley, and M. Jaramillo, "Calibration of the Sandia Array Performance Model Using Indoor Measurements " 38th IEEE Photovoltaic Specialists Conference, Austin, TX, 2012.

Estimating coefficients for I_{MP}

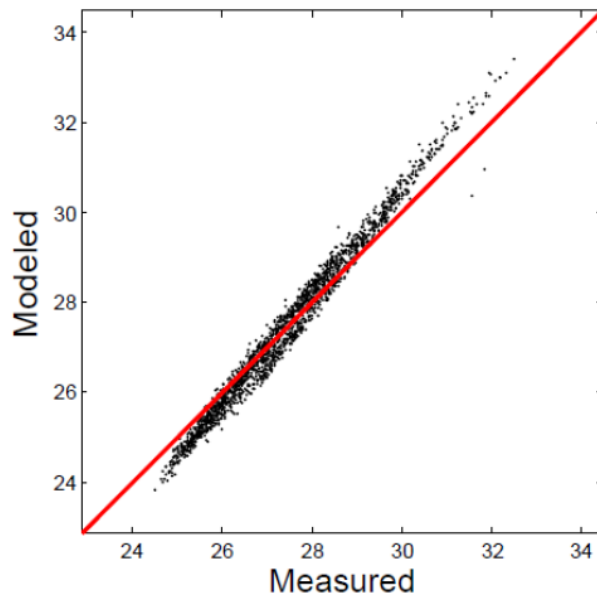
$$I_{MP} = I_{MP0} (C_0 E_e + C_1 E_e^2) (1 + \alpha_{MP} (T_c - T_0))$$



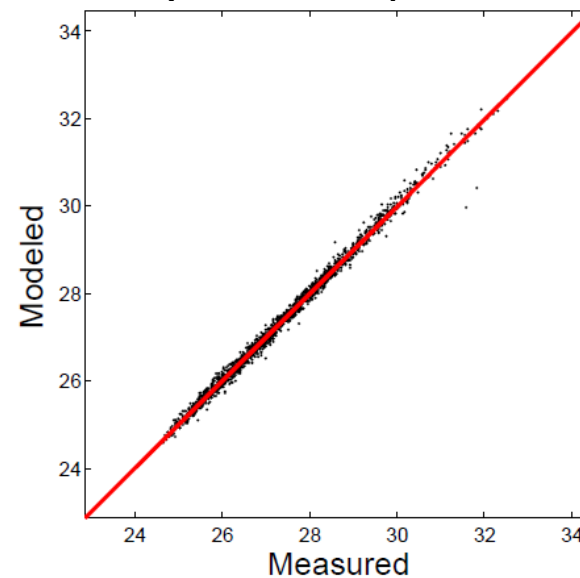
Model Fitting Procedure (SAPM)

- Data sheet temperature coefficients are adjusted

Predicted V_{mp} using
datasheet temp coefficient



Predicted V_{mp} using
adjusted temp. coefficient



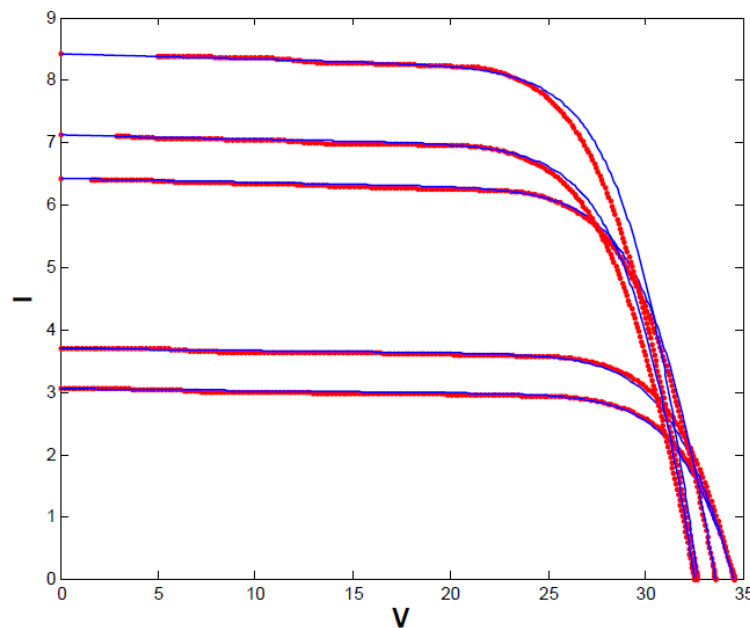
	Datasheet value	Calibrated value
$\beta_{V_{mp}}$	-0.155	-0.124

Model Fitting Procedure (De Soto)

- Fit each IV curve

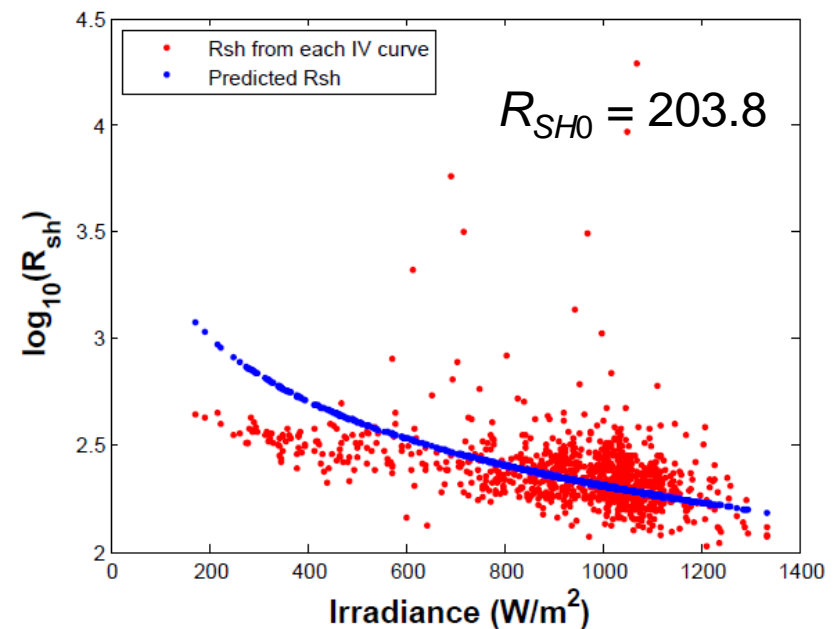
$$I = I_L - I_0 \left[\exp \left(\frac{V + IR_s}{nV_T} \right) - 1 \right] - \frac{V + IR_s}{R_{sh}}$$

Data (red) and model (blue)



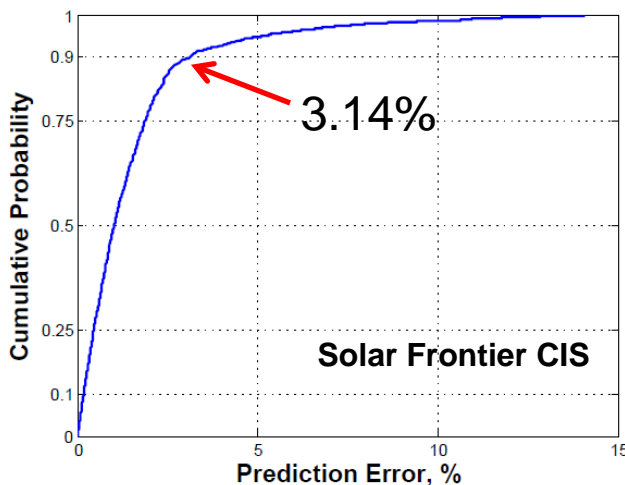
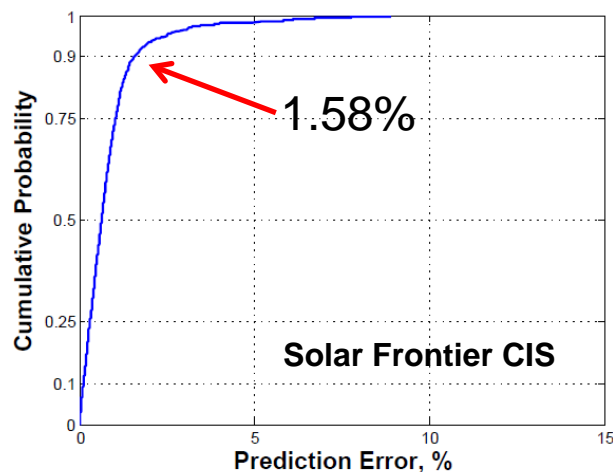
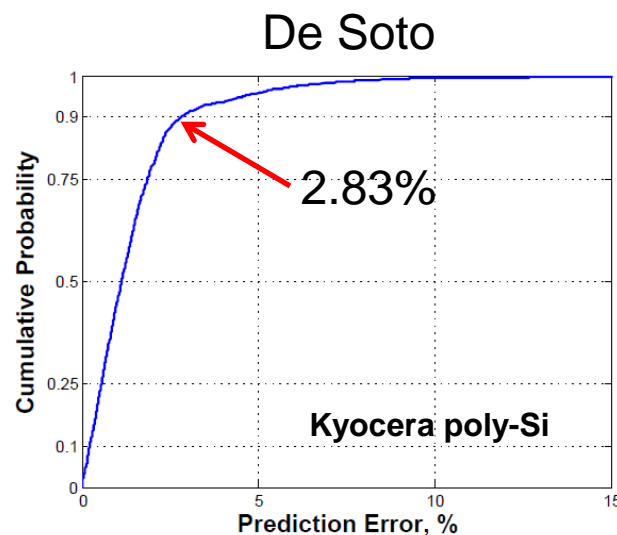
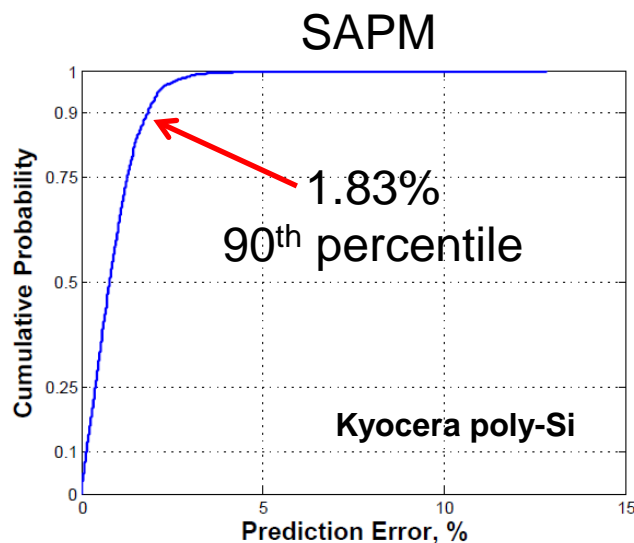
- Regress 5 parameters to irradiance, temperature

- E.g., $R_{sh} = R_{sh0} \frac{E_0}{E}$



C. Hansen, "Estimation of Parameters for Single Diode Models Using Measured IV Curves," 39th IEEE Photovoltaic Specialists Conference, Tampa, FL, 2013.

Results: P_{MP} prediction error



P_{MP} error for
models using 2-
axis tracker data
(90th percentile)

SolarWorld mono-Si
SAPM – 0.81%
De Soto – 1.33%

Yingli poly-Si
SAPM – 0.96%
De Soto – 3.19%

Solar Frontier CIS
SAPM – 0.62%
De Soto – 2.58%

Summary

- Models calibrated using fixed-tilt data have prediction errors similar to models derived from two-axis tracker data

Module	Data Source	Sandia model	De Soto model
Poly Si	Tracker	0.96%	3.19%
	Fixed rack	1.83%	2.83%
CIS	Tracker	0.62%	2.58%
	Fixed rack	1.58%	3.14%

- Data filtering, i.e., agreement between ISC and POA irradiance, is crucial
- Open questions for research:
 - How long of a data record is required for the fixed tilt data?
 - What can we do if we only have power (not full IV curves)?

Thank you