

# Early Life PV System Degradation Evaluation and Modeling Based on Cumulative Exposure to Environmental Stressors



PRESENTED BY

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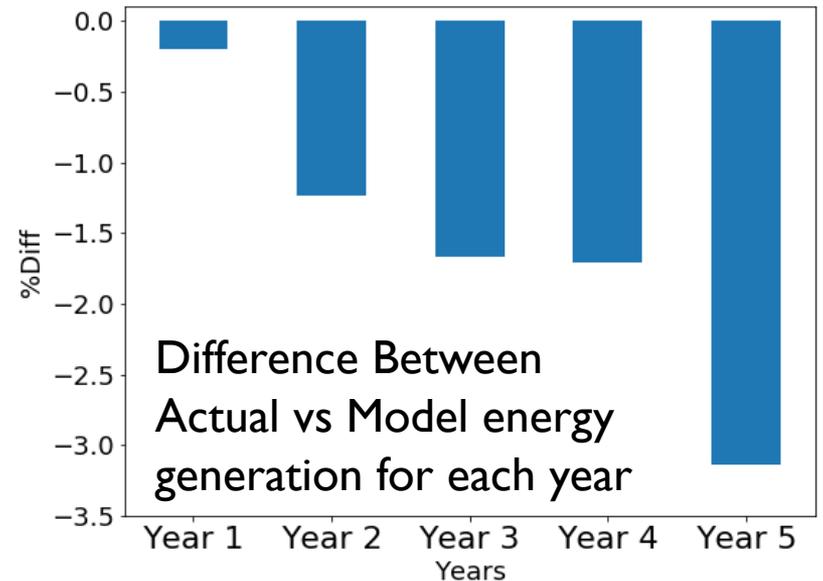
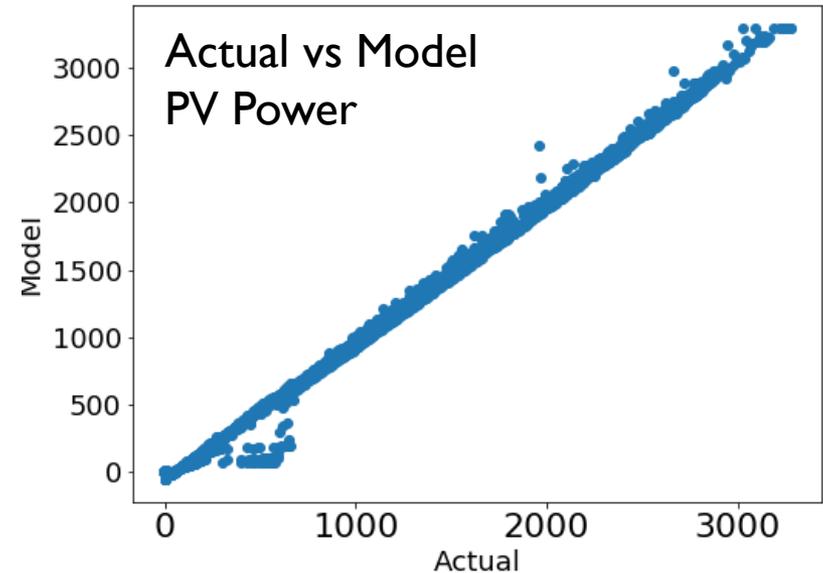


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## Motivation



1. Identify dominate stressor for particular module
  - a. Data-driven approach?
2. Decrease model error caused by degradation
  - a. Method to account for degradation?
  - b. Example Problem:
    - PV System in New Mexico
    - Percent Difference:
      - $\%Diff = (E_{Actual} - E_{Model})/E_{actual}$
    - -3% Diff. After Year 5
    - % Difference Increase =  $\sim 0.6\%/year$

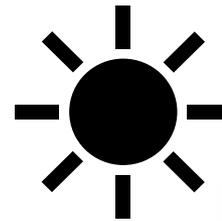


# Proposed Concept



Hypothesis: Cumulative Exposure evaluation methodology can identify stressors and improve multi-year models.

1. Measure/Collect
  - a) Climate
  - b) PV Performance
2. Quantify
  - a) Exposure (amount of stress)
  - b) Performance Changes (loss in output)
3. Analyze - Identify dominate stressor using data
4. Model - Predict degradation based on ..
  - a) Performance in different location
    - a) e.g. performance in FL can be used to predict degradation in NM
  - b) Indoor accelerated testing results
    - a) e.g. use indoor test results to predict degradation



Radiation



Moisture



Temperature/  
Thermal Cycling



Wind



# Test PV Plants





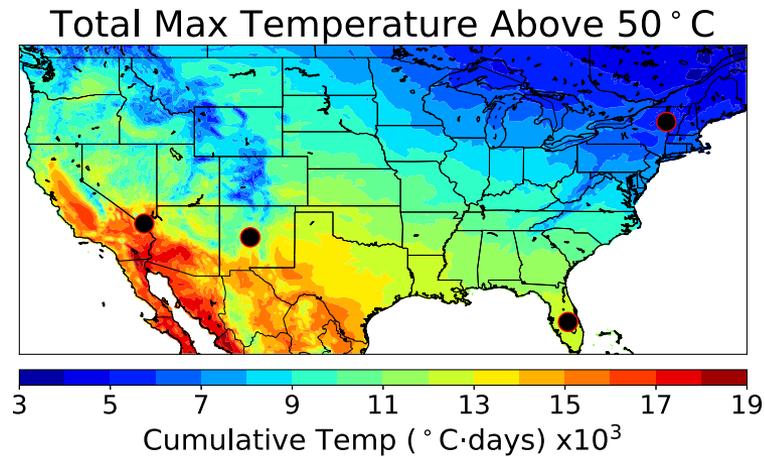
## Systems

1. Regional Test Center Reference  
([pv-dashboard.sandia.gov](http://pv-dashboard.sandia.gov))
1. Size:  $\sim 3.4$  kW
2. 12 Modules in Series
3. Suniva OPT270 Black



## Locations

1. New Mexico
2. Florida
3. Nevada
4. Vermont



## Sensors

1. DC Current & Voltage
2. Plane of Array Irradiance
3. Module Temp. Sensors





# Degradation Stressor Identification





## 1. Translation

$$I_o = \frac{E_o}{E} \left( \frac{I_{actual}}{1 + \alpha(T_m - T_o)} \right)$$

$$V_o = \left( \frac{V_{actual}}{1 + \beta(T_m - T_o)} \right)$$

## 2. Data Quality Filter: Z-Score

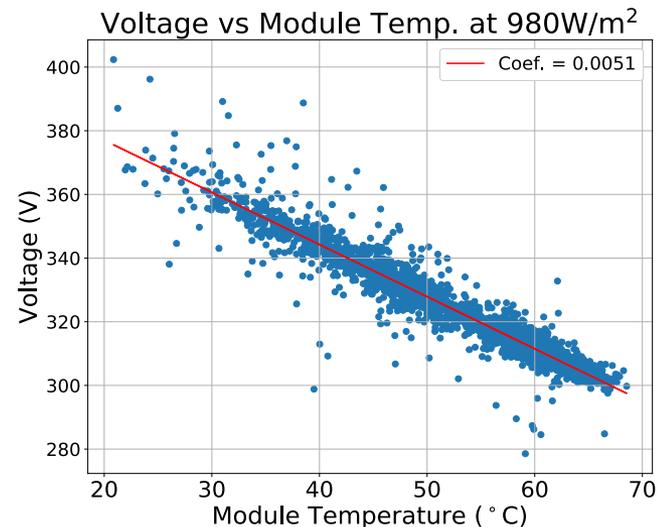
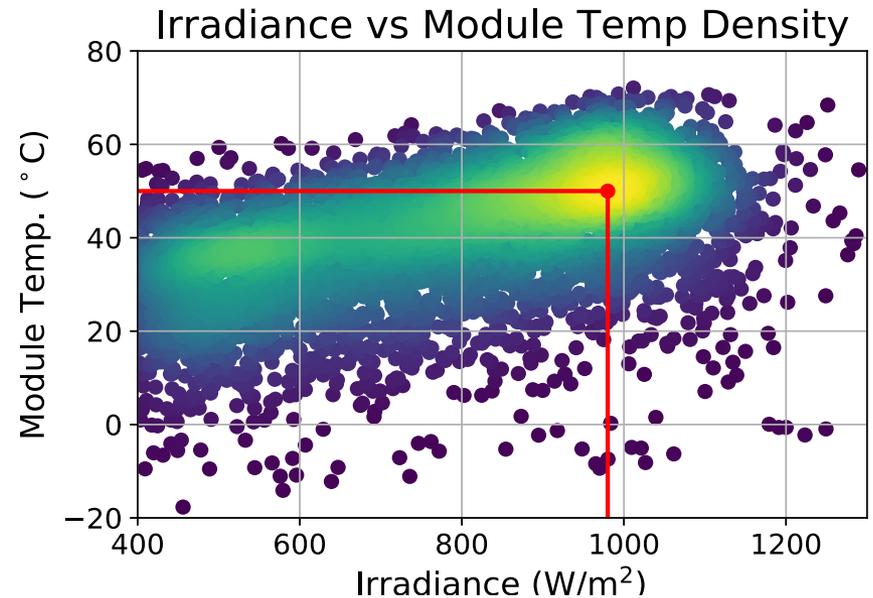
$$Z_{P,i} = \left[ \frac{Y_{P,i} - M_P}{|MAD|} \right]$$

where:

$Y_{P,i}$  parameter at time  $i$ ,

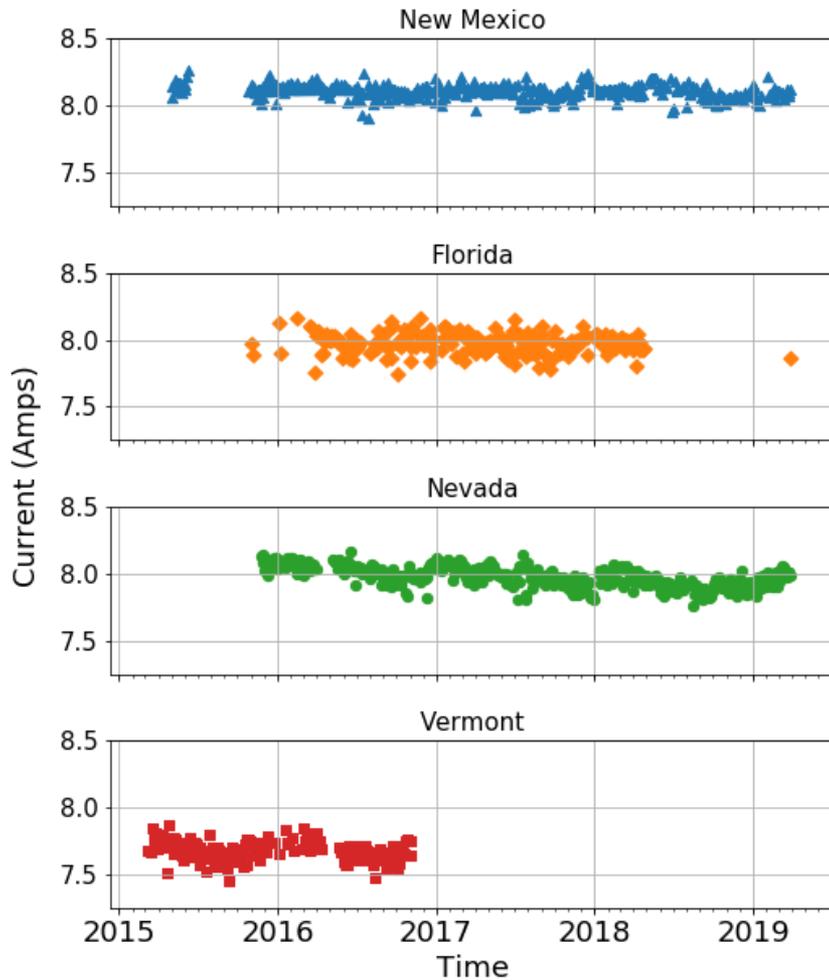
$M_P$  the median, and

$|MAD|$  the median of the absolute deviation

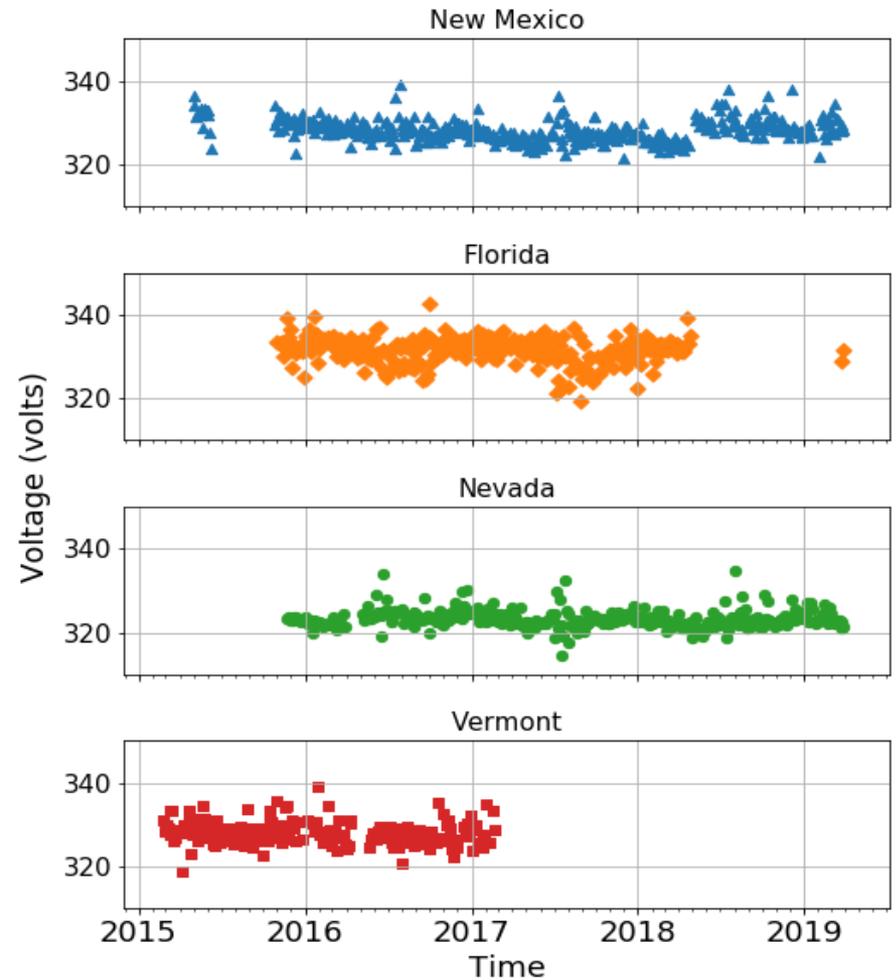




## Translated Max Power Point Current



## Translated Max Power Point Voltage





### 3. Compute Stressor Exposure

- Thermal Cycling [1]

$$CS_{\Delta T} = \sum_{t=0}^n (\Delta T_m(t)) \exp\left(\frac{-Q_a}{k_b T_m(t)}\right)$$

- Wind Load

$$CS_{wind} = \sum_{t=0}^n (P_{wind}(t)) \exp\left(\frac{-Q_a}{k_b T_m(t)}\right)$$

- Humidity [2]

$$CS_{hum} = \sum_{t=0}^n (A) \exp\left(\frac{-Q_a}{k_b T_m(t)}\right) RH(t)^n$$

- Radiation [3]

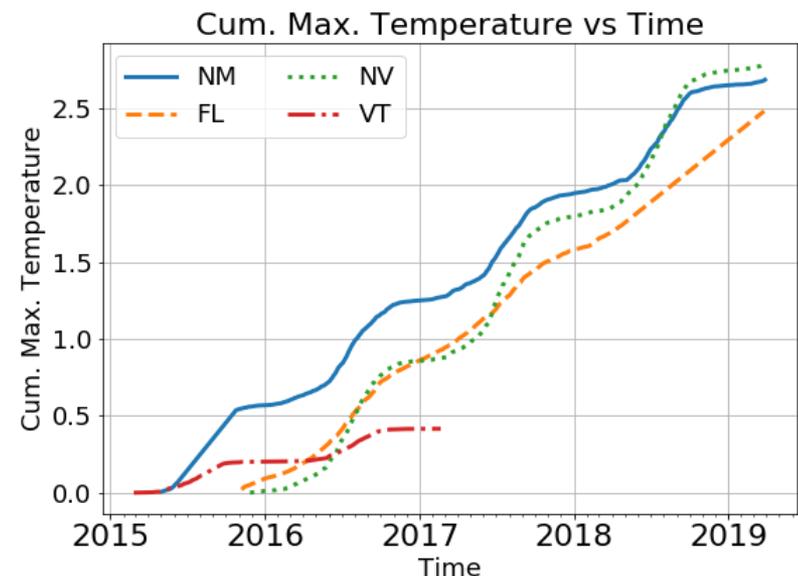
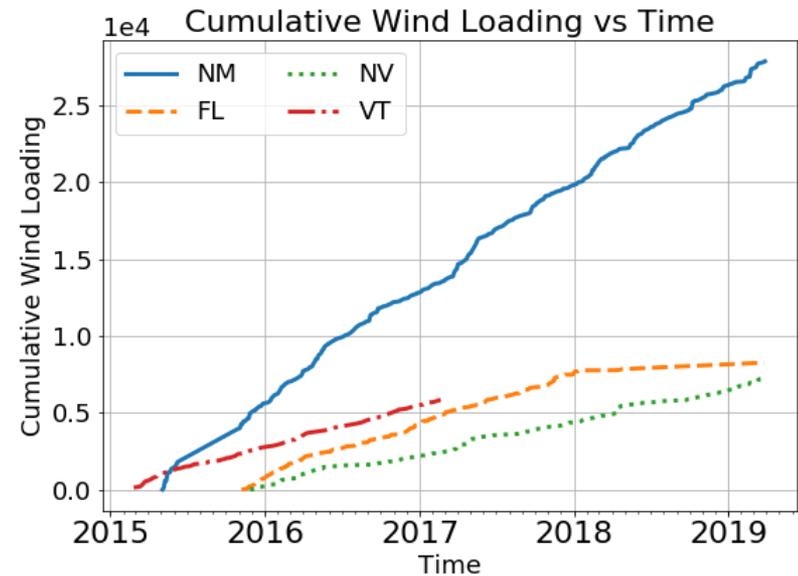
$$CS_{rad} = \sum_{t=0}^n (E(t)) \exp\left(\frac{-Q_a}{k_b T_m(t)}\right) (0.05)$$

- Temperature [4]

$$CS_{temp} = \sum_{t=0}^n (T_m(t)) \exp\left(\frac{-Q_a}{k_b T_m(t)}\right)$$

### 4. Least-Squares Analysis

- Compute slopes
- Compare slopes



# Data Analysis Results: Stressor-Based Analysis



## 1. System Current Least-Square Reg. Slopes

1. Time: Similar
2. Stressor-Based: Similar w/ Cumulative Temperature

## 2. System Voltage Least-Square Reg. Slopes

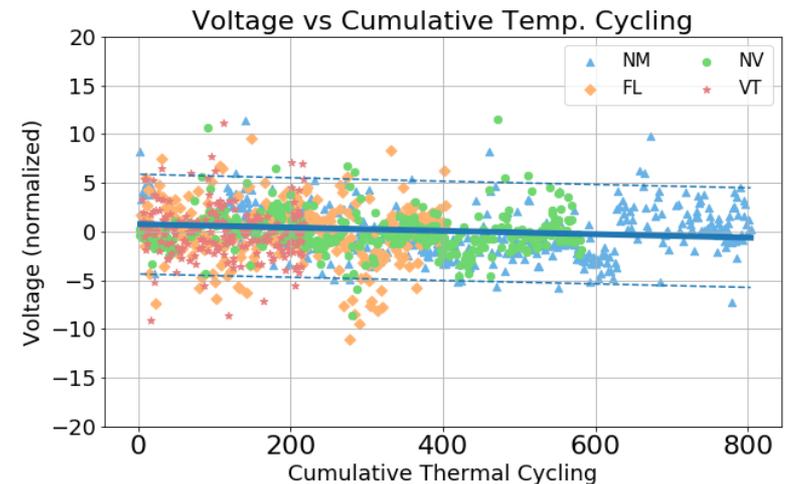
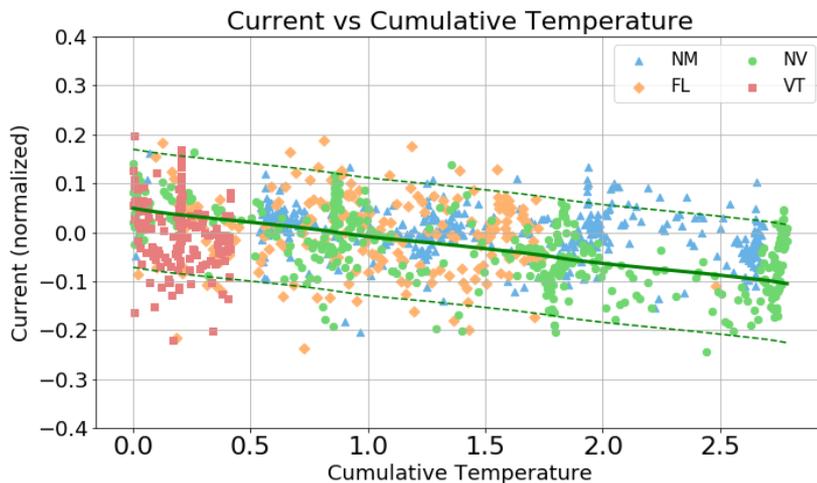
1. Time-Based: Variation among sites
2. Stressor-Based: Similar w/ Temp. Cycling

## Time-Based Slopes

|         | NM    | FL    | NV    | VT     |
|---------|-------|-------|-------|--------|
| Current | -0.01 | -0.13 | -0.05 | -0.026 |
| Voltage | -0.26 | -0.58 | -0.03 | -0.67  |

## Stressor-Based Slopes

|                         | NM     | FL      | NV     | VT     |
|-------------------------|--------|---------|--------|--------|
| Current vs Temp         | -0.018 | -0.018  | -0.028 | -0.13  |
| Voltage vs Temp Cycling | -0.002 | -0.0017 | -0.001 | -0.006 |





# Degradation Modeling



# Degradation Models Methodology: Outdoor Data



## 1. $P_{\text{model}} = \text{SAPM} + \text{Degradation}$

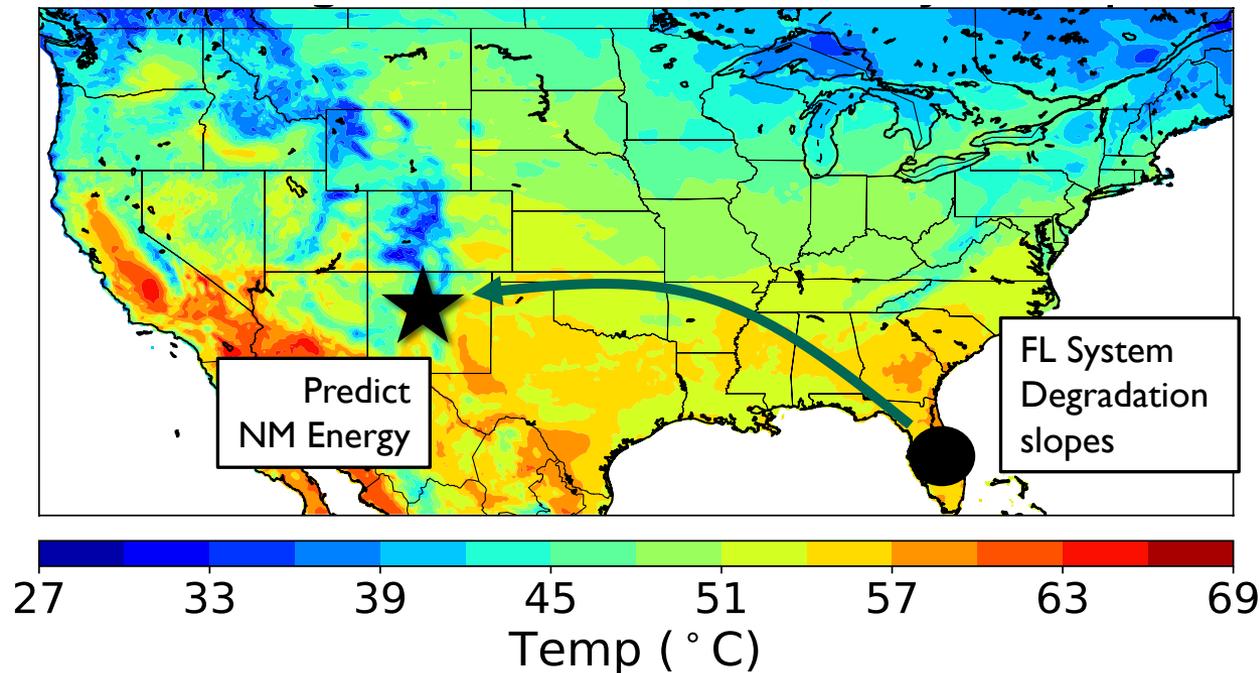
- Sandia Array Performance Model (SAPM)
- Linear Degradation =  $f(\text{stressor})$

## 2. Time-Based Model

- Assume 0.5%/year

## 3. Stressor-Based Model

- Model NM system based on FL results





## 1. No Degradation

Model

1. Error = 1.4%

## 2. Time-Based

Degradation Model

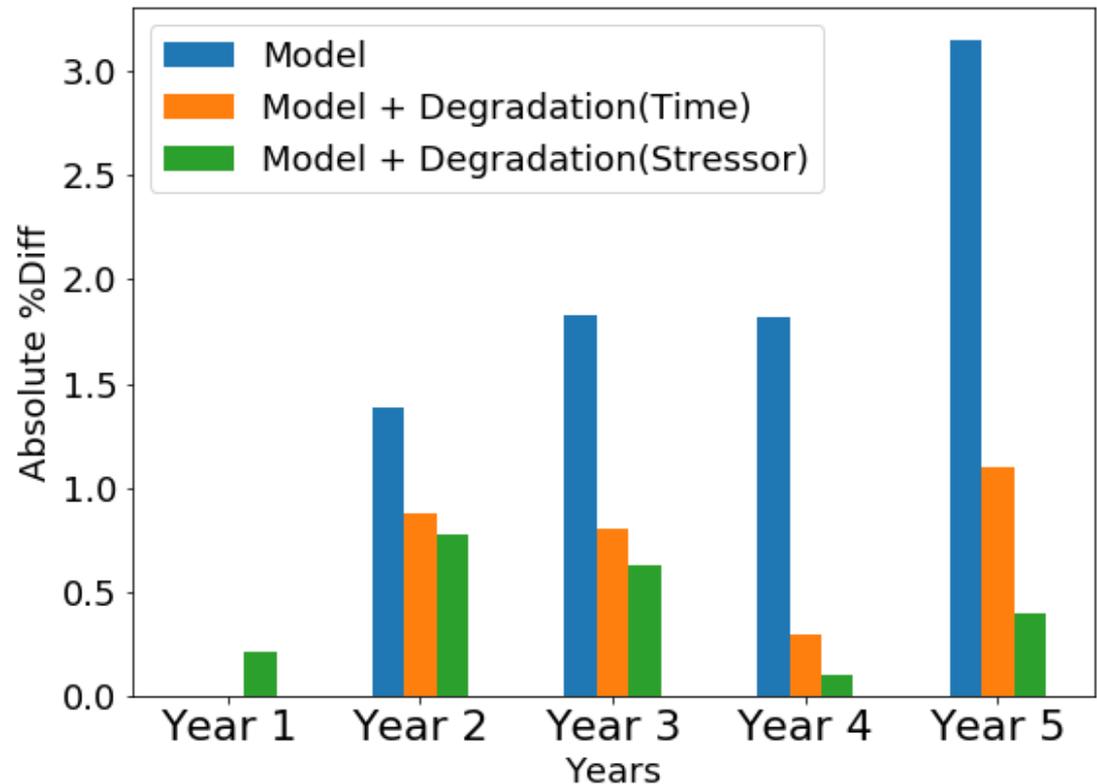
1. Error = 0.57%

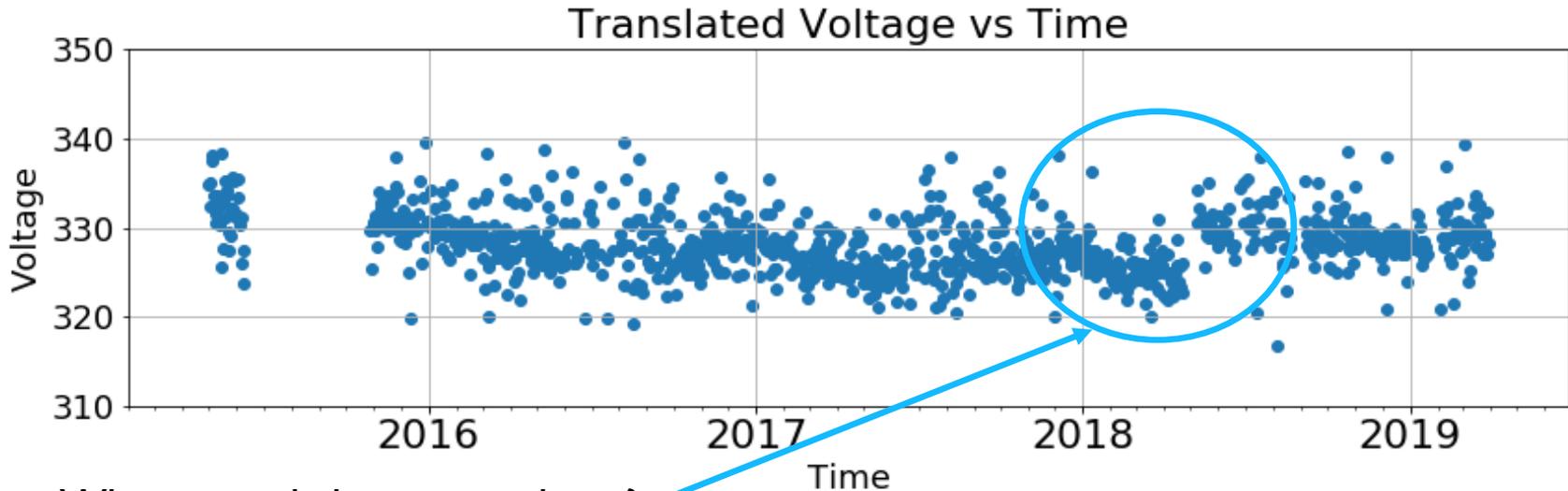
## 3. Stressor-Based

Degradation Model

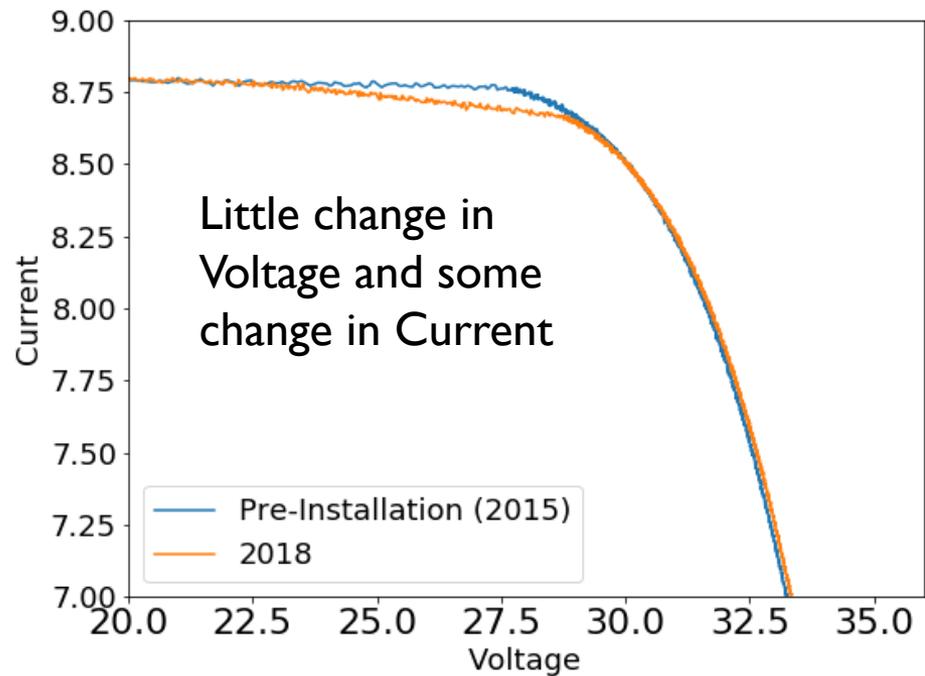
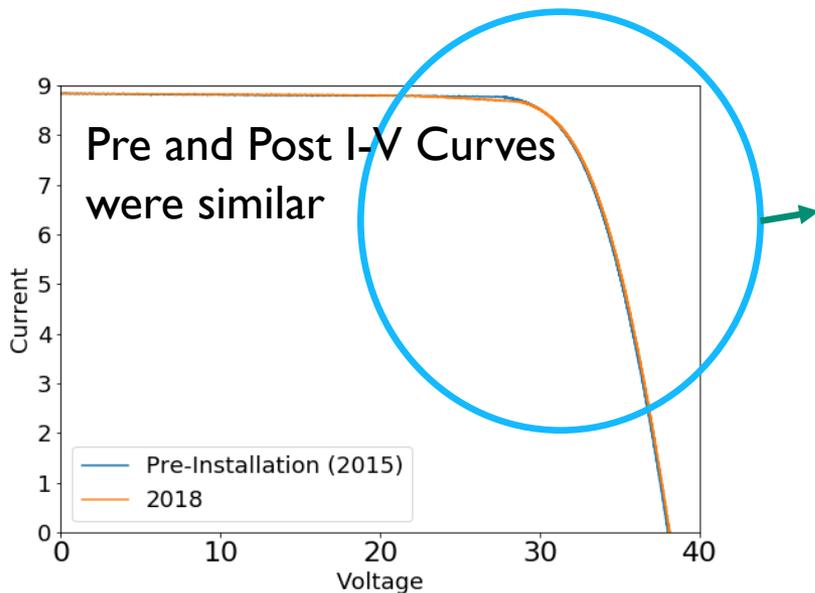
1. Error = 0.45%

Difference Between Actual and Modeled energy generation for each year





What caused change in voltage?





## Conclusion/Future Work





## 1. Stressor Identification

### 1. Voltage:

#### 1. Cumulative Thermal Cycling

### 2. Current:

#### 1. Cumulative Temperature

## 2. Improved Modeling

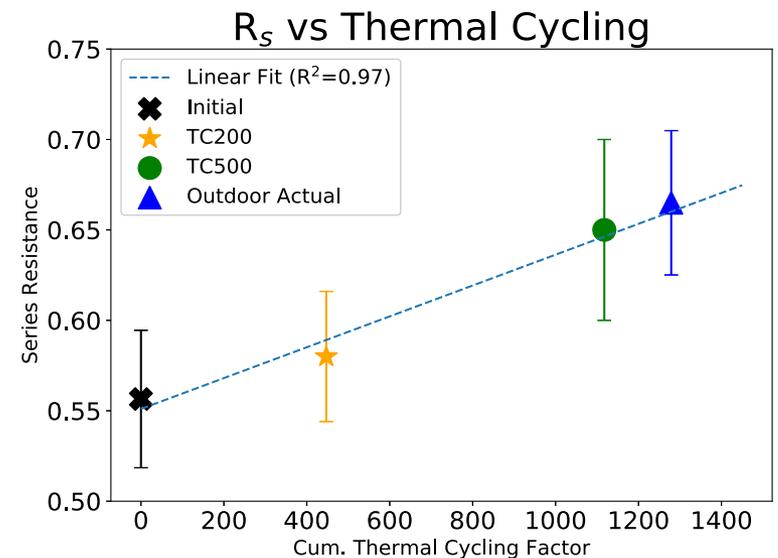
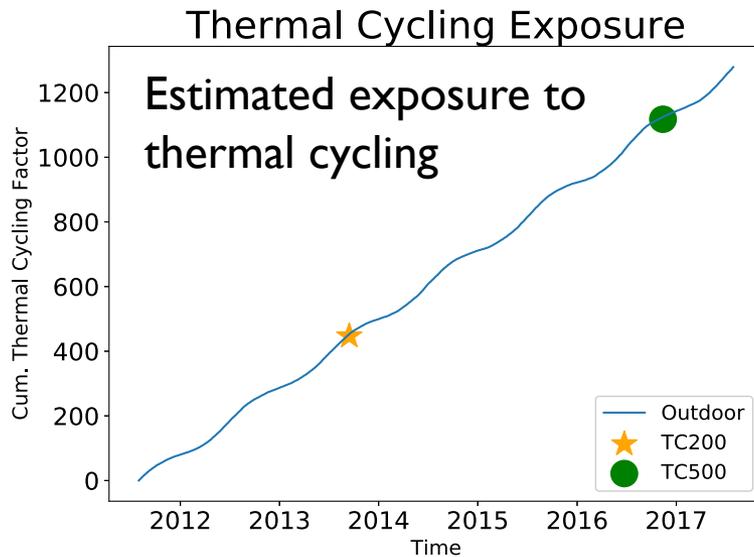
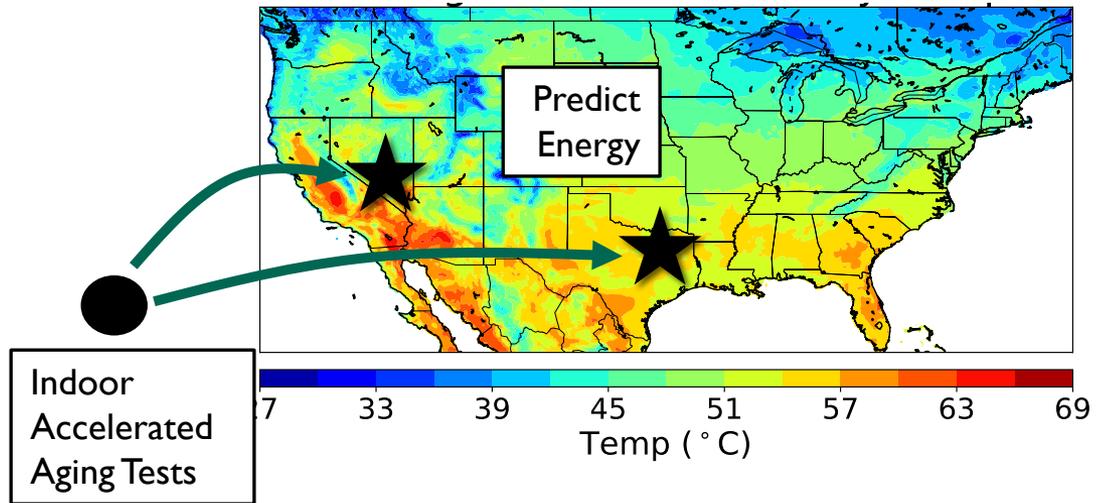
### 1. Improved accuracy

### 2. Better than standard assumption (0.5%/year)

# Future Work: Degradation Models Based on Indoor Tests



1. Estimate Overall Exposure
  - a. Indoor - IEC 61215
  - b. Outdoor – Weather measurements
2. Performance
  1. Measure Series Resistance from I-V Curves
3. Evaluate
  1. Relationship between change in  $R_s$  and Cumulative Temp. Cycling





# Questions





- [1] V. Vasudevan and X. Fan, “An acceleration model for lead-free (SAC) solder joint reliability under thermal cycling,” in *2008 58th Electronic Components and Technology Conference*, May 2008, pp. 139–145.
- [2] N. C. Park, W. W. Oh, and D. H. Kim, “Effect of Temperature and Humidity on the Degradation Rate of Multicrystalline Silicon Photovoltaic Module,” 2013.
- [3] M. Koehl, D. Philipp, N. Lenck, and M. Zundel, “Development and application of a UV light source for PV-module testing,” in *Reliability of Photovoltaic Cells, Modules, Components, and Systems II*, vol. 7412. International Society for Optics and Photonics, Aug. 2009, p. 741202.
- [4] O. Haillant, D. Dumbleton, and A. Zielnik, “An Arrhenius approach to estimating organic photovoltaic module weathering acceleration factors,” *Solar Energy Materials and Solar Cells*, vol. 95, no. 7, pp. 1889–1895, Jul. 2011.