

**STEP-STRESS ACCELERATED DEGRADATION TESTING
(SSADT)
FOR PHOTOVOLTAIC (PV) DEVICES AND CELLS**

**2010 Workshop on Accelerated Stress Testing & Reliability (ASTR)
October 6-8, 2010
Denver, CO**

Jinsuk Lee, Ryan Elmore, Changwon Suh and Wesley Jones
Computational Science Center
National Renewable Energy Laboratory
NREL/PR-2C00-49487

This work was supported by the U.S. Department of Energy under Contract No. DE-AC36-08GO28308
with the National Renewable Energy Laboratory.

Outline

- Introduction of SSADT
 - ✓ What is SSADT?
 - ✓ Why do we need SSADT?
 - ✓ What can be estimated from SSADT?

- Reliability testing for PV
 - ✓ Current reliability testing
 - ✓ How to apply SSADT to PV area (e.g., CIGS)

- Statistical process for SSADT
 - ✓ Inference using the lifetime prediction model

- Discussion

Objective

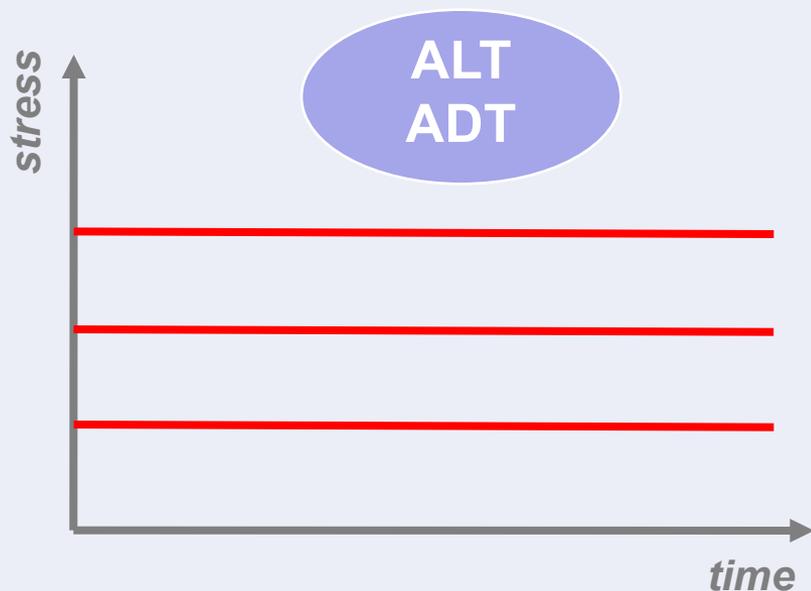
- ❑ Develop a step-stress degradation testing (SSADT) for PV reliability tests
 - Stage 1: construct a statistical model for SSADT - **current**
 - Stage 2: apply to reliability testing for thin film PV

- ❑ Develop a lifetime prediction model for PV products (cell level, but expandable to module level)
 - estimate lifetime characteristics (mean time, warranty time, failure rate) and activation energies

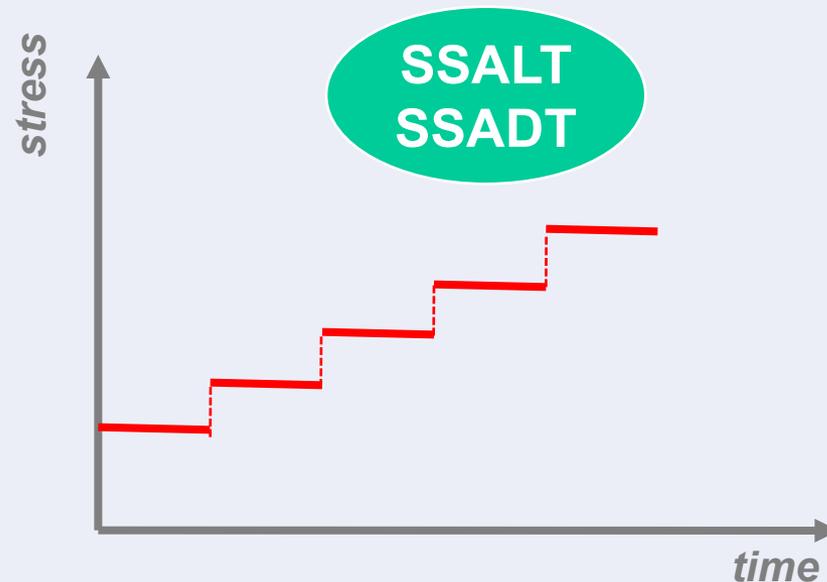
- ❑ Explore the current performance tests for $\text{Cu}(\text{In,Ga})\text{Se}_2$, CIGS, device and cells; and provide physical and statistical models for their degradation

What is SSADT ?

□ Stress vs. Time plot



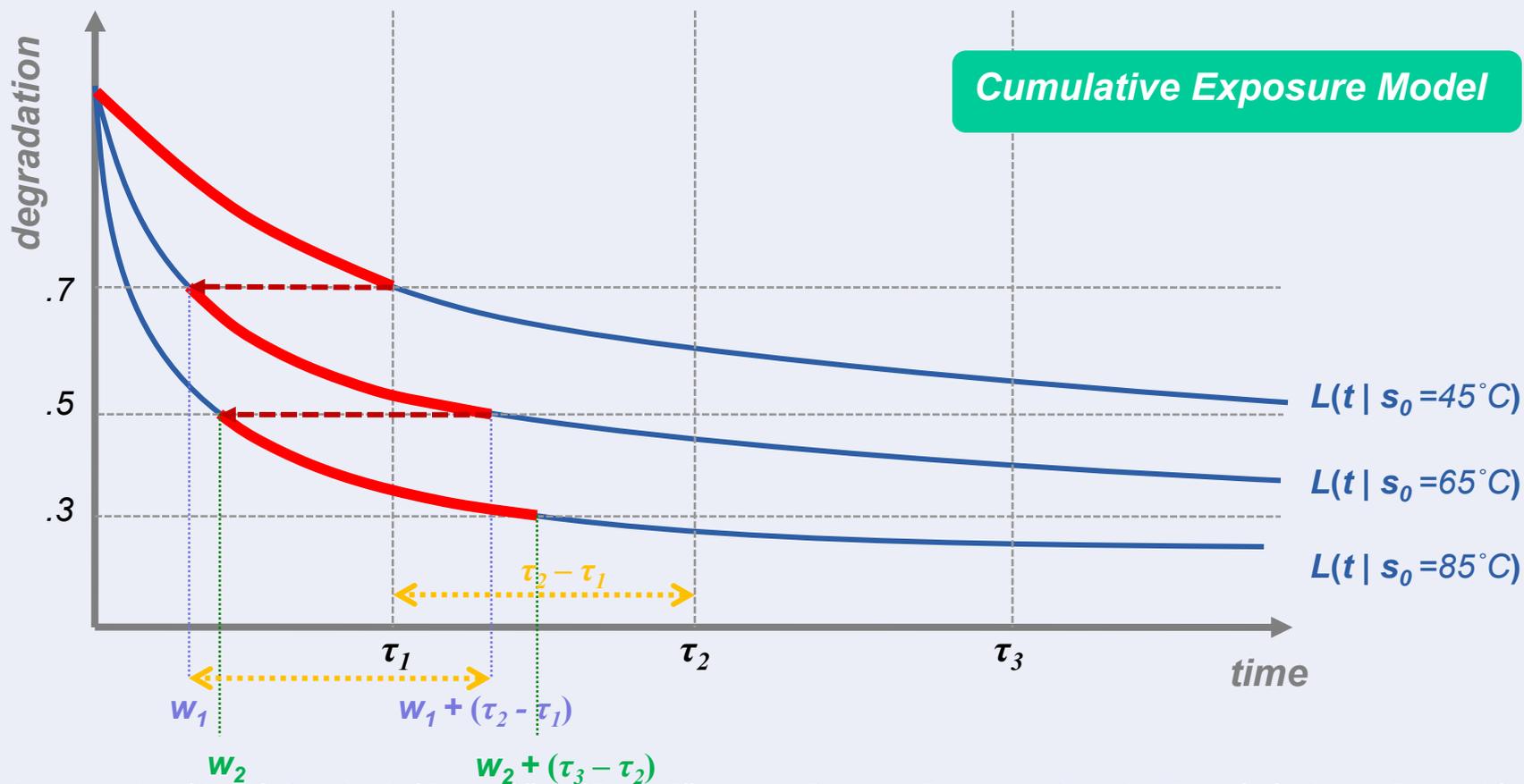
- 3 chambers
- 30 testing units



- 1 chamber
- 10 testing units

What is SSADT ?

□ Degradation vs. Time plot



Why do we need SSADT?



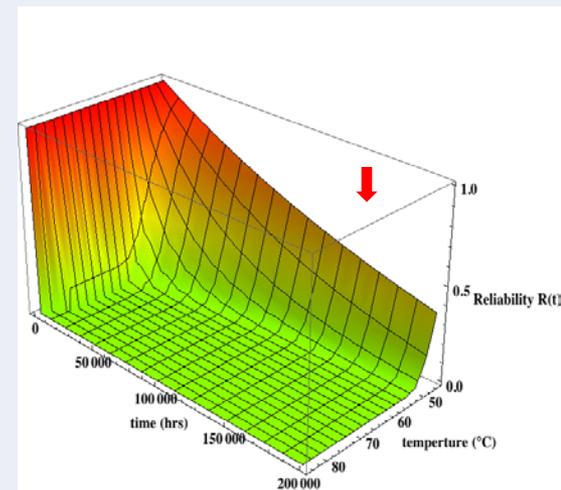
- ❑ ALT may offer little help for highly reliable products which are not likely to fail during a rather short period of time
- ❑ ADT collects the degradation data at higher levels of stress and then uses these data to predict the product's lifetime at a use-condition



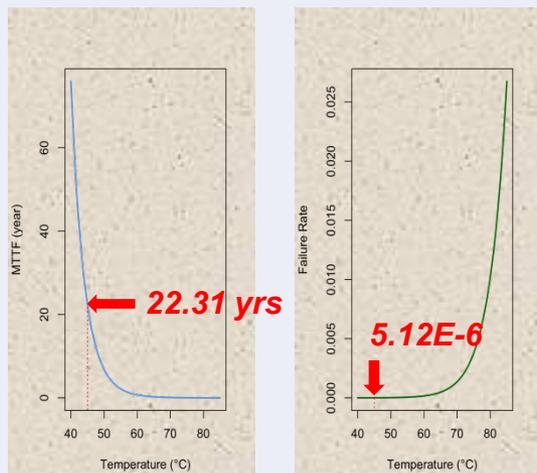
- ❑ SSADT is an economical and flexible test plan
 - In particular, it is not easy to determine suitable test stress levels in ALT/ADT for new developing products where we don't have knowledge of appropriate stress levels.

What can be estimated from SSADT ?

- ❑ **Product lifetime parameters** at various use-conditions
 - Mean time to failure
 - Reliability (Warranty) time
 - Failure rate
- ❑ **Degradation rate** at various use-conditions
- ❑ **Activation Energy (E_a)**
- ❑ **Upper limit level of stress** (tolerable stress level)



Prediction of Warranty time



Prediction of Mean time to failure & Failure rate

Reliability Testing for $\text{Cu}(\text{In,Ga})\text{Se}_2$, CIGS-based Thin film PV

❑ Performance Testing for CIGS (CIGS, NREL, leaded by John Pern)

1. Damp Heat Test: 85° C/85%RH
2. Dry Heat Test: 85° C/4-10%RH
3. Pressure Cooker: 110° C/100%RH/~6psi
4. SSADT

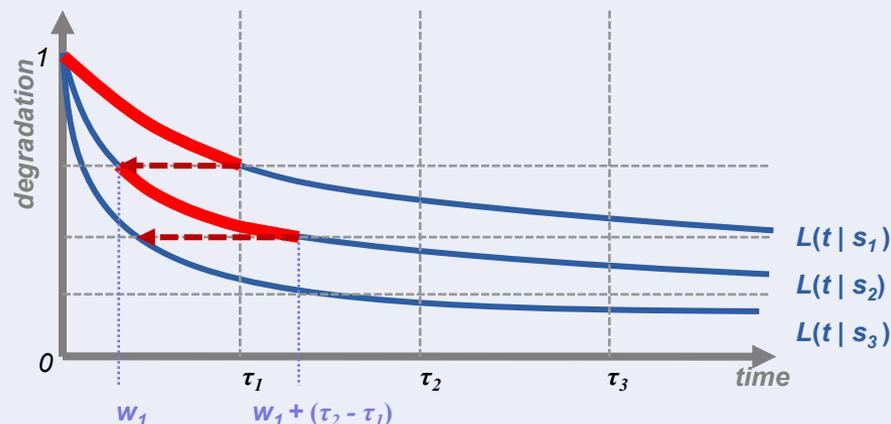
❑ Measurement for Degradation (J-V measurement System)

- Open-circuit voltage (V_{oc})
- Short-circuit current (I_{sc})
- Fill factor (FF)
- Conversion efficiency of the device (η)
- Series resistance (R_s)
- Shunt resistance (R_{sh})

Statistical Models

- Expected degradation for SSADT (by using **CEM**)

$$L(t) = \begin{cases} L(t | s_1) & \text{if } 0 \leq t < \tau_1 \\ L(t + w_1 - \tau_1 | s_2) & \text{if } \tau_1 \leq t < \tau_2 \\ \vdots & \\ L(t + w_{m-1} - \tau_{m-1} | s_m) & \text{if } \tau_{m-1} \leq t < \tau_m \end{cases}$$



- Degradation model over time

$$L(t | s_i) = L(0) \cdot \exp[-\beta_i t^\alpha], \quad i = 1, 2, \dots, m$$

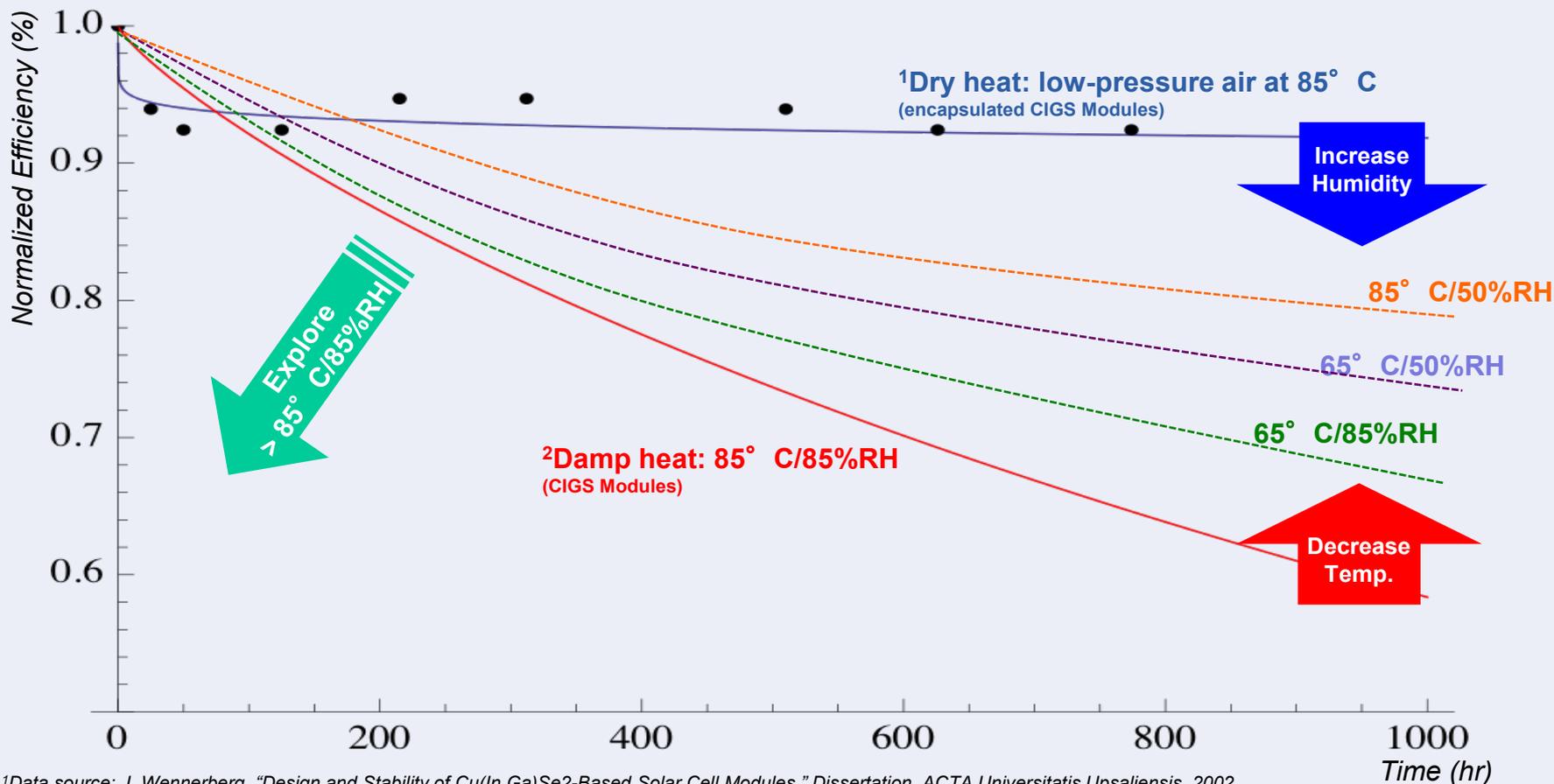
- Physical model for temperature and humidity (**Generalized Eyring Model**)

$$\beta_i = a \cdot \exp\left(-\frac{b}{RH_i}\right) \cdot \exp\left(\frac{E_a}{k \cdot (273 + T_i)}\right)$$

* Arrhenius Model for Temperature

$$\beta_i = \exp\left(a - \frac{E_a}{k \cdot (273 + T_i)}\right)$$

Degradation of CIGS

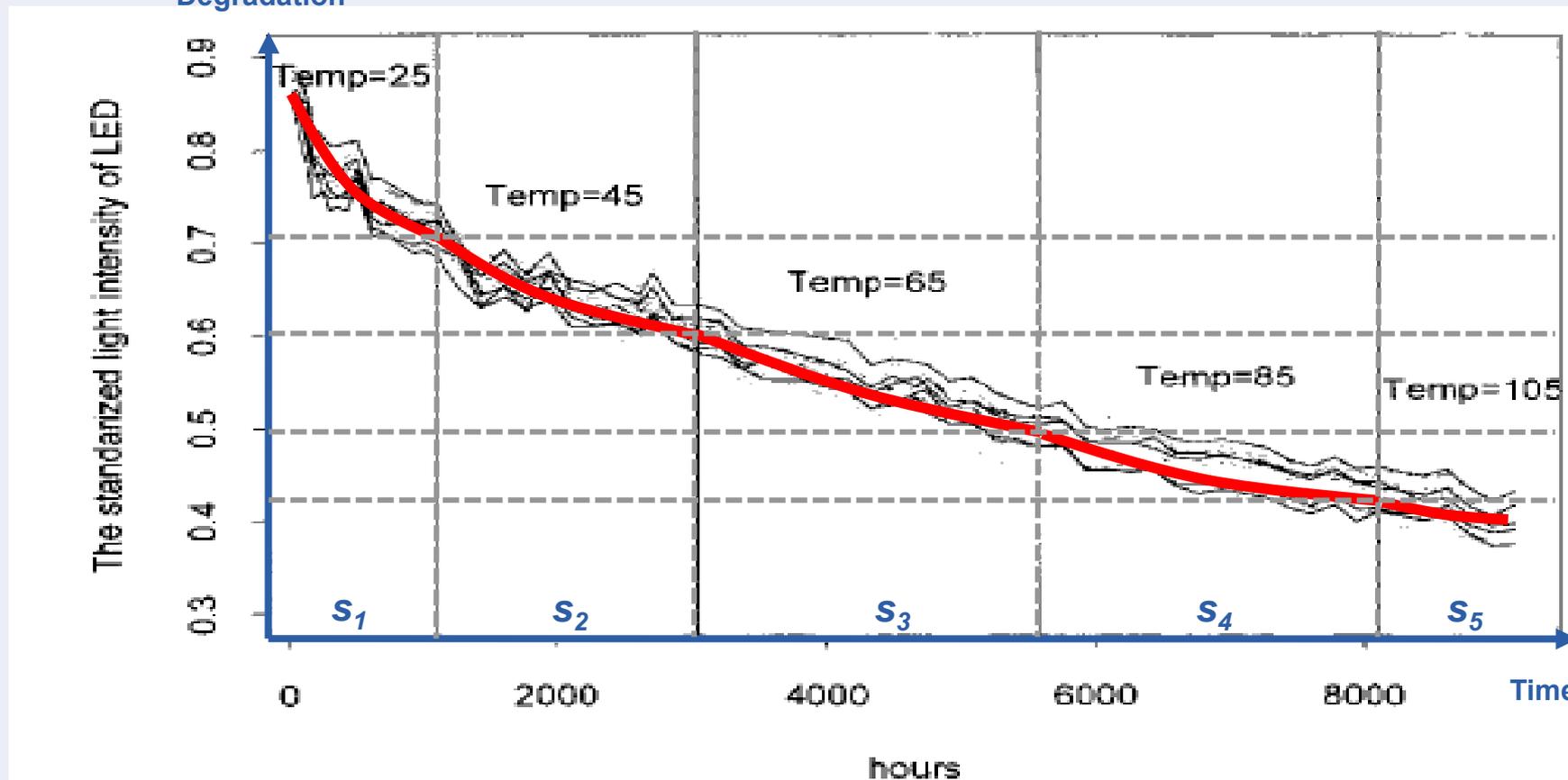


¹Data source: J. Wennerberg, "Design and Stability of Cu(In,Ga)Se₂-Based Solar Cell Modules," Dissertation, ACTA Universitatis Upsaliensis, 2002.

²Data source: J. Wennerberg et al., "Cu(In,Ga)Se₂-Based thin-film photovoltaic modules optimized for long-term performance," *Solar Energy Materials & Solar Cells*, 75, 2003, pp47-55.

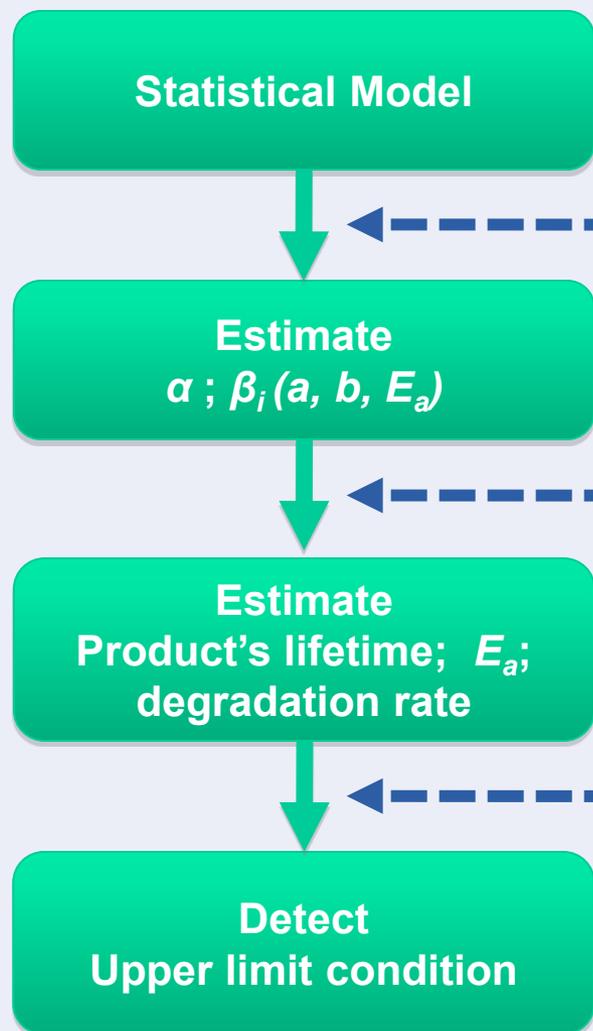
Example of SSADT Data (LED lamps of fax machine (Tseng & Wen 2000))

Degradation



Source: S.-T. Tseng and Z.-C. Wen, "Step-Stress Accelerated Degradation Analysis For Highly Reliable Products, *Journal of Quality Technology*, 32, 2000, pp209-216.

Overall Process of Statistical Analysis



Least square estimation by minimizing

$$SSE(\alpha, a, b) = \sum_t \{ \ln(-\ln L_0(t)) - \ln(-\ln H_0(t)) \}^2$$

Observed data

Given D= criteria for failure,

$$\hat{t}_f = \left(-\ln D / \hat{\beta}_0 \right)^{1/\alpha}$$

Least square estimation by minimizing

$$SSE(\beta_0, \alpha(j), \omega_1, L, \omega_{j-1}) = \sum_{t=t_{j-1}}^{t_j} \{ \ln(-\ln H_0(t)) - A_j - \alpha(j) [\ln(\omega_{j-1} + t - \tau_{j-1})] \}^2$$

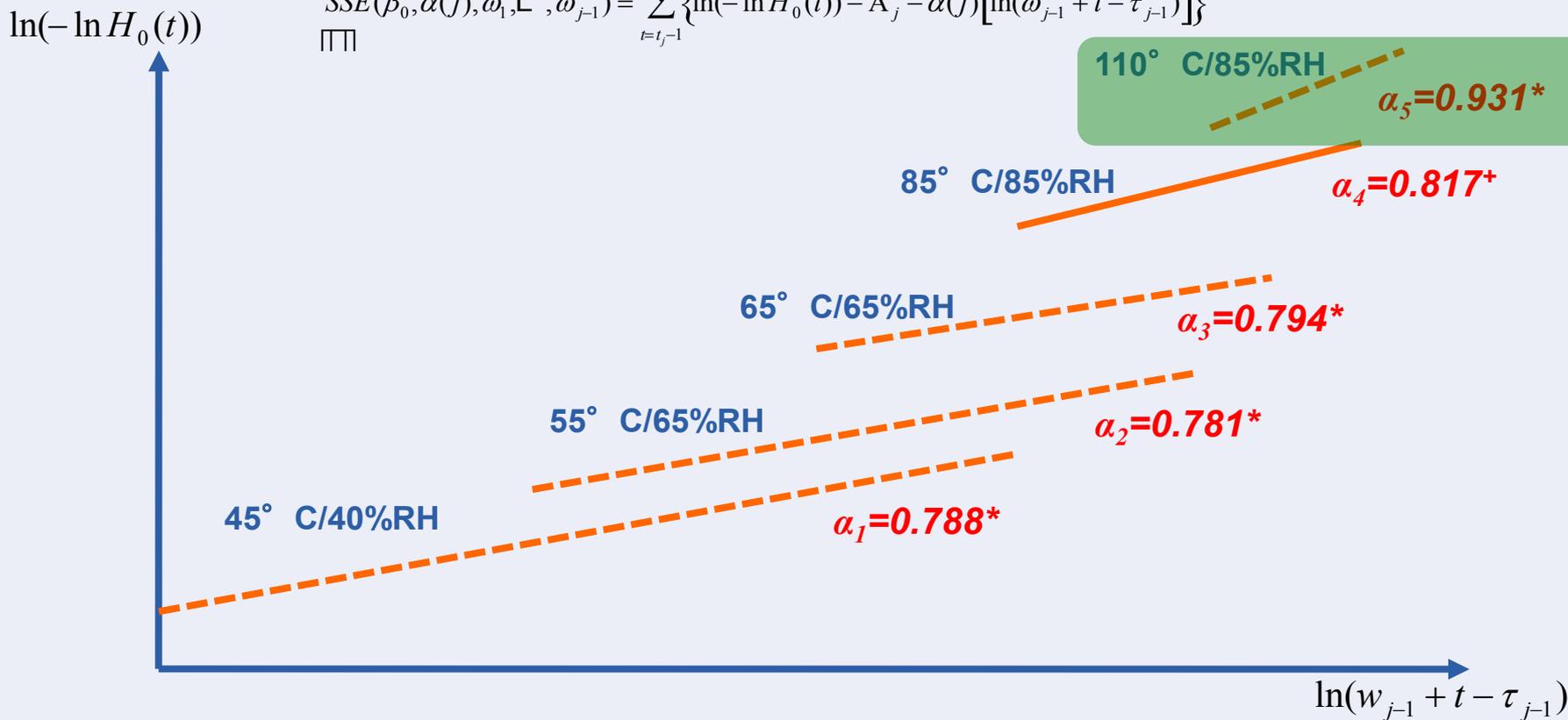
Estimate at each stress level

Detect the violation for the constant assumption with

$$|\hat{\alpha}(i) - \hat{\alpha}(j)| < \delta$$

Example for detecting a upper limit of stress

$$SSE(\beta_0, \alpha(j), \omega_1, L, \omega_{j-1}) = \sum_{t=\tau_{j-1}}^{t_j} \left\{ \ln(-\ln H_0(t)) - A_j - \alpha(j) [\ln(\omega_{j-1} + t - \tau_{j-1})] \right\}^2$$



- “ α is independent of stress” is only valid for temperature less than or equal 85° C
- The issue of “over-stress” can lead to misleading results

Note, + : estimated value from Wennerberg et al. (2003)

Discussion

- Develop statistical models for a cutting-edge life-testing technique, SSADT, with temperature-humidity condition for PV reliability testing
 - applicable to all PV reliability testing (including module levels and all PV technologies)
- Discuss the benefits of SSADT
- Consider other applicable degradation models (discussed by Nelson (1990)): e.g., some temperature-humidity models
- Study two main areas for SSADT: Statistical inference and Optimal planning
- Discuss about other statistical methods to build a SSADT model and analyze its data – e.g., LSE vs. MLE, Bayesian inference, generalized linear models, etc.

Key Reference

- ❑ S.-T. Tseng and Z.-C. Wen, “Step-Stress Accelerated Degradation Analysis For Highly Reliable Products, *Journal of Quality Technology*, 32, 2000, pp209-216.
- ❑ J. Wennerberg et al, “Cu(In,Ga)Se₂-Based thin-film photovoltaic modules optimized for long-term performance,” *Solar Energy Materials & Solar Cells*, 75, 2003, pp47-55.
- ❑ W. Nelson, *Accelerated Testing – Statistical Models, Test Plans, and Data Analysis*, Wiley & Sons, New York, 1990.
- ❑ J. Lee and R. Pan, “Bayesian inference model for step-stress accelerated life testing with type-II censoring, in *Proc. The Annual Reliability and Maintainability Symposium*, Las Vegas, NV, 2008.
- ❑ J. Lee and R. Pan, “Analyzing Step-Stress accelerated Life Testing Data Using Generalized Linear Models,” *IIE Transactions*, 42, 2010, pp589-598.