

# Review of SiC MOSFET Based Three-Phase Inverter Lifetime Prediction

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**Abstract**—This paper presents a review on SiC MOSFET based 3-phase inverter lifetime prediction. The inverter-level lifetime prediction flowchart is first illustrated with the system failure rate and system Mean Time to Failure derived which integrate five in-series stresses. An overview of SiC MOSFET power module Physics-of-Failure is then presented. Following it are the step-by-step lifetime modeling comparison and summarization, including power loss analysis, thermal modeling, thermal-mechanical modeling, and damage accumulation modeling. Furthermore, cycle counting algorithms and active power cycling tests specific to SiC MOSFET are discussed. Finally, a detailed system-level thermal profile extraction from SiC MOSFET based 3-phased inverter in the hybrid electrical vehicle application is conducted. The simulation result is consistent with theoretical power loss and thermal equivalent circuit based junction temperature evaluation. Thus it can be used for further system lifetime modeling and the reference for 3-phase inverter based power cycling tests in SPWM mode.

**Keywords**—SiC MOSFET; three-phase inverter; lifetime prediction; reliability

## I. INTRODUCTION

3-phase inverter systems, applied in wind energy, PV generation and hybrid electric vehicles face randomly fluctuating mission profiles [1]-[4]. Accordingly, due to irregular thermal profiles, the mismatch of the Coefficient of Temperature Expansion causes mechanical stress to bond wire and solder joints, inducing 3-phase inverter systems to malfunction unexpectedly. Thermally induced failure takes a significant percentage of 55% among all sources of failures [5]. Besides, the maintenance cost in high power inverter systems is high, which makes the lifetime prediction important in their continuous, long-term operation. Nowadays with the improvement of gate-oxide lifetime, SiC MOSFET power modules have shown better performance in high power applications compared with traditional Si counterparts [7]-[10]. Besides, with achievable high-temperature tolerance, high efficiency and compact system volume [8], SiC MOSFETs save power loss largely compared with Si IGBTs [11] [12], making them more reliable with longer expected lifetime.

Although many research has been done in the lifetime modeling in high power electronic applications, most of them are concerned with component-level modeling with regard to

Si based devices. Some papers have studied the system-level lifetime prediction to decrease the MTTF of the inverters. From topological view, [13]-[15] propose different topologies to increase the system lifetime. Others use Markov reliability model to analyze the lifetime of paralleled devices [16] or paralleled topologies [17] [18]. From the perspective of PWM control, [19] tries to control the switching frequency dynamically with junction temperature swing. [20] compares the impact of power factor dependent DPWM and continuous PWM control on junction temperature to extend the system lifetime. Nevertheless, all the above improvements are rested on qualitative analysis without systematic quantitative lifetime modeling and step-by-step direction of system-level lifetime prediction. [21] gives a quantitative lifetime analysis of a 3-phase inverter. However, only IGBT failures are considered. Besides, not enough comparisons have been made to validate the adopted modeling methods, which weakens the preciseness of the proposed lifetime modeling method. Therefore, this paper serves to give a state-of-the-art review on the lifetime prediction of the SiC MOSFET based 3-phase inverters.

In this paper, a step-by-step flowchart of SiC MOSFET based 3-phase inverter lifetime prediction is first shown in Part II. An overview of SiC MOSFET module Physics-of-Failure is summarized in Part III. Modeling analysis, cycle counting method comparison and active power cycling tests specific to SiC MOSFET modules are thoroughly presented in Part IV. Finally, a thermal profile extraction based on a hybrid vehicle 3-phase inverter is conducted, which lays a necessary foundation for further system-level lifetime modeling.

## II. FLOWCHART OF SiC MOSFET BASED THREE-PHASE INVERTER LIFETIME PREDICTION

Fig. 1 shows the state-of-art flowchart of SiC MOSFET based 3-phase inverter lifetime prediction. There are two ways to get the lifetime curve  $N_f - \Delta T_j$ , i.e. by modeling and simulation (marked as black solid arrows), or by power cycling verification (marked as red dashed arrows). Here,  $N_f$  and  $\Delta T_j$  are cycles to failure and junction temperature swing respectively. In the flowchart, the yellow square boxes indicate models and profiles related to thermal, mechanical and electrical parameters. While the green diamond shapes indicate the intermediate modeling, analysis, feedback and test procedures. The blue solid arrows indicate the feedback routes.

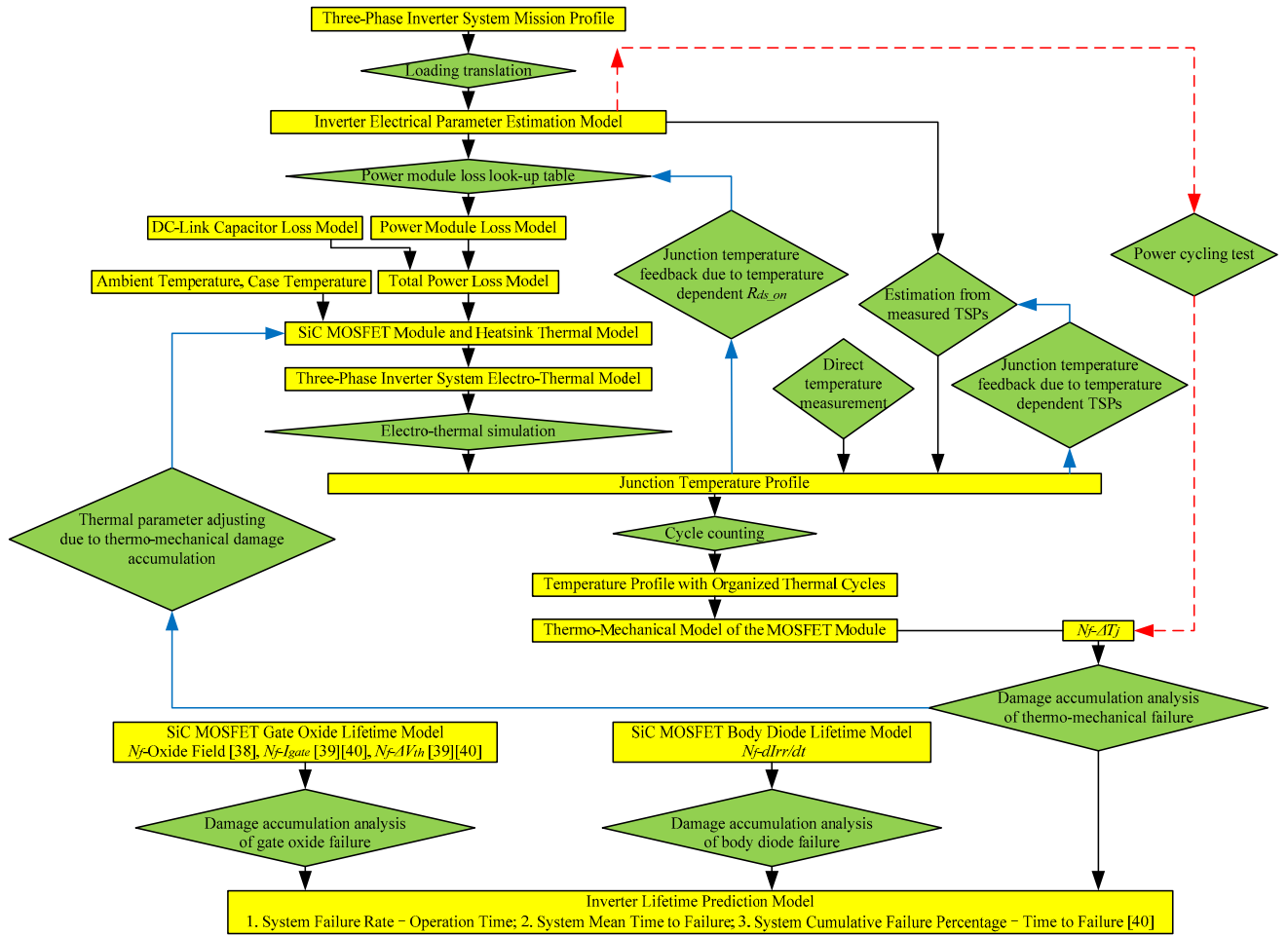


Fig.1 Flowchart of SiC MOSFET based three-phase inverter lifetime prediction

Considering the impact of  $V_{gs}$  (gate-source voltage),  $R_g$  (gate resistance) on the device power loss [1], gate driver parameters should be included in the Inverter Electrical Parameter Estimation Model. Based on different failure mechanisms, three types of stresses are considered for the system lifetime prediction model, which are junction temperature swing, gate oxide breakdown related and body diode degradation related electrical parameters. In the flowchart,  $I_{gate}$ ,  $\Delta V_{th}$ ,  $dI_{rr}/dt$  are gate leakage current, threshold voltage shift, reverse recovery current change rate, respectively. The reliability function  $R_i(t)$  of each individual stress can be approximately characterized by the failure rate  $\lambda_i(t)$  with the unit of Failures in Time (FIT) or Failures per billion hours.

Most popular lifetime models for power devices are based on the Exponential or Weibull distribution [6]. Considering the time-dependent failure rate of SiC MOSFET failure modes, Weibull distribution is used here. We define the failure rate of oxide field,  $I_{gate}$ ,  $\Delta V_{th}$  induced gate oxide breakdown as  $\lambda_1(t)$ ,  $\lambda_2(t)$ ,  $\lambda_3(t)$ , respectively, the body diode failure rate as  $\lambda_4(t)$  and the thermo-mechanical failure rate as  $\lambda_5(t)$ . If any of these stress leads to corresponding degradation, the whole system reliability would be affected, which means the stresses can be regarded as in-series. Furthermore, different stresses have

unequal contributions to the whole inverter system reliability. For example, junction temperature swing induced thermal degradation takes the largest proportion in the system failure [5]. Thus we define the weight of each of the five stresses as  $\alpha_1$ ,  $\alpha_2$ ,  $\alpha_3$ ,  $\alpha_4$ ,  $\alpha_5$ . According to the statistics of Weibull distribution, the system failure rate  $\lambda_{sys}(t)$  is shown in (1).

$$\lambda_{sys}(t) = \sum_{i=1}^5 \alpha_i \lambda_i(t) \quad (1)$$

The reliability  $R_i(t)$  of each stress can be got from (2).

$$\lambda_i(t) = \frac{f_i(t)}{R_i(t)} = \frac{-dR_i(t)/dt}{R_i(t)} \quad (2)$$

Where  $f_i(t)$  is the probability density function. Then, the system reliability function  $R_{sys}(t)$  is shown in (3):

$$R_{sys}(t) = \prod_{i=1}^5 R_i(t) \quad (3)$$

System Mean Time to Failure ( $MTTF_{sys}$ ) is shown in (4):

$$MTTF_{sys} = \int_0^{\infty} R_{sys}(t) dt \quad (4)$$

### III. SUMMARIZATION OF SiC MOSFET POWER MODULE PHYSICS OF FAILURE

The Physics-of-Failure reliability summarization of SiC MOSFET power modules is shown in Table I. The most frequently encountered failure locations of SiC MOSFET power modules are gate oxide, body diode, wire bond, chip

The temperature dependent characteristics [42] of  $R_{ds, on}$  should be reflected in SiC MOSFET conduction loss evaluation, as the junction temperature feedback shows in Fig.1. As to switching loss, owing to high switching frequency of SiC MOSFET, the influence of parasitic elements cannot be ignored. Besides, for the DC-link capacitor, from the analysis

TABLE I. PHYSICS-OF-FAILURE RELIABILITY SUMMARIZATION OF SiC MOSFET POWER MODULES

PRECURSORS	CAUSE	MECHANISM	CRITERIA	MODE/LOCATION
Gate leakage current $I_{gate}$ [22]-[24]	Thinner gate oxide $\rightarrow$ higher electric field across oxide under High Temperature Reverse Bias (HTRB) stress	Gate oxide breakdown $\rightarrow$ gate leakage current	Larger than five times the initial value [22] [30]	Gate failure/ Gate oxide
Gate threshold voltage shift $\Delta V_{th}$ [25]-[29]	High Temperature Gate Bias (HTGB) stress	Charge trapping and de-trapping at SiC/SiO <sub>2</sub> interface	Above 20% Maximum of the initial voltage [30] [92]	
Body diode reverse recovery current variation rate $dI_{rr}/dt$ [31]-[33]	1. Low carrier lifetime 2. Thin Epitaxial drift layer 3. Basal-plane dislocations	High $dV/dt$ of body diode coupled with parasitic drain-to-body capacitance $\rightarrow$ body current $I_{rr}$	No specific failure criteria can be found	Body diode failure/ Body diode
Drain-source on-state voltage $V_{ds, on}$ [34]-[37]	Stress level much higher than wire bond's strain level	High junction temperature $\rightarrow$ increase of $V_{ds, on}$	$V_{ds, on}$ increases by 5% ~ 20% [34]	Wire bond lift-off/ Wire bond
Junction-case thermal resistance $R_{th, jc}$ [34]	Uneven current distributions at solder joints	Crack propagation $\rightarrow$ increase of thermal impedance	$R_{th, jc}$ increases by 10% ~ 20% [34]	Solder fatigue/ Chip solder layer, substrate-baseplate solder joint

TABLE II. COMPARISON AMONG POWER MODULE AND HEATSINK THERMAL MODELING METHODS

THERMAL MODELING METHODS	ADVANTAGES	DISADVANTAGES	SOURCES
Time-domain Thermal RC Network	Instantaneous junction temperature can be estimated by circuit simulators	1. No consideration about the heat convection from the clod plate to the coolant 2. No consideration about thermal coupling effect	[44] [45] [46] [47]
Frequency-domain Thermal RC Network	1. High-sensitivity and low-noise temperature measurement 2. Device internal temperature and heat flowing outside devices are predicted	Four temperatures (junction temperature, case temperature, heat-sink temperature, and ambient temperature) need to be measured	[48] [49]
Numerical Analysis Method of Thermal Conduction	1. Model dynamic electro-thermal behavior 2. Effective in initial system thermal design 3. Fast calculation and simulation speed	No accurate estimation about the heat spreading effect in the material	[50][51][52]

solder layer and substrate-baseplate solder joint. Although the failure precursors are shown independently, different failure precursors can be the cause and result of each other. For example, the negative bias-temperature stress can result in negative shift of threshold voltage, which induces the increase of leakage current [26]. Besides, when solder fatigue happens, the thermal impedance increases, which causes junction temperature to go up. This in turn results in an increase of drain-source on-state voltage, which indicates another failure mode – wire bond lift-off. Likewise, wire bond lift-off induces uneven current distribution, which generates higher power loss and corresponding higher junction temperature. Hence more thermal stress is put onto the solder interconnections [65].

### IV. MODELING ANALYSIS, CYCLE COUNTING AND POWER CYCLING VERIFICATION

#### A. Modeling Analysis

##### 1) Power Loss Analysis

in [43], we can find the lifetime model is connected to the temperature variation, which can be related to power loss. Thus, the DC-link capacitance power loss model is integrated into the total system power loss model as shown in Fig. 1.

##### 2) Thermal Modeling

Three power module and heatsink thermal modeling methods are shown in Table II. The thermal impedance of the inverter contains the junction to case impedance, case to heatsink impedance and heatsink to ambient impedance.

There are two ways to derive the junction to case impedance. One is to directly reference the datasheet. The other method measures case and junction temperature respectively and then uses thermal equivalent circuit models to calculate junction-to-case impedance. Case temperature is usually measured by thermal couplers, Infra-Red cameras or optical fibers [21]. But these methods have limited temperature range and relatively low response speed [53]. Due to the physical junction location, most widely used junction temperature sensing method is to indirectly measure the

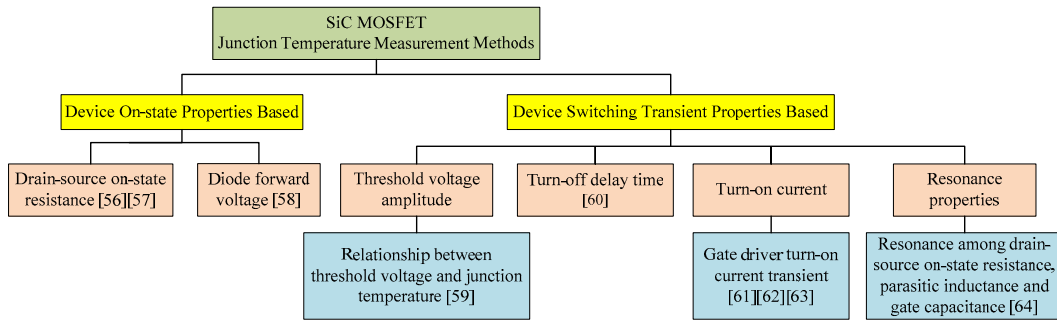


Fig.2 Summarization of TSP based SiC MOSFET junction temperature measurement methods [56]-[64]

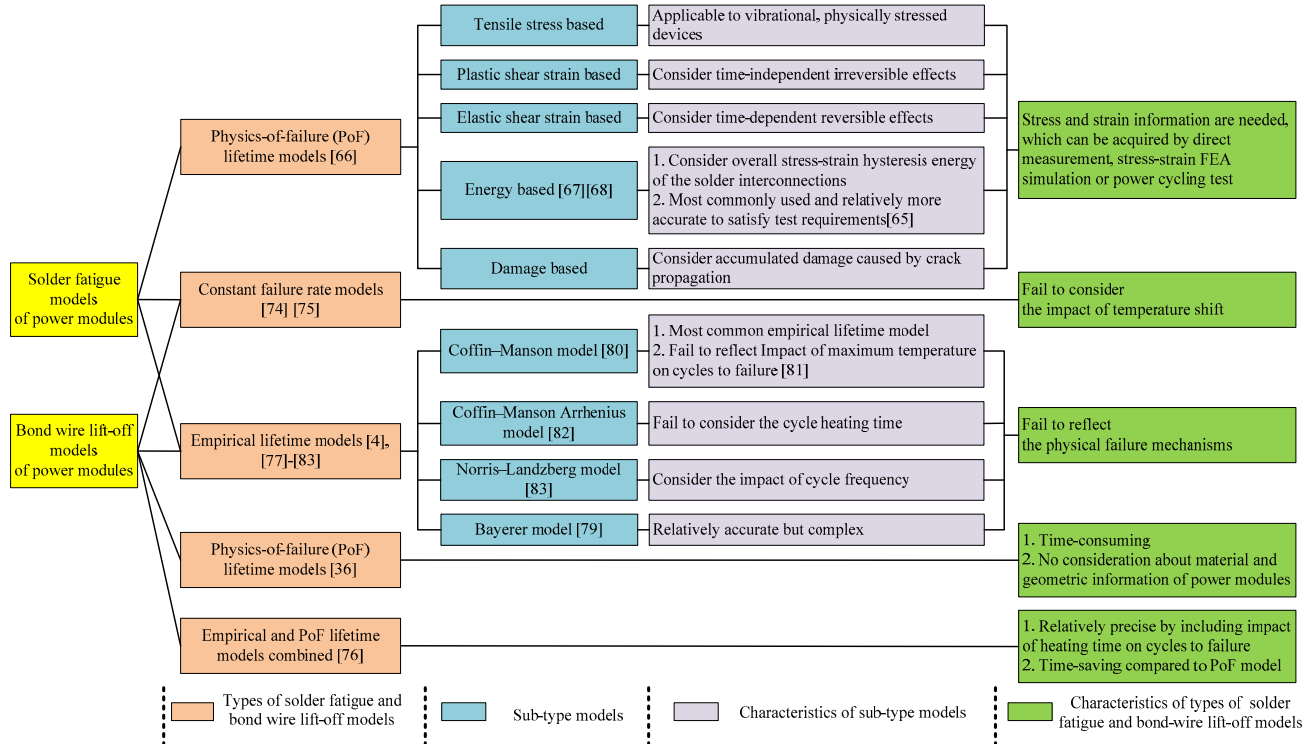


Fig.3 Comparison among solder fatigue and bond-wire lift-off models [4], [36], [65]-[68], [74]-[83]

Temperature Sensitive Parameters (TSP). Fig.2 summarizes the junction temperature measurement methods of SiC MOSFETs, which are generally divided into two types based on the on-state properties or switching transient properties.

As to case to ambient impedance, because of the heat convection effect, thermal coupling between different MOSFETs of different locations on the heat sink is evaluated in 2D thermal model [42] [54], and 3D thermal model [55].

### 3) Thermo-mechanical Model of the SiC MOSFET Module

Among different thermo-mechanical mechanisms, solder fatigue and wire bond lift-off are two most critical failure modes caused by the mismatch of the Coefficient of Temperature Expansion [65]. Due to similar temperature cycling induced stress-strain interaction mechanisms, either can be modeled by temperature cycle related empirical Coffin-

Manson model[80] or by Physics-of-Failure based models. These two types of failure models are summarized in Fig. 3.

### 4) Inverter Fatigue Damage Accumulation

#### a) Linear Damage Accumulation Method

Based on the Palmgren-Miner's Law [69], the linear damage accumulation method is the most widely accepted in damage evaluations. However, it is independent of the loading levels [70], which affects the lifetime prediction accuracy.

#### b) Nonlinear Damage Accumulation Method

The nonlinear damage accumulation method can reflect the accumulation rate change in different stress levels. Commonly used nonlinear damage accumulation methods consider the sequence of stresses. For instance, the method based on the Double Linear Damage Law [71] allows each phase of the loading to be analyzed by the Palmgren-Miner linear damage

rule. However, it ignores the mutual effect among different stresses. In [72], both stress sequences and stress interaction are considered by modifying the exponent parameter in the Manson Halford Model.

### c) Comparison

In linear accumulation methods, the damage accumulation rate is considered constant all through the device lifetime. However, actually as damage is accumulated, corresponding stresses could cause additional physical mechanisms, which would change the rate of damage increase. Take the thermo-mechanical stress for example. As the crack propagates, the junction-to-case resistance increases due to the increase of power loss and junction temperature, which accelerates the damage accumulation rate in the wire bond and solder interconnection. Therefore, lifetime predicted by linear methods is impractically longer. While nonlinear methods consider the damage accumulation rate change by putting proper weights onto the affected physical parameters. In order to determine these weights, detailed experimental data are needed [21], which makes these methods not generally applied. As a result, linear accumulation methods are considered in the flowchart in Fig.1. A feedback loop is applied in the thermo-mechanical stress related lifetime modeling to reflect the thermal resistance increase with the damage accumulation [84].

### B. Cycle Counting

To efficiently count the randomly distributed thermal cycles, many counting algorithms have been proposed, such as level-crossing counting, peak counting, simple-range counting, and rainflow counting [85]. Among them, the rainflow counting algorithm is the most well-known [4] [86]. It counts only the extreme points to extract the amplitude [87] [88], mean value [89] and cycling period [3]. Traditional rainflow methods output half cycles that are difficult to be integrated into reliability algorithms, so [4] counts small cycles within larger ones to avoid this problem. Plus, contrary to traditional off-line rainflow methods, [90] processes real-time minimum or maximum temperature by using stack-based recursive programming, which overcomes the inefficient data storage.

### C. Power Cycling Verification

#### 1) Selection of Ageing Indicators

From the existing test comparisons in [22], widely used reliability test standards are not applicable to the SiC MOSFET due to the specific characteristics such as significant threshold voltage shift. The three Si device based reliability standards are summarized in Table III together with their shortcomings when used as the criteria of SiC MOSFET related tests.

TABLE III. RELIABILITY STANDARDS BASED ON SI DEVICES

Reliability Standards/Year	Shortcomings for SiC MOSFET
U.S. Department of Defense MIL-STD-750-3 / 2012 [73]	Not applicable to high temperature reverse bias stress
JEDEC JESD22-A108C / 2005 [91]	96-hour window is inappropriate after removal of bias
AEC-Q101-Rev-C / 2005 [92]	No consideration about characteristic change at high temperature

As a result, the selection of ageing indicators should be paid special attention to. For example, the frequently used  $R_{ds\ on}$  in Si device ageing tests experiences a conspicuous increase resulted from positive gate bias and temperature stress. Therefore, it is not proper to be an ageing indicator of SiC MOSFET devices. Besides, drain-source on-state voltage is not suitable for ageing indicator either because of its high sensitivity with oxide trapping [41].

#### 2) Power Cycling Test methods for SiC MOSFET Modules

Among the four active power cycling control methods, the strategy with constant junction temperature swing can achieve the longest lifetime since it compensates most degradation effects [93]. Hence, from the perspective of non-destructive test, temperature variation should be constant in the power cycling test. But in SiC MOSFET, there is charging and discharging of near-interfacial oxide traps [26], which causes the shift of threshold voltage, on-resistance, drain-source voltage. Thus, the injected DC power is unexpectedly changed. As a result, the junction temperature swing would also experience a shift due to the change in the applied thermal stress. Therefore, there exist some intrinsic issues in the SiC MOSFET based active power cycling tests in DC mode.

On the other hand, power cycling test in PWM mode can actively compensate the temperature swing caused by the trapping effect. Furthermore, in reality the degradation mechanism in the PWM controlled power cycling tests [34] is much more similar to the ageing process.

In terms of the above two considerations, power cycling tests in PWM mode rather than DC mode are more reasonable for the SiC MOSFET devices.

### V. THERMAL PROFILE EXTRACTION

To verify the proposed inverter-level electro-thermal modeling procedures, a PLECS simulation based on the hybrid electric vehicle (HEV) application has been conducted. The topology is shown in Fig.4. The 3-phase electric motor is

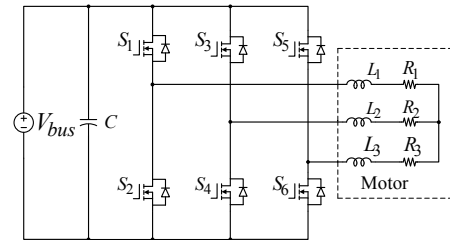


Fig.4 SiC MOSFET based two-level three-phase inverter

modeled by 3-phase in-series resistor and inductor loads. The studied HEV inverter parameters are: Active power – 58.52kW, Phase current RMS – 180A, Power factor – 0.85. The input DC bus voltage and input average current are 600V and 97.53A, respectively. The simulation parameters are: Switching frequency – 20kHz, Modulation index – 0.6. SPWM control method is adopted in this simulation.

BSM300D12P2E001 Full SiC MOSFET power module by Rohm is chosen. The switching turn-on, turn-off, and

conduction loss look-up tables are presented in Fig.5-7, respectively. The switching loss curve extraction is based on the turn-on gate-source voltage  $V_{gs\_on}$  of 18V, turn-off gate-source voltage  $V_{gs\_off}$  of 0V, gate resistance  $R_g$  of  $0.2\Omega$  and drain-source voltage  $V_{ds}$  of 600V. The conduction loss curve extraction is based on the relationship between the on-resistance and the junction temperature with the drain current  $I_d$  of 300A. The thermal impedance parameters provided by the corresponding datasheet from Rohm are used.

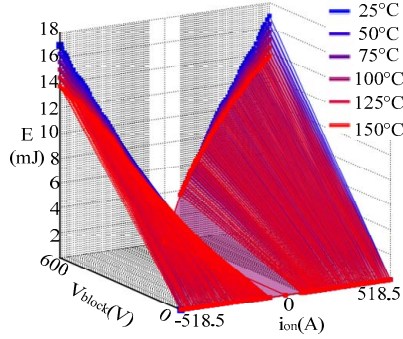


Fig.5 Turn-on Loss Look-up Table

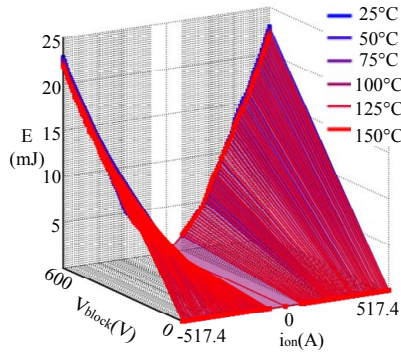


Fig.6 Turn-off Loss Look-up Table

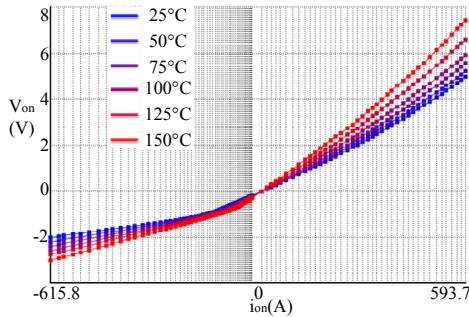


Fig.7 Conduction Loss Look-up Table

Fig. 8 shows the simulated thermal profile and average losses. The average conduction and switching losses of each SiC MOSFET are about 130W, 215W respectively. The junction temperature in the steady state is between 102°C and 104°C. The electro-thermal simulation results are consistent with the thermal equivalent circuit based temperature calculation. Therefore, it can be used for further system

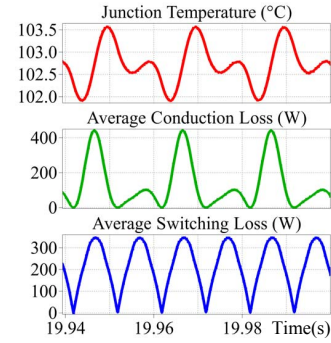


Fig.8. Thermal simulation results

lifetime modeling and the reference for SPWM controlled, SiC MOSFET based 3-phase inverter power cycling tests.

## VI. CONCLUSIONS

This paper gives a review on a step-by-step lifetime prediction of the SiC MOSFET based 3-phase inverter systems. Based on the Weibull distribution statistical characteristics of five stress variables, the system failure rate and system MTTF integrating three groups of failure modes are first derived. An overview of the SiC MOSFET Physics-of-Failure is summarized. The power loss, thermal analysis, thermo-mechanical modeling, and inverter failure damage accumulation modeling are carefully compared. Besides, cycle counting methods are discussed and the power cycling method applicable to the SiC MOSFET power modules is analyzed. Finally, an electro-thermal simulation is conducted to verify the proposed inverter-level temperature profile extraction. The simulation result is consistent with the theoretical calculation. It can be used for further inverter-level lifetime modeling as well as the theoretical thermal reference of SiC MOSFET based 3-phase inverter power cycling tests in SPWM mode.

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## REFERENCES

- [1] N. C. Sintamarean et al., "The impact of gate-driver parameters variation and device degradation in the PV-inverter lifetime," 2014 IEEE Energy Convers. Congr. Expo., pp. 2257–2264, 2014.
- [2] N. C. Sintamarean et al., "A design tool to study the impact of mission-profile on the reliability of SiC-based PV-inverter devices," Microelectron. Reliab., vol. 54, no. 9–10, pp. 1655–1660, 2014.
- [3] K. Ma et al., "Thermal loading and lifetime estimation for power device considering mission profiles in wind power converter," IEEE Trans. Power Electron., vol. 30, no. 2, pp. 590–602, 2015.
- [4] D. Hirschmann et al., "Reliability prediction for inverters in hybrid electrical vehicles," IEEE Trans. Power Electron., vol. 22, no. 6, pp. 2511–2517, 2007.



- [5] H. Wang et al., "Toward reliable power electronics: Challenges, design tools, and opportunities," *IEEE Ind. Electron. Mag.*, vol. 7, no. 2, pp. 17–26, 2013.
- [6] H. S. Chung et al., "Lifetime Modeling and prediction of power devices," in *Reliability of Power Electronic Converter Systems*, 1st ed. London, U.K.: IET, 2015, ch. 9, pp. 229–241.
- [7] T. Zhao et al., "Comparisons of SiC MOSFET and Si IGBT Based Motor Drive Systems," 42nd IEEE IAS Annual Meeting. Conference Record, New Orleans, LA, 2007, pp. 331–335.
- [8] A. Elasser and T. P. Chow, "Silicon carbide benefits and advantages for power electronics circuits and systems," in *Proceedings of the IEEE*, vol. 90, no. 6, pp. 969–986, Jun 2002.
- [9] S. Pettersson et al., "Performance evaluation of custom-made 1.2-kV 100-A silicon carbide half-bridge module in three-phase grid connected PWM rectifier," *IEEE Energy Convers. Congr. Expo.*, pp. 4138–4144, 2015.
- [10] N. C. Sintamarean et al., "Comprehensive evaluation on efficiency and thermal loading of associated Si and SiC based PV inverter applications," *IECON Proc. (Ind. Electron. Conf.)*, pp. 555–560, 2013.
- [11] S. Hazra et al., "High Switching Performance of 1700V, 50A SiC Power MOSFET over Si IGBT/BiMOSFET for Advanced Power Conversion Applications," *IEEE Trans. Power Electron.*, vol. 8993, no. c, pp. 1–1, 2015.
- [12] X. Lyu, N. Ren, Y. Li and D. Cao, "A SiC-Based High Power Density Single-Phase Inverter With In-Series and In-Parallel Power Decoupling Method," in *IEEE Journal of Emerging and Selected Topics in Power Electronics*, vol. 4, no. 3, pp. 893–901, Sept. 2016.
- [13] Md Arifujaman, Liuchen Chang, "Reliability Comparison of Power Electronic Converters Used in Grid-Connected Wind Energy Conversion," 3rd IEEE International Symposium on Power Electronics for Distributed Generation Systems (PEDG), pp. 323–329, 2012.
- [14] Y. Song and B. Wang, "Survey on reliability of power electronic systems," *IEEE Trans Power Electron*, vol 28, no 1, pp. 591–604, 2013.
- [15] O. Alavi et al., "A Comparative Reliability Study of Three Fundamental Multilevel Inverters Using Two Different Approaches," *Electronics*, vol. 5, no. 2, p. 18, 2016.
- [16] J. Colmenares et al., "Reliability Analysis of a High-Efficiency SiC Three-Phase Inverter for Motor Drive Applications," 2016 IEEE Appl. Power Electron. Conf. Expo., pp. 746–753, 2016.
- [17] Y. Song and B. Wang, "Analysis and experimental verification of a fault-tolerant HEV powertrain," *IEEE Trans. Power Electron.*, vol. 28, no. 12, pp. 5854–5864, 2013.
- [18] A. Pregelj, M. Begovic, and a. Rohatgi, "Impact of inverter configuration on PV system reliability and energy production," *Conf. Rec. Twenty-Ninth IEEE Photovolt. Spec. Conf.*, pp. 1388–1391, 2002.
- [19] L. Wei et al., "Analysis of PWM frequency control to improve the lifetime of PWM inverter," *IEEE Trans. Ind. Appl.*, vol. 47, no. 2, pp. 922–929, 2011.
- [20] Y. Song, B. Wang, "Evaluation Methodology and Control Strategies for Improving Reliability of HEV Power Electronic System," *IEEE Trans. on Vehicular Technology* vol. 63, no. 8, pp. 3661–3676, 2014.
- [21] Hui Huang, "Lifetime Prediction for Power Converters," Ph.D. Dissertation at the University of Warwick, October, 2013.
- [22] R. Green et al., "Application of reliability test standards to SiC Power MOSFETs," *IEEE Int. Reliab. Phys. Symp. Proc.*, pp. 756–764, 2011.
- [23] T. T. Nguyen et al., "Gate Oxide Reliability Issues of SiCMOSFETs Under Short-Circuit Operation," *IEEE Trans. Power Electron.*, vol. 30, no. 5, pp. 2445–2455, 2015.
- [24] R. Ouaida et al., "Gate oxide degradation of SiC MOSFET in switching conditions," *IEEE Electron Device Lett.*, vol 35, no 12, pp. 1284–1286, 2014.
- [25] A. J. Lelis et al., "Time dependence of bias-stress-induced SiC MOSFET threshold-voltage instability measurements," *IEEE Trans. Electron Devices*, vol. 55, no. 8, pp. 1835–1840, 2008.
- [26] A. J. Lelis et al., "Basic mechanisms of threshold-voltage instability and implications for reliability testing of SiC MOSFETs," *IEEE Trans. Electron Devices*, vol. 62, no. 2, pp. 316–323, 2015.
- [27] N. Stojadinovic et al., "Impact of Negative Bias Temperature Instabilities on Lifetime in p-channel Power VDMOSFETs," *Telecommunications in Modern Satellite, Cable and Broadcasting Services TELSIKS*, 8th International Conf. on, Nis, 2007, pp. 275–282.
- [28] T. Santini et al., "Accelerated degradation data of SiC MOSFETs for lifetime and Remaining Useful Life assessment," *Microelectron. Reliab.*, vol. 54, no. 9–10, pp. 1718–1723, 2014.
- [29] A. J. Lelis et al., "Effect of Threshold-Voltage Instability on SiC DMOSFET Reliability," 2008 IEEE International Integrated Reliability Workshop Final Report, S. Lake Tahoe, CA, 2008, pp. 72–76.
- [30] P. Losee et al., "1.2kV class SiC MOSFETs with improved performance over wide operating temperature," 2014 IEEE 26th International Symposium on Power Semiconductor Devices & IC's (ISPSD), Waikoloa, HI, 2014, pp. 297–300.
- [31] A. Grekov et al., "Effect of basal plane dislocations on characteristics of diffused 4H-SiC p-i-n diodes," *IEEE Trans. Electron Devices*, vol. 52, no. 12, pp. 2546–2551, 2005.
- [32] R. Bonyadi et al., "Investigating the reliability of SiC MOSFET body diodes using fourier series modelling," 2014 IEEE Energy Convers. Congr. Expo., pp. 443–448, 2014.
- [33] K. Peng et al., "Characterization and modeling of SiC MOSFET body diode," *IEEE Appl. Power Electron. Conf. Expo.*, pp. 2127–2135, 2016.
- [34] C. Durand et al., "Power Cycling Reliability of Power Module: A Survey," vol. 16, no. 1, pp. 80–97, 2016.
- [35] A. S. Bahman et al., "Mission-profile-based stress analysis of bondwires in SiC power modules," *Microelectron. Reliab.* 64, October, 2016.
- [36] L. Yang et al., "Physics-of-failure lifetime prediction models for wire bond interconnects in power electronic modules," *IEEE Trans. Device Mater. Reliability*, vol. 13, no. 1, pp. 9–17, Mar. 2013.
- [37] M. Ciappa, "Selected failure mechanisms of modern power modules," *Microelectron. Reliab.*, vol. 42, no. 4–5, pp. 653–667, 2002.
- [38] M. K. Das et al., "10 kV, 120 A SiC half H-bridge power MOSFET modules suitable for high frequency, medium voltage applications," 2011 IEEE Energy Conversion Congress and Exposition, Phoenix, AZ, 2011, pp. 2689–2692.
- [39] L. Cheng and J. W. Palmour, "Cree's SiC Power MOSFET Technology: Present Status and Future Perspective" 9th Annual SiC MOS Workshop, UMD, USA, Aug 14–15, 2014.
- [40] L. Stevanovic et al., "Readiness of SiC MOSFETs for Aerospace and Industrial Applications", 16th International Conference on Silicon Carbide and Related Materials ICSCRM, 2015.
- [41] A. Ibrahim et al., "Power cycling issues and challenges of SiC-MOSFET power modules in high temperature conditions," *Microelectron. Reliab.*, vol. 58, pp. 204–210, March 2016.
- [42] K. Yang et al., "Transient electro-thermal analysis for a MOSFET based traction inverter," *IEEE Transp. Electr. Conf. Expo*, pp. 1–6, 2014.
- [43] H. Wang and F. Blaabjerg, "Reliability of Capacitors for DC-Link Applications in Power Electronic Converters—An Overview," in *IEEE Trans. on Ind. Appl.*, vol. 50, no. 5, pp. 3569–3578, Sept.-Oct. 2014.
- [44] V. Blasko et al., "On line thermal model and thermal management strategy of a three phase voltage source inverter," *IEEE Thirty-Fourth IAS Annual Meeting*, Phoenix, AZ, vol.2, pp. 1423–1431, 1999.
- [45] J. Nelson et al., "Fast thermal profiling of power semiconductor devices using Fourier techniques," *IEEE Transactions on Industrial Electronics*, vol. 53, no. 2, pp. 521–529, April. 2006.
- [46] Z. Luo et al., "A thermal model for insulated gate bipolar transistor module," *IEEE Trans Power Electron*, vol. 19, no. 4, pp. 902–907, 2004.
- [47] Chan-Su Yun et al., "Thermal component model for electrothermal analysis of IGBT module systems," in *IEEE Transactions on Advanced Packaging*, vol. 24, no. 3, pp. 401–406, Aug 2001.
- [48] Y. Yang et al., "Transient frequency-domain thermal measurements with applications to electronic packaging," *IEEE Trans. Components, Packag. Manuf. Technol.*, vol. 2, no. 3, pp. 448–456, 2012.
- [49] K. Ma et al., "Frequency-Domain Thermal Modeling and Characterization of Power Semiconductor Devices," *IEEE Trans. Power Electron.* vol. 31, no. 10, pp. 7183–7193, 2016.

- [50] I. Swan et al., "A fast loss and temperature simulation method for power converters, part II: 3-D thermal model of power module," *IEEE Trans. Power Electron.*, vol. 27, no. 1, pp. 258–268, Jan. 2012.
- [51] A. R. Hefner, "A dynamic electro-thermal model for the IGBT," in *IEEE Trans. on Ind. Appl.*, vol. 30, no. 2, pp. 394–405, Mar/Apr 1994.
- [52] M. Ishiko and T. Kondo, "A Simple Approach for Dynamic Junction Temperature Estimation of IGBTs on PWM Operating Conditions," *IEEE Power Electron. Specialists Conf., Orlando, 2007*, pp. 916–920.
- [53] N. Baker et al., "Improved reliability of power modules: A review of online junction temperature measurement methods," *IEEE Ind. Electron. Mag.*, vol. 8, no. 3, pp. 17–27, 2014.
- [54] U. Drofenik and J.W. Kolar, "A Thermal model of a forced-cooled heat sink for transient temperature calculations employing a circuit simulator," *IEEE Trans. Ind. Appl.*, vol. 126, no.7, pp. 841–851, 2006.
- [55] A. S. Bahman, K. Ma, and F. Blaabjerg, "A novel 3D thermal impedance model for high power modules considering multi-layer thermal coupling and different heating/cooling conditions," *2015 IEEE Appl. Power Electron. Conf. Expo.*, pp. 1209–1215, 2015.
- [56] A. Koenig et al., "On-line junction temperature measurement of CoolMOS devices," *Proc. Int. Conf. Power Electron. Drive Syst.*, pp. 90–95, 2007.
- [57] N. Baker, S. Munk-Nielsen, and S. Beczkowski, "Test setup for long term reliability investigation of Silicon Carbide MOSFETs," *2013 15th Eur. Conf. Power Electron. Appl. EPE*, 2013.
- [58] J. Brandelero, J. Ewanchuk, and S. Molloy, "Online junction temperature measurements for power cycling power modules with high switching frequencies," *Proc. Int. Symp. Power Semicond. Devices ICs*, vol. 2016–July, pp. 191–194, 2016.
- [59] H. Chen et al., "On-line Monitoring of the MOSFET Device Junction Temperature by Computation of the Threshold Voltage," *Intl. Conf. on Power Electron., Mach. and Drives*, Dublin, Ireland, 2006, pp. 440–444.
- [60] Z. Zhang et al., "Online Junction Temperature Monitoring Using Turn-Off Delay Time for Silicon Carbide Power Devices," *IEEE Thirty-First Annual Energy Conversion Congress & Expo.*, 2016.
- [61] H. Niu and R. D. Lorenz, "Sensing power MOSFET junction temperature using gate drive turn-on current transient properties," *2014 IEEE Energy Convers. Congr. Expo.*, pp. 2909–2916, 2014.
- [62] D. Barlini et al., "Measurement of the transient junction temperature in MOSFET devices under operating conditions," *Microelectron. Reliab.*, vol. 47, no. 9–11 SPECIAL ISSUE, pp. 1707–1712, 2007.
- [63] J. Ortiz Gonzalez et al., "Enabling High Reliability Power Modules: A Multidisciplinary Task," *2016 International Symposium on 3D Power Electronics Integration and Manufacturing (3D-PEIM)*, 2016.
- [64] H. Niu and R. D. Lorenz, "Sensing power MOSFET junction temperature using circuit output current ringing decay," *2013 IEEE Energy Convers. Congr. Expo.*, pp. 4270–4277, 2013.
- [65] H. S. Chung et al., "Modelling for the lifetime prediction of power semiconductor modules," in *Reliability of Power Electronic Converter Systems*, 1st ed. London, U.K.: IET, 2015, ch. 5, pp. 104–124.
- [66] W. W. Lee, L. T. Nguyen, and G. S. Selvaduray, "Solder joint fatigue models: Review and applicability to chip scale packages," *Microelectron. Reliab.*, vol. 40, pp. 231–244, 2000.
- [67] J.-P. Clech, "Solder reliability solutions: A PC-based design-for-reliability tool," *Soldering & Surface Mount Technology*, vol. 9, pp. 45–54, 1997.
- [68] I. F. Kovacevic, U. Drofenik and J. W. Kolar, "New physical model for lifetime estimation of power modules," *Power Electronics Conference (IPEC)*, 2010 International, Sapporo, 2010, pp. 2106–2114.
- [69] M. A. Miner, "Cumulative damage in fatigue," *Journal of Applied Mechanics*, Issue 3, pp. A159–A164, 1945.
- [70] A. Fatemi and L. Yang, "Cumulative fatigue damage and life prediction theories -- a survey of the state of the art for homogeneous materials," *Int. Journal of Fatigue*, Vol. 20, No. 1, pp. 9–34, 1998.
- [71] S. S. Manson et al., "Application of a Double Linear Damage Rule To Cumulative Fatigue," *NASA Technical Note, NASA TN D-3839*, NASA Lewis Research Center; Cleveland, OH, April 1967.
- [72] H. Gao et al., "A modified nonlinear damage accumulation model for fatigue life prediction considering common interaction effects," *Scientific World Journal*, 2014.
- [73] The U.S. Department of Defense, "Test Method Standards: Transistor Electrical Test Methods For Semiconductor Devices" MIL-STD-750-3, January 2012, p. 53.
- [74] J. Harms, Revision of MIL-HDBK-217, Reliability Prediction of Electronic Equipment, pp. 1–3, 2010.
- [75] J. Meeleish, Enhancing MIL-HDBK-217 Reliability Predictions with Physics of Failure Methods, pp. 1–6, Jan. 2010.
- [76] P. D. Reigosa et al., "Prediction of bond wire fatigue of IGBTs in a PV inverter under long-term operation," *IEEE Transactions on Power Electronics*, Vol. 31, NO. 10, pp. 7171–7182, October 2016.
- [77] A. Morozumi et al., "Reliability of power cycling for IGBT power semiconductor modules," *IEEE Trans. Ind. Appl.*, vol. 39, no. 3, pp. 665–671, May 2003.
- [78] A. Bryant et al., "Exploration of power device reliability using compact device models and fast electrothermal simulation," *IEEE Trans. Ind. Appl.*, vol. 44, no. 3, pp. 894–903, May 2008.
- [79] R. Bayerer et al., "Model for power cycling lifetime of IGBT modules—Various factors influencing lifetime," in *Proc. Int. Conf. Integr. Power Syst.*, 2008, pp. 1–6.
- [80] J. McPherson, "Time-to-Failure Models for Selected Failure Mechanisms," in *Reliable Physics and Engineering: Time-to-Failure Modeling*, 2<sup>nd</sup> ed. Switzerland: Springer Int., 2013, ch. 11, sec. 4, p. 159.
- [81] M. Ciappa, "Lifetime Modeling and Prediction of Power Devices," *5th Int. Conf. Integr. Power Electron. Syst.*, pp. 27–36, 2008.
- [82] M. Held et al., "Fast power cycling test for IGBT modules in traction application," in *Proc. Power Electron. Drive Syst.*, vol. 86, no. 10, pp. 1193–1204, 1999.
- [83] A. Syed, "Limitations of Norris-Landzberg equation and application of damage accumulation based methodology for estimating acceleration factors for Pb free solders," *Thermal, Mechanical & Multi-Physics Simulation, and Experiments in Microelectronics and Microsystems (EuroSimE)*, 11th International Conference, Bordeaux, 2010, pp. 1–11.
- [84] N. C. Sintamarean et al., "Reliability Oriented Design Tool for the New Generation of Grid Connected PV-Inverters," *IEEE Trans. Power Electron.*, vol. 30, no. 5, pp. 2635–2644, 2015.
- [85] ASTM, "ASTM E1049-85: Standard Practices for Cycle Counting in Fatigue Analysis," E1049 - 85, vol. 85, pp. 1–10, 2011.
- [86] K. Mainka, M. Thoben, and O. Schilling, "Lifetime calculation for power modules, application and theory of models and counting methods," *Power Electron. Appl. Proc. 14th Eur. Conf.*, pp. 1–8, 2011.
- [87] S. D. Downing, and D. F. Socie, "Simple Rainflow Counting Algorithms," *International Journal of Fatigue*, vol. 4, issue 1, pp. 31–40, 1982.
- [88] I. Rychlik, "A new definition of the rainflow cycle counting method," *International Journal of Fatigue*, vol. 9, issue 2, pp. 119–121, 1987.
- [89] L. GopiReddy et al., "Rainflow algorithm based lifetime estimation of power semiconductors in utility applications," *2014 IEEE Applied Power Electronics Conference and Exposition - APEC 2014*, Fort Worth, TX, 2014, pp. 2293–2299.
- [90] Mahera Musallam and C. Mark Johnson, "An Efficient Implementation of the Rainflow Counting Algorithm for Life Consumption Estimation," *IEEE Transactions on Reliability*, VOL. 61, NO. 4, pp: 978–986, December 2012.
- [91] JEDEC Solid State Technology Association, "JEDEC Standard: Temperature, Bias, and Operating Life," JESD22-A108C, June 2005.
- [92] Automotive Electronics Council, "Stress Test Qualification for Automotive Grade Discrete Semiconductors," AEC-Q101-Rev-C, 2005.
- [93] U. Scheuermann and S. Schuler, "Power cycling results for different control strategies," *Microelectron. Reliab.*, vol. 50, no. 9–11, pp. 1203–1209, 2010.