

Article

The Sensitivity of an Electro-Thermal Photovoltaic DC–DC Converter Model to the Temperature Dependence of the Electrical Variables for Reliability Analyses

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Abstract: The operational expenditures of solar energy are gaining attention because of the continuous decrease of the capital expenditures. This creates a demand for more reliable systems to further decrease the costs. Increased reliability is often ensured by iterative use of design for reliability. The number of iterations that can take place strongly depends on the computational efficiency of this methodology. The main research objective is to quantify the influence of the temperature dependence of the electrical variables used in the electro-thermal model on the reliability and the computation time. The influence on the reliability is evaluated by using a 2-D finite elements method model of the MOSFET and calculating the plastic energy dissipation density in the die-attach and the bond wire. The trade-off between computation time of the electro-thermal model in PLECS (4.3, Plexim, Zurich, Switzerland) and generated plastic energy accuracy obtained in COMSOL (5.3, COMSOL Inc., Burlington, MA, USA) is reported when excluding a certain temperature dependence. The results indicate that the temperature dependence of the input and output capacitors causes no change in the plastic energy dissipated in the MOSFET but does introduce the largest increase in computation time. However, not including the temperature dependence of the MOSFET itself generates the largest difference in plastic energy of 10% as the losses in the die are underestimated.

Keywords: photovoltaic; DC/DC converter; sensitivity; temperature dependence; plastic energy dissipation

1. Introduction

Renewable energy sources currently make up 28% of the global electricity generation (including hydro) and this is expected to rise towards 45% by 2040 [1]. The share of solar energy is currently only 4%, but it is considered the fastest growing electricity source due to a 40% increase in the compound annual growth rate (CAGR) over the last 15 years [2]. One of the main reasons for this exceptional growth is the continuous decrease in the levelized cost of electricity (LCOE) [3]. This decrease is mainly a result of the declining trend in manufacturing costs of the photovoltaic (PV) modules which represent a large part of the investment expenditures (CAPEX). These investment costs currently make up 75% of the LCOE with the other 25% allocated to operational and maintenance expenditures



(OPEX) [4]. As the CAPEX continues to decrease, the weight of the OPEX will start to increase which will shift the focus more towards increasing the reliability and lifetime of the solar energy system in order to further reduce the LCOE. As reported in [5], 60% of unscheduled maintenance costs are caused by failures occurring within the power electronics of the power conversion stage. In the majority of the cases, these failures are caused by the degradation of the packaging materials used for the switching devices which are exposed to large amounts of thermo-mechanical stress generated by the high operating temperatures and the large discrepancies in coefficients of thermal expansion (CTE) between the material layers [6-11]. A condition monitoring setup can provide insights into the degradation behavior of several electrical and thermal parameters of the power electronics during the operating conditions [12,13]. This process, however slow, provides the most valuable data over a long period of time to further improve the design of the individual components and the converter. Alternatively, highly accelerated stress testing is performed to reduce the amount of time for the degradation to occur but at the cost of potentially triggering failure mechanisms that would normally not occur during operating conditions [14,15]. Both of these techniques can provide an input for the design process to further enhance their design in order to increase the reliability but at a significant financial cost. A cheaper and faster method lies in applying design for reliability (DfR), an iterative design process (depicted in Figure 1) which prioritizes reliability [16,17]. This methodology quickly and accurately investigates the sensitivity of the design to several external inputs in order to propose more reliable design adaptations. A combination of constructing an electro-thermal model of the used topology and constructing a finite elements method (FEM) model of the most failure-prone component [18] is often adopted but other methods which employ empirical lifetime models are also used for their computational efficiency [19]. In either case, constructing an electro-thermal model of a photovoltaic DC–DC converter is the first step in understanding the thermo-mechanical stress generated inside of the individual components. Various literature is available on the different methods of creating the electro-thermal model of an electrical circuit although every single method is based on several assumptions [20–22]. The electrical part can be expanded with multiple levels of detail as every component has several parasitic inductances, capacitances and resistances in either series or parallel [23]. The amount of parasitics included depends mostly on the application of the model. For reliability analyses, the parasitic series resistances are only considered as they contribute towards heat generation through Joule heating [24]. The thermal part can be expanded towards a 3-D heat diffusion model for every component [25] or can be simplified to a 1-D lumped thermal network that interconnects all of components on the PCB [26]. Not only is the heat generation and coupling of each component on the printed circuit board (PCB) included into the electro-thermal model, but also the temperature dependence of the electrical variables such as the capacitances, the parasitic series resistances and the solar panel itself [17]. Including these temperature dependences contributes towards either increasing or decreasing the overall computational efficiency of this methodology. Therefore, appropriate sensitivity analyses are required to quantify the respective trade-offs between the gain in accuracy and computation time. This paper reports and quantifies these trade-offs in order for circuit designers to determine whether they have to include these levels of detail in their DfR methodology or can neglect them in order to reduce the overall computation time.

The methodology used to perform the required sensitivity analyses is depicted in Figure 2 together with the structure of the paper. Firstly, in Section 2, an electro-thermal model is constructed based on an interleaved boost converter used in photovoltaic applications. The model is based on the datasheets of the respective components as well as a few assumptions regarding the thermal network. Electro-thermal coupling and maximum power point tracking (MPPT) are also implemented. In Section 3, the constructed model is validated by creating a steady state lookup table from experimental testing. In Section 4, a FEM model is constructed of the used MOSFET based on X-raying imaging in order to calculate the difference in accuracy in generated stress in the form of plastic dissipation energy density. In Section 5, the trade-offs between the computation time of the electro-thermal model and the plastic energy generated in the MOSFET for not including

the temperature dependence of a certain electrical variable are reported. Lastly, Section 6 draws the conclusion.



Figure 1. The Design for Reliability methodology applied to photovoltaic DC/DC converters [17].



Figure 2. Flowchart of the paper methodology and structure.

2. Electro-Thermal Model of the Photovoltaic DC/DC Converter

As stated in the introduction section, constructing an electro-thermal model of a certain circuit topology is the first step in order to quantify the thermo-mechanical stress generated inside each component. Apart from the base components with their respective values, the electrical part can be expanded with multiple levels of detail in the form of parasitic elements. For the thermal part, the three main thermal paths, namely conductive, convective and radiative heat transfer, need to be considered for each component as well as the temperature dependence of each electrical variable. Finally, a maximum power point tracking algorithm and control system need to be implemented in order to adjust the duty cycle of the switching devices for a certain combination of solar panel irradiance and ambient temperature. The electro-thermal model is implemented using PLECS Blockset (4.3, Plexim, Zurich, Switzerland) and Simulink (9.3, MathWorks, Natick, MA, USA).

2.1. Electrical

The electrical model is constructed based on a three-leg interleaved boost converter for photovoltaic applications depicted in Figure 3. This topology stands out in terms of reliability when compared to the traditional boost converter due to the built-in redundancy and the ability to distribute the thermal stresses among all parallel components [27]. This topology also reduces

the input and output ripple current and in turn, fewer capacitors are required to smoothen out the input and output voltage. In terms of parasitic elements, there are multiple levels of detail that can be added for each component in the form of inductances, capacitances or resistances in either series or parallel [23]. Only the parasitic series resistances are taken into account as they conduct the nominal current and are therefore the main sources of heat generation as a consequence of Joule heating. This includes the DC resistance *DCR* of each inductor, the equivalent series resistance *ESR* of each capacitor, the drain-source on-resistance $R_{ds(on)}$ of each MOSFET and the on-resistance R_{on} of each diode. The converter is designed to boost the input voltage of a 200 W crystalline silicon solar panel from 30 V to 100 V at a switching frequency f_{sw} of 100 kHz. The pulse width modulation (PWM) signal arriving at the gates of the MOSFETs is also phase-shifted by a third of the switching period T_s per leg in order to further reduce the ripple current at the input and the output. The components together with their key parameters and series resistance at standard test conditions (STC) used in the topology are listed in Table 1.



Figure 3. Photograph (**left**) of the printed circuit board assembly and the schematic (**right**) of a three-leg interleaved boost converter for photovoltaic applications.

Table 1. The components used in the interleaved boost converter together with their key parameters and series resistance.

Component	Туре	Value	Series Resistance
Solar panel PV	Kyocera Solar KC200GT	$V_{oc} = 32.9 \text{ V}$ $I_{sc} = 8.21 \text{ A}$	$R_s = 0.221 \ \Omega$
Input Capacitor C _{in} (9)	AVX MLCC 12061C225KAT2A	$C = 2.2 \ \mu F$	$ESR_{in} = 0.018 \Omega$
Inductor L ₁ , L ₂ , L ₃	Bourns SRP1770TA-101M	$L = 100 \ \mu H$	$DCR = 0.102 \ \Omega$
MOSFET S ₁ , S ₂ , S ₃	Infineon IPB320N20N3	$V_{ds} = 200 \text{ V}$ $I_d = 34 \text{ A}$	$R_{ds(on)} = 0.032 \ \Omega$
Diode D ₁ , D ₂ , D ₃	Vishay VS-10CSH02HM3	$V_f = 0.625 \text{ V}$ $Q_{rr} = 18 \text{ nC}$	$R_{on} = 0.100 \ \Omega$
Output Capacitor C _{out} (7)	KEMET MLCC C1206C154K2RACTU	$C = 0.15 \ \mu F$	$ESR_{out} = 0.265 \Omega$

2.2. Thermal

The steady state Foster thermal network implemented in the electro-thermal model is shown in Figure 4 as an equivalent electrical circuit in which the temperature is equal to the voltage and the heat losses are replaced by current sources [26]. It is supported by several assumptions reported in previous work [28,29]. Here, the main purpose of the electro-thermal model is to create steady state temperature lookup tables for various components in order to translate mission profiles and perform reliability analyses [17]. For this reason, all thermal capacitances in the thermal network are disabled as this greatly reduces the required computation time to reach the steady state. As mentioned in the previous subsection, the main heat source for each component is the joule heating or conduction losses generated by current flowing through the component's respective parasitic series resistance.

In addition to this, the switching devices also generate heat through their switching losses for which the calculation methods can be found in [30]. The thermal network assumes a single conductive thermal resistance in between the component's heat source and its case. Next, the heat can either be transferred into the surrounding air through the convective thermal resistance or into the PCB through another conductive thermal resistance. Both of these mediums are considered as heat sinks that redistribute the heat among the connected components. Finally, the PCB can transfer its heat into the air through a final convective thermal resistance. In order to include the effect of radiative heat transfer, the convective heat transfer coefficient *h* in still air (natural convection) was slightly oversized according to [31]. Equation (1) displays the formula used to calculate the conductive thermal resistance with *d* the thickness of the material, *k* the thermal conductivity of the material and *A* the cross-sectional surface area. Equation (2) displays the formula used to calculate the convective thermal resistance with *h* being the convective heat transfer coefficient and *A* being the cross-sectional surface area. Table 2 lists the calculated thermal resistances used in the thermal network. If a certain value was provided through the component's datasheet, then that value is adopted instead. The temperature dependence nor the degradation dependence of these values is included as it falls outside of the scope of this paper.

$$R_{th,cond} = d/(k*A) \tag{1}$$

$$R_{th,conv} = 1/(h * A) \tag{2}$$



Figure 4. Steady state Foster thermal network of a three-leg interleaved boost converter.

Table 2. The thermal resistances for the heat transfer of the converter's components and PCB used in the thermal network of Figure 4.

Thermal Resistance	Value (K/W)	Thermal Resistance	Value (K/W)	Thermal Resistance	Value (K/W)
Inductor core to case	2.0	Inductor case to PCB	11.6	Inductor case to air	34.5
Diode junction to case	2.5	Diode case to PCB	48.6	Diode case to air	150.6
Input capacitor hotspot to case	10.4	Input capacitor case to PCB	664.1	Input capacitor case to air	2741.2
Output capacitor hotspot to case	3.3	output capacitor case to PCB	664.1	Output capacitor case to air	1395.1
MOSFET junction to case	1.1	MOSFET case to ambient	68.9	PCB to air	4.1

2.3. ElectroThermal Coupling

In the previous two subsections, both the electrical model and the thermal model were discussed separately. Although the thermal model is based on the heat generated by the electrical components, the influence of the temperature on the electrical variables, which is the main focus of this paper, still has to be implemented. The chosen approach is based on 1-D lookup tables that can be extracted from the datasheet of the respective component. In practice, every temperature dependent electrical variable is updated through the connected lookup table for every switching period T_s until the relative tolerance of the simulation is reached. In this topology, there is a lookup table for the temperature dependence of every inductance of the inductors, of every on-resistance of the MOSFETs or the diodes and of every forward voltage drop of the diodes. In addition, the temperature dependences of the capacitance and ESR of all of the input capacitors are represented by two lookup tables. The same has been applied to the output capacitors. The final lookup table is used for the temperature dependence of the solar panel. A total of 17 lookup tables are used in the electro-thermal model of the three-leg interleaved DC–DC converter. When the simulation is performed at a switching frequency f_{sw} of 100 kHz and 17 different lookup tables are considered, the computation time will be longer and more sensitive to the level of detail. The sensitivity of the electro-thermal model to these temperature dependences is discussed further in Section 5 for each component.

2.4. Maximum Power Point Tracking

In order to accurately emulate the operating conditions of the solar panel and the DC–DC converter, a maximum power point tracking (MPPT) algorithm and control system are implemented in the simulations. In this case, the perturb and observe (P&O) algorithm is used as it is easily implemented and has proven to be reliable in past publications [32]. The current control system consists of a PI controller with a proportional action K_p of -0.03 and an integral action K_i of 39.48. The importance of including an MPPT into the simulations is shown in Figure 5. As the temperature dependence of the solar panel is included, the voltage at maximum power point V_{mpp} decreases with every increase in ambient temperature. This means that an increase in duty cycle is required to boost the input voltage towards the constant DC bus of 100V at higher temperatures which leads to higher conduction losses in the switching devices. For solar panel irradiances lower than 375 W/m², or an input current lower than 2.8 A, a decline in duty cycle is noticed as the converter shifts from continuous conduction mode (CCM) into discontinuous conduction mode (DCM) which decreases the conduction losses.



Figure 5. Duty cycle of a three-leg interleaved boost converter connected to a 100 V DC bus vs solar panel (KC200GT) irradiance (W/m^2) for various ambient temperatures.

3. Experimental Fine-Tuning and Validation of the Electro-Thermal Model

In the previous section, the electro-thermal model of the three-leg interleaved boost converter model was constructed while mainly using the datasheets of the respective components together with a few assumptions to create and interconnect the thermal network. This section will determine the base error between the simulated and measured component case temperatures for the components within the examined boost converter for various combinations of ambient temperature and input power. A steady state temperature lookup table is obtained for each component by using the input power profile and the ambient temperature profile shown in Figure 6. The experimental setup used to validate the model is shown in Figure 7. A climate chamber varies the ambient temperature from 5 °C to 65 °C with a step of 10 °C while a programmable voltage source controls the input power from 0 W to 195 W in steps of 15 W for every change in ambient temperature. Furthermore, a constant duty cycle of 0.3 is applied to the MOSFETs of the converter in order to prevent the input current from exceeding the maximum operating value of 10 A at the last step of the power profile. A switching frequency of 100 kHz was applied to the gates of the MOSFETs and a constant output resistance of 7.2 Ω is used to dissipate the power. Both the input and output voltages as well as the currents are logged every minute in order to determine the power losses dissipated in the DC–DC converter for a total of 10 min per power step. The component case temperatures are simultaneously logged every minute using a FLIR X6580sc infrared camera with a resolution of 640 by 512 pixels in combination with an infrared window mounted in the door of the climate chamber. In order to remove the disparity in surface emissivity, the DC–DC converter has been coated with a thermographic paint that provides a uniform and temperature stable emissivity of 0.92 for each component case. Acquiring the actual component case temperatures will thus require only a single emissivity conversion for the entire PCB.

The resulting average case temperatures for each component over the three legs of the interleaved boost converter are illustrated in Figure 8 after enduring the input profiles from Figure 6. It can be seen from Figure 8 that the diodes obtain the highest case temperatures throughout the experiment with a difference of 20 °C in comparison with the rest of the components. This can be explained by the low duty cycle of 0.3 which requires the diodes to conduct double the amount of time in comparison to the MOSFETs. In addition, the required surface area for heat dissipation, which determines the thermal resistance of the diodes, is more limited in comparison with other components like the inductors.



Figure 6. The power (W) and ambient temperature (°C) profile used as the input for the experimental validation of the electro-thermal DC–DC converter model.



Figure 7. Schematic of the experimental setup used to fine-tune and validate the electro-thermal DC–DC converter model.



Figure 8. Average measured component case temperatures (°C) of the three-leg interleaved boost converter resulting from the input profile shown in Figure 6.

In order to validate the electro-thermal model using the case temperature profiles mentioned above, a fine-tuning of the convective heat transfer coefficient h in the simulation is required to emulate the forced air flowing through the climate chamber more accurately. A value of 40 W/m^2 is adopted as it provides similar case temperatures from initial validation tests. The simulations have been performed for the power profiles of Figure 6 with ambient temperatures of 15 °C, 35 °C and 65 °C in order to acquire an overall understanding of the maximum error between the simulated and the experimentally determined case component temperatures. A graphical representation of the thermal validation of the MOSFETs is depicted in Figure 9. In addition, the generated power losses in both the simulation and the experiment are shown in Figure 10 for an ambient temperature of 65 °C. The maximum absolute errors for each component and ambient temperature at maximum converter input power are reported in Table 3. It would seem that the electro-thermal DC–DC converter model simulates an overall lower case temperature for each component with a maximum error of 3.03 °C. This can be explained by looking at the increase in dissipated power in Figure 10 between the experiment and the simulation. The error will probably originate from the absence (or inaccurate datasheet value) of a parasitic resistance that was not considered in Section 2.1. The quadratic increase in the error supports this explanation by means of Joule's law. However, localizing and adjusting this resistance value currently falls outside of the scope of the paper but this will be investigated in future work.



Figure 9. The simulated and measured MOSFET case temperatures for various ambient temperatures.



Figure 10. The simulated and measured converter power losses for an ambient temperature of 65 °C.

Table 3. The maximum errors between the simulated and the measured component case temperatures of the three-leg interleaved boost converter for various ambient temperatures.

Ambient Temperature (°C)	MOSFET Max. Error (°C)	Diode Max. Error (°C)	Input Capacitor Max. Error (°C)	Output Capacitor Max. Error (°C)	Inductor Max. Error (°C)
15	2.74	1.22	2.90	1.17	1.52
35	2.97	2.57	3.03	1.97	2.57
65	2.77	2.71	3.00	2.24	1.64

4. Constructing A FEM MOSFET Model

In the next section, the sensitivity of the electro-thermal DC–DC converter model to the temperature dependence of the electrical variables will be determined for reliability purposes. In order to evaluate the gain or loss in accuracy of a reliability analysis, a quantifiable output variable is required. Either the overall lifetime of a component can be estimated by analyzing the mission profile and using an empirical lifetime model [19] or a FEM model can be constructed in order to investigate

the amount of plastic energy dissipated in the failure-prone parts of a component that is likely to fail according to past field studies [33]. In this case, the latter has been chosen due to providing more control over inputs such as the dimensions of the component and constitutive material models as well as the boundary conditions. According to literature, the active switching devices, being the MOSFETs, are more prone to failure than the other components when not using aluminum electrolytic capacitors in the design [34,35]. Specifically the bond wires and the die-attach are sensitive to the thermal stress generated by the discrepancy in coefficients of thermal expansion (CTE) of the different materials [36]. For this reason, a 2-D FEM model of the used MOSFET listed in Table 1 is constructed. X-ray imaging has been performed in order to determine the dimensions of the various material layers. The materials used in this MOSFET are a copper *Cu* baseplate/heatsink, a solder *Sn3Ag0.5Cu* die-attach, a silicon *Si* die, aluminum *Al* bond wires/leads and an epoxy resin with *SiO*₂ filler encapsulant soldered onto an *FR* – 4 PCB [37,38]. The constructed 2-D FEM model together with the X-ray images and a photograph of the used MOSFET are illustrated in Figure 11. The properties of the materials used in this model can be found in Table 4



Figure 11. (**a**–**c**) X-ray images and (**d**) a photograph of the MOSFET used in the interleaved boost converter together with (**e**) the temperature distribution of the constructed 2-D FEM model under an arbitrary load.

Material	Young's Modulus (GPa)	Poisson's Ratio	Thermal Conductivity (W/mK)	Coefficient of Thermal Expansion (10 ⁻⁶ /K)
Epoxy resin (<i>SiO</i> ₂ fill)	13	0.34	0.6	23.0
Si	170	0.28	130.0	2.6
Al	70	0.33	238.0	23.0
Sn3Ag0.5Cu	55	0.36	55.0	22.0
Си	110	0.35	400.0	17.0
FR-4	22	0.15	0.3	18.0

Table 4. Properties of the materials u	sed in the 2-D FEM	MOSFET model of Fig	ure 11 extracted from
CES EduPack.			

As mentioned in the previous paragraph, it is known that the bond wires and the die-attach of the MOSFET are the most prone to failure due to thermo-mechanical stress. The plastic behavior of the bond wires and the die-attach will be analyzed in steady state simulations with boundary conditions extracted from the electro-thermal DC–DC converter model. The three thermal boundary conditions used are the surrounding air determined by the chosen ambient temperature, the temperature of the middle of the PCB determined by the conductive heat transfer of the surrounding components and the heat losses in the die generated by the conduction losses and the switching losses of the MOSFET. The Johnson-Cook constitutive material model, shown in Equation (3), is used to simulate the plastic behavior of the used metals [39]. In this equation, σ is the equivalent stress, ϵ is the equivalent plastic strain, A is the yield stress of the material under reference conditions, B is the strain

hardening constant, *n* is the strain hardening coefficient and *C* is the strain rate factor. Lastly, $\dot{\epsilon}^*$ is the dimensionless strain rate and *T*^{*} is the homologous temperature. The parameters used for every metal can be found in Table 5. A steady state surface plot of the plastic energy dissipation density inside the MOSFET is depicted in Figure 12 with boundary conditions extracted from the electro-thermal model using an input irradiance of 1000 W/m² and an ambient temperature of 25 °C. In this simulation, a maximum plastic energy dissipation density of 0.0974 J/cm³ is observed in the die-attach followed by 0.0636 J/cm³ in the heel of the bond wire. The steady state plastic energy dissipation density in the die-attach will therefore become the focus for quantifying the trade-offs in reliability for the sensitivity analyses of the next section.

$$\sigma = (A + B\epsilon^n)(1 + C_1 + \ln \dot{\epsilon}^*)(1 - T^{*m})$$
(3)

Material	A (MPa)	B (MPa)	п	т	С
<i>Cu</i> [40]	90	292	0.31	1.09	0.025
Sn3Ag0.5Cu [41]	38	275	0.0713	0.71	0.7
Al [42]	50	90	0.2	0.35	0.7

Table 5. Parameters used in the Johnson-Cook constitutive material model.



Figure 12. Steady state plastic energy dissipation density plot (J/cm³) of the constructed MOSFET FEM model resulting from a load of 1000 W/m² on the solar panel at 25 °C.

5. Sensitivity Analysis of the Electro-Thermal Model to the Temperature Dependent Electrical Variables

In this section, every temperature dependence of an electrical component included in the electro-thermal DC–DC converter model is evaluated in terms of change in the plastic deformation in the die-attach of the MOSFET, calculated with the aforementioned FEM model. The influence of not including a certain temperature dependence can be noticed by the MOSFET through a change in current which influences the losses generated in the junction, through a change in the surrounding temperature or through a combination of both. This will result in a change of the junction or case temperature of the MOSFET which will lead to an increase or decrease of thermal stress between the various material layers generated by the discrepancy in coefficients of thermal expansion (CTE). The irreversible part of this thermal stress, namely the plastic dissipation energy density, is then compared to the gain or loss in computation time for not including a certain temperature dependence in the electro-thermal model. In this topology, there is a lookup table for the temperature dependence of every inductance of the inductors, of every on-resistance of the MOSFETs or the diodes and of every forward voltage drop of the diodes. In addition, the temperature dependences of the capacitance and *ESR* of all of the input capacitors are represented by two lookup tables. The same has been applied to

the output capacitors. The final lookup table is used for the temperature dependence of the solar panel. A total of 17 lookup tables is evaluated for every switching period T_s which increases the computation time significantly. Without the thermal capacitances, a simulation time of 1 s is required to reach the steady state. This takes 2 h of computation time when including all of the temperature dependences. The trade-off between computation time and plastic energy dissipation density for not including every temperature dependence separately is illustrated in Figure 13.



Figure 13. The relative difference in maximum plastic energy dissipation density in the MOSFET die-attach (%) and computation time of the electro-thermal model (%) when excluding a certain temperature dependent electrical variable from the electro-thermal DC–DC converter model.

5.1. Capacitor

The variation in capacitance for either the input or the output capacitors used is determined by the type of dielectric. The X7R temperature stable dielectric provides a maximum capacitance variation of 15% over a temperature range of -55 °C to 125 °C. The temperature dependence of the equivalent series resistance *ESR* on the other hand can be calculated using Equation (4) with *DF* the dissipation factor from the datasheet, f_{sw} the used switching frequency and C(T) the capacitance at a certain temperature provided by the properties of the dielectric mentioned before. It should be noted that only two lookup tables are used for the nine capacitors at the input and another two lookup tables are used for the seven capacitors at the output.

$$ESR(T) = DF/(2\pi C(T)f_{sw})$$
(4)

5.2. Photovoltaic Module

As mentioned in Section 2.4, the duty cycle of the three-leg interleaved boost converter varies with the ambient temperature endured by the photovoltaic module. This is caused by the temperature dependence of the open circuit voltage V_{oc} and the short circuit current I_{sc} of the panel which can be extracted from the respective datasheet. The difference in I_{sc} over the ambient temperature is negligible as the current remains constant. However, the difference of the V_{oc} over a temperature range of $-25 \,^{\circ}\text{C}$ to 50 $^{\circ}\text{C}$ results in an increase of the duty cycle with 10% which increases the conduction losses of the MOSFET.

5.3. Inductor

The temperature dependence of the inductance is often expressed in a negative correlation with the current passing through the inductor instead of its core temperature. This is implemented as such in the electro-thermal model with a decrease in inductance of 23% over 4.8 A as reported in the

datasheet. The DC resistance *DCR* of the inductor, consisting only of the wire losses, is implemented as the maximum value mentioned in the datasheet instead of the typical value. The reason is that there is a small difference between these two values, and also the low value of the temperature coefficient of the copper wire of 0.0038 per $^{\circ}$ C.

5.4. MOSFET

The temperature dependence of the MOSFET affects both the conduction losses through the drain-source on-resistance $R_{ds(on)}$ and the switching losses. The exponential temperature dependent $R_{ds(on)}$ behavior can be extracted from the component's datasheet in relation to the gate-source voltage V_{gs} that is being applied.

5.5. Diode

Both the forward voltage drop V_F and the on-resistance R_{on} of the diode vary with the temperature. The first will decrease with an increase in temperature which makes it easier for the diode to turn on while the last will increase with a rise in temperature. This means that at higher temperatures, the diode will generate less losses when conducting low currents because of the small forward voltage drop. However, at high currents, this effect is compensated and overtaken by the increase in on-resistance which makes the diode generate more losses than at lower temperatures. The temperature dependence of both variables can be extracted from the provided datasheets.

5.6. Discussion

In Figure 13, large discrepancies can be observed for the various temperature dependences in terms of the difference in plastic dissipation energy density in the die-attach of the MOSFET and the computation time of the electro-thermal model. The two largest decreases in computation time of 37.06% and 41.78% are produced by not including the temperature dependence of the input and output capacitors respectively. This does also not introduce any errors in the plastic energy dissipated in the MOSFET as the capacitors themselves do not generate a significant amount of heat because of the small input and output current ripple. Not including the temperature dependence of the solar panel, at an ambient temperature of 25 °C, also does not induce a significant error. However, in a separate simulation this error rises towards 1% for an ambient temperature of 50 °C which makes this a significant level of detail for cold or warm locations. A reduction in computation time of 5.03% was observed in both cases.

The temperature dependences that do introduce a significant error on the plastic energy dissipated in the MOSFET are, sorted by severity, the MOSFET itself with an error of 9.95%, the diode with an error of 2.07% and the inductor with an error of 1.7%. Not including the temperature dependence of the MOSFET itself will underestimate the losses generated in the die significantly because of the exponential temperature behavior of the drain-source on-resistance $R_{ds(on)}$. The same reasoning can be applied to the diode and as a consequence less heat is transferred through the PCB and the surrounding air towards the MOSFET. Lastly, the temperature dependent change in inductance influences the current behavior and will therefore affect the losses generated in the MOSFET. In terms of computation time, not including the temperature dependence of the diode provides the largest reduction of 25.86% due to containing a lookup table for not only the on-resistance R_{on} but also for the forward voltage V_F . Not including the temperature dependence of the inductor will lead to a minor decrease in computation time of 6.13%. For the MOSFET, this reduction is 8.92% which is not considered a worthwhile trade-off due to the large error induced in the plastic dissipation energy density.

6. Conclusions

In this paper, the sensitivity of an electro-thermal model to the temperature dependence of the electrical variables was investigated. Firstly, an electro-thermal model of a three-leg interleaved boost converter for photovoltaic applications was constructed. Secondly, experimental testing was performed in order to fine-tune and validate this model. Thirdly, a 2-D FEM model of the MOSFET used in this converter was constructed based on X-Ray imaging results in order to calculate the plastic energy dissipation density in the failure-prone parts of the component. Finally, the trade-off for not including the temperature dependence of a certain electrical variable in the electro-thermal model on the plastic energy dissipation density in the die-attach of the MOSFET and the computation time of the electro-thermal model has been reported. The results indicated, on one hand, that the temperature dependence of the input capacitors, the output capacitors and the solar panel does not contribute to the plastic energy dissipated in the MOSFET while increasing the computation time significantly. On the other hand, the temperature dependence of the MOSFET, the diode and the inductor do generate a noticeable error. The best trade-off can be made by not including the temperature dependence of the diode as this would decrease the computation time by 25.86% while introducing an error of 2.07%. The temperature dependence of the MOSFET itself generates an error of 10% in plastic energy dissipation density and must therefore always be included in order to achieve accurate simulations. When taking these results into account, the computational efficiency of the electro-thermal modeling of DC–DC converters for reliability analyses can be improved significantly which will enable more iterations in the Design for Reliability methodology.

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