

Implication of MPPT on Converter Reliability for PV Systems

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Abstract—With the increasing use of renewable energies around the world, particularly photovoltaic (PV) systems, considerable research efforts have been dedicated to achieving maximum efficiency. Maximum Power Point Tracking (MPPT) techniques are proposed for PV systems to increase the energy capture. The type of MPPT method utilized in a system can directly influence the energy capture positively, however may also have an unwanted side effect in causing voltage stresses in the converter components which may effect the overall reliability of the system. This paper provides a preliminary investigation of the impact of the choice of MPPT method on the voltage fluctuations in the DC-link and PV-side capacitor of a PV system. The investigation is a first step in working towards a method for assessing the impact of the choice of MPPT method on the reliability of the converter.

Index Terms— Converter, Maximum Power Point Tracking, Photovoltaic, Power electronics, Stress

I. INTRODUCTION

Renewable energy integration is increasing all around the world. Many residential households in Australia and other countries now have Photovoltaic (PV) Systems installed on their rooftops to generate energy which can be consumed within the house or exported to the grid. One key area of research is improving the energy capture from such systems through the development of PV cells with greater sunlight conversion efficiencies [1], the development of advanced power electronics interfaces [2]–[4], and through the development of Maximum Power Point Tracking (MPPT) methods to overcome the non-linear, potentially multi-peak, and constantly varying power-voltage (P-V) characteristic under typical residential environmental conditions [5]–[7]. The focus of most MPPT studies is on achieving global peak tracking under non-uniform environmental conditions, or on improving the overall energy capture from the PV system [5]–[7]. These studies infrequently consider the efficiency of the power electronics interface in the evaluation of the method and never consider the impact that the selected method may inadvertently have on the reliability of the converter components.

Many of the conventional MPPT methods are designed for uniform operating conditions, and are based on a perturbation and observation method or on key characteristics of the PV system. Such conventional techniques that are most commonly utilized in commercial inverters are Perturb and Observe (P&O)

and Incremental Conductance (IncCond) [8], [9]. These techniques however do not perform effectively when partial shading conditions (PSC) arise across a PV system resulting in a multi-peak P-V characteristic.

To address PSC, many newer, advanced, global MPPT (GMPPT) methods have been proposed [10]–[12]. One of these, Particle Swarm Optimization (PSO) is a technique based on the behavior of birds flocking and fish schooling [13], [14]. A limitation of this method is that the search points that need to be sampled may occur at voltages and duty cycles that are dramatically different to each other. This means that unlike the smooth almost predictable change in duty cycle that occurs for a method like P&O, the duty cycle for a GMPPT method like PSO may vary quite rapidly. Studying the impact of this variation on the voltage fluctuations across the PV-side and DC-link capacitor is the subject of this paper. The presented study is a preliminary investigation into the impact that the MPPT method has on the potential reliability of the power electronics.

The PV system is generally highly reliable, however some failure factors of the power electronics may result in serious damage to the system [15]. A PV system may fail due to complex climatic environmental conditions and vulnerable components such as the capacitor and semiconductors in the power electronics interface [16].

In Section II, MPPT for PV systems is further described and the key MPPT methods considered in this paper outlined. Section III, contains a brief literature review of existing reliability studies on power electronics for PV system and other renewable energy applications. In Section IV, the method and simulation model are introduced, with results and discussion presented in Section V. Finally, conclusions and future work are presented in Section VI.

II. MAXIMUM POWER POINT TRACKING METHODS

MPPT is a large area of research which has led to the development of more than 30 distinct MPPT techniques [5]. Some techniques are considered conventional techniques such as P&O and IncCond and are designed to work on uniform environmental conditions. Other techniques including PSO, Simulated Annealing (SA), and DIRECT [10]–[12] are designed with the PSC situation in mind. The key reason for the development of GMPPT methods is that frequently those

methods designed for uniform conditions become trapped in local maxima during PSC leading to a considerably lower efficiency when the captured power is compared with the potential available power. However, as described in Section I, many of these GMPPT methods do acquire more output power from the system, although they often rely on rapidly and distinctly changing duty cycles in the search process. The P&O and PSO methods are utilized in this research.

A. P&O

The P&O method is designed to follow a curve to locate the maxima. The operating point is incrementally increased/decreased and the corresponding change in power measured. When the change in power is no longer increasing, the perturbation in the operating point is applied in the opposite direction. Depending on the step size of the perturbation the method may quickly track to the peak and then oscillate widely around that point, or it may slowly track and then exhibit a small oscillation around the peak. This tradeoff between step size and steady-state oscillation has led to a number of variable step size P&O methods being proposed [17]–[19]. The standard P&O method with a fixed step size is applied in this research.

B. PSO

The PSO method is based on the behavior of birds and fish in collectively solving a problem such as locating food. There are a number of particles defined in this method that will move through the search space and usually converge to a global maxima [11], [14]. Each particle has a position and velocity, as well as its own best location and global best location which all feature in the determination of a new operating point.

III. POWER ELECTRONICS RELIABILITY STUDIES FOR RENEWABLE APPLICATIONS

Several surveys of reliability assessment for power electronic components such as IGBTs, capacitors and inverters have been reported recently [21]–[23]. These studies highlight that the converter is responsible for the majority of failures of a PV system, and that most of these converter failures are due to the capacitors used in the DC-link. The converter usually has an operational life of 5 to 10 years, with a mean time between failures (MTBF) of between 1 and 16 years [24]. This is in contrast with the PV modules themselves, which typically have a warranty for 20–25 years and a MTBF of 520 years [24].

Capacitors are widely used as energy storage elements in a PV system to balance the mismatch between the DC power produced from PV panels and AC power injected into the grid. There are two important capacitors in a PV conversion system: one on the PV-side of the DC-DC convertor, and one on the inverter side (the DC-link capacitor). The main functions that the capacitor at the DC-link provide are power balancing and limiting the DC-link voltage ripple [20]. As mentioned in [28], the MPPT efficiency can be increased by choosing an appropriately sized PV-side capacitor. A relatively small value of capacitor could attenuate the high frequency voltage ripple at the DC-DC converter input. The PV-side capacitor is actually a filtering capacitor to reduce the power oscillation by maintaining the generated voltage from the PV panels constant. If this

capacitor is not included, a significant voltage oscillation caused by the large current ripple of the converter's inductor will be observed. By adding a small filter capacitor, the voltage ripple on the PV-side can be reduced dramatically [28].

Generally electrolytic capacitors can be modeled by an equivalent ideal capacitor in series with an equivalent series resistor (ESR) and equivalent series inductor (ESL). It can be observed that the ESR is a frequency dependent. The DC-link double-line frequency components and the impact of the mission profile on the PV-side capacitor will cause power losses in the capacitor due to the high frequency pulses [25]. The power losses may heat up the capacitor leading to a hot spot. The failure mechanism of the capacitor is mainly caused by the internal hot-spot temperature [25], [26], so this effect is significant.

In the single-phase grid-connected PV system, the injected current and voltage to the grid can be assumed to be [20]:

$$i_g = I_g \cos(\omega_o t) \quad (1)$$

$$v_g = V_g \cos(\omega_o t) \quad (2)$$

where, ω_o is the fundamental frequency of the grid and I_g and V_g are the amplitude of the grid current and voltage, respectively.

The instantaneous power to the grid can be calculated as

$$p_o(t) = \frac{1}{2} I_g V_g \cos(2\omega_o t) + \frac{1}{2} I_g V_g \quad (3)$$

As illustrated in (3), $p_o(t)$ has a double frequency fluctuating power which should be decoupled by using a large value of capacitor. The frequency oscillation could also cause double-line-frequency voltage ripple at the DC-link capacitor [20]. The voltage ripple and rms current through the capacitor can be estimated as

$$\Delta v_{dc} \approx \frac{P_o}{\omega_o C_{dc} V_{dc}} \quad (4)$$

$$i_{c,rms} = \frac{P_o}{\sqrt{2} V_{dc}} \quad (5)$$

where $P_o = \frac{1}{2} V_g I_g$ is the average power generated by the solar panels.

As can be seen from (4) and (5), there is a trade-off between voltage ripple and thermal stress, which should be considered in the design process [20]. The DC-link voltage ripple could be reduced, although not fully eliminated, by adding a larger capacitor [27]. However, this would increase the cost and size of the system.

Capacitors in the power converter of a PV system are the most important components to consider for reliability, cost and size. The reliability of the capacitor is affected by the real life mission profiles (solar irradiance and ambient temperature) [20]. The mission profiles are translated into the electrical and thermal stresses of the capacitor in this paper and then these stresses are considered in relation to the type of MPPT method applied, which could realistically be considered as an extension of the idea of mission profiles.

IV. METHOD AND SIMULATION MODEL

The modeled system is a 3 kW single-phase two stage grid-connected PV system that would be suitable to be placed in a residential environment. The standard MATLAB/Simulink PV module model was utilized with SunPower SPR-305-WHT modules. The PV modules are connected via a boost converter which executes the MPPT function. The two stage conversion system consists of the DC-DC boost converter and a DC-AC inverter. A PV-side and DC-link capacitor are included in the system for the reasons described above. The DC power extracted from the PV module is stepped up by a boost converter to 400 V. The output voltage of the inverter is AC 230 V rms.

Figure 1, shows the complete PV power system with P&O MPPT method. In order to analyze the impact of MPPT on reliability of the capacitors in the system, the voltage and current ripple of the capacitors is calculated for different mission profiles. Due to space, only the voltage stresses are depicted in this paper. The electrical stresses translated from mission profile on the capacitors are discussed in Section V.

The implementations considered include P&O method with two different duty cycle step sizes, of $\Delta D_1 = 5e - 3$ and $\Delta D_2 = 5e - 4$. The parameters of the PSO MPPT controller are learning factor 0.4, acceleration coefficients of 1.2 and 1.6 [13]. A power deviation and voltage deviation are also defined in addition to a range of voltage giving the likely location of the MPP between 150 and 300 V.

The double-line-frequency oscillation already described in the output power causes the same double-line-frequency ripple

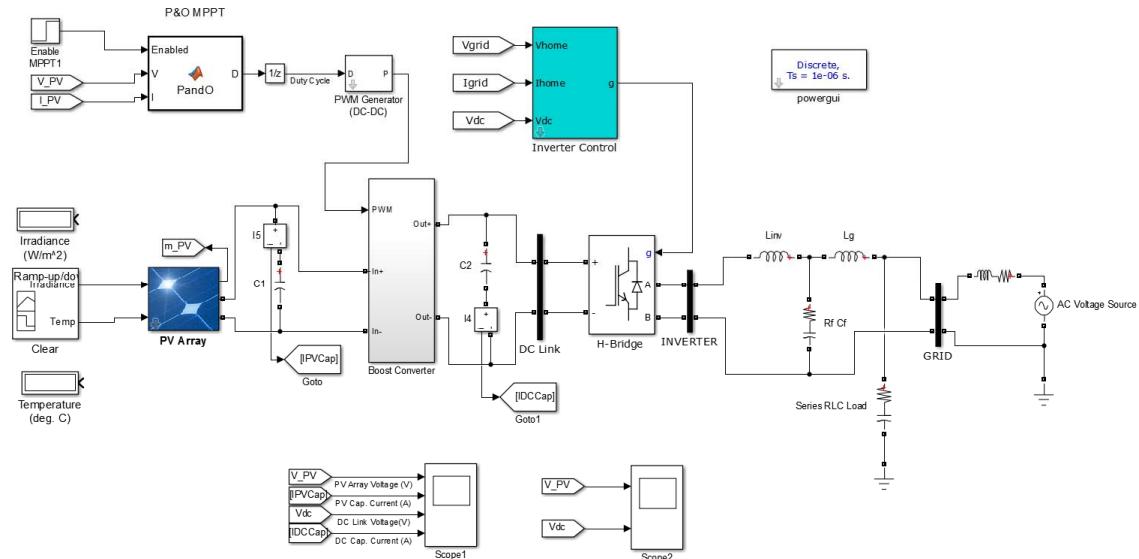


Fig. 1 Complete simulation model with P&O method.

at the DC-link voltage. The DC-link capacitor starts to discharge to fulfill the additional output power when P_o is larger than P_i . After the capacitor has been charged by input power, less power will be sent to the grid. It is found that the DC-link voltage ripple ΔV is determined by the DC-link capacitance and power generated by the PV panel. In order to achieve a small voltage ripple, the size of capacitor should be relatively large.

V. RESULTS AND DISCUSSION

The model described in Section IV is utilized to determine the impact of mission profiles, determined by the choice of MPPT method, on the capacitors. Two different irradiance conditions are considered, one clear and one cloudy, which are shown in Fig. 2. The solar irradiance data is obtained from Bureau of Meteorology [29], with data for the clear day coming from May 13, 2015, and the cloudy day from May 26, 2015. Note that the jagged pattern in the cloudy day shows the increased variability in irradiance caused by clouds.

A. Clear day

The voltage stresses on the PV-side and DC-link capacitor for the clear day are shown in Fig. 3 and Fig. 4, respectively. It can be observed from Fig. 3 that the PV-side capacitor experienced a wider range of voltage variations compared to the DC-link capacitor as the PV-side capacitor has more ‘exposure’ to the mission profile and more ‘connection’ to the MPPT.

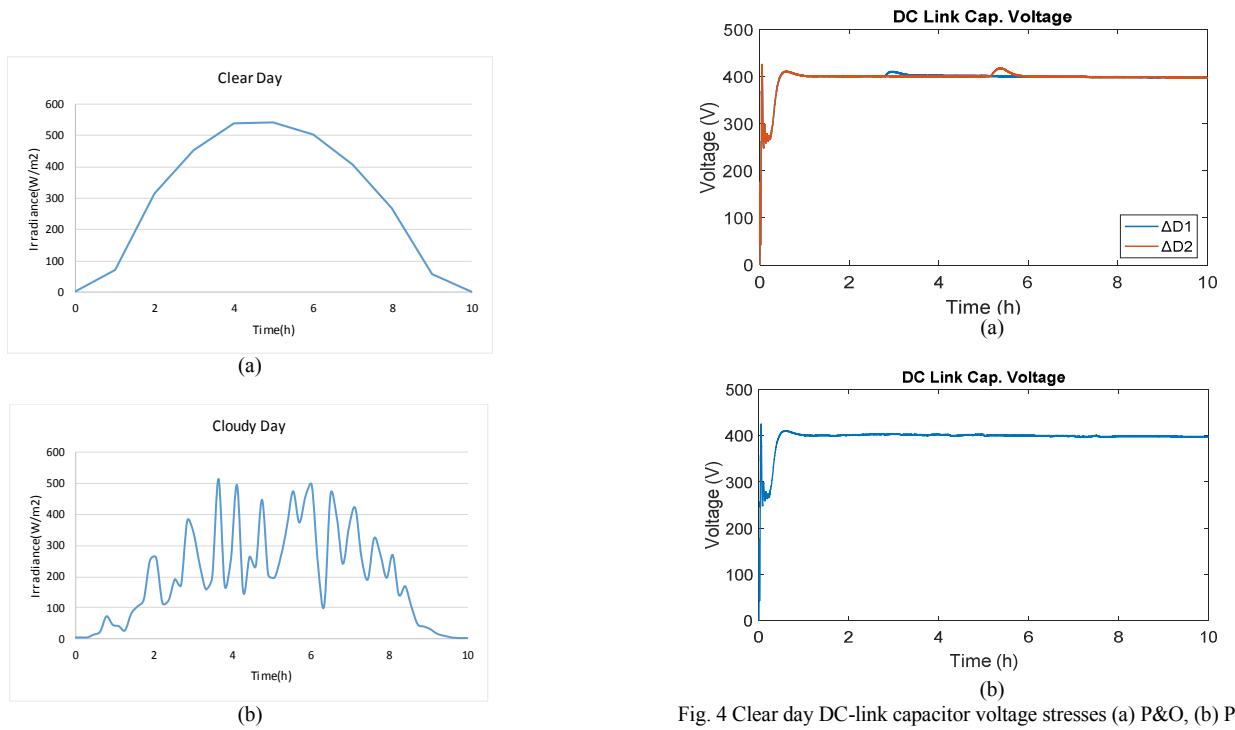


Fig. 2 Irradiance data used in simulations (a) clear day, (b) cloudy day.

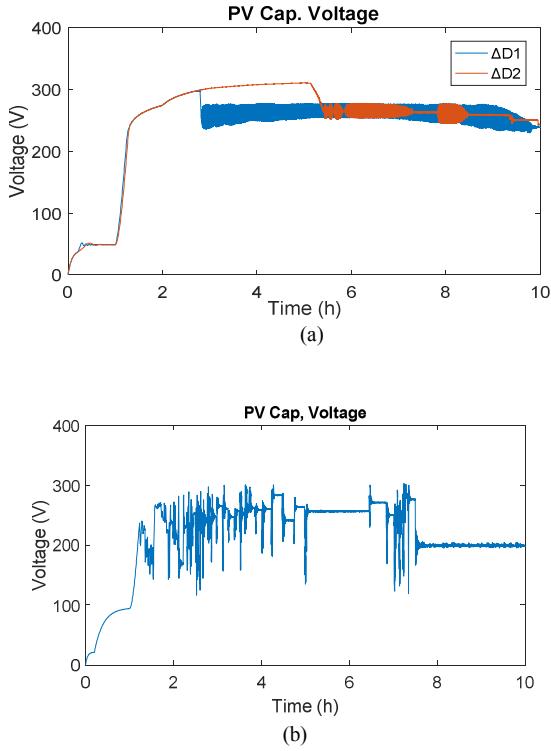


Fig. 3 Clear day PV-side capacitor voltage stresses (a) P&O, (b) PSO.

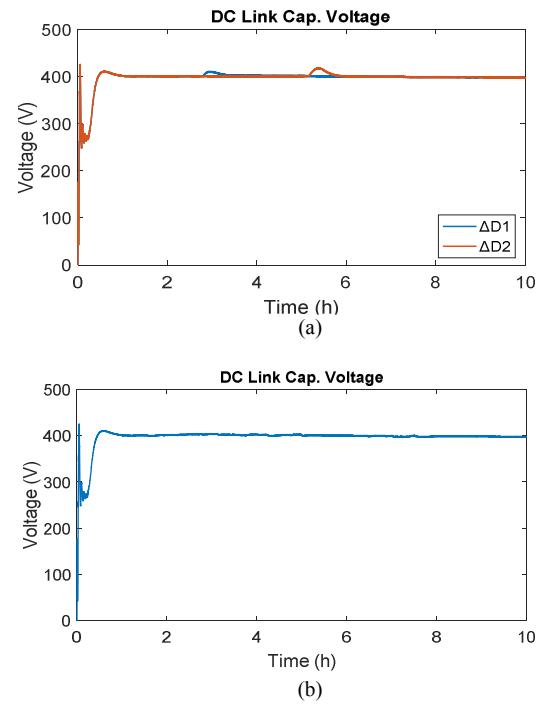


Fig. 4 Clear day DC-link capacitor voltage stresses (a) P&O, (b) PSO.

The DC-link voltage ripple of the capacitor in steady-state is approximately 1.5V for both the P&O and PSO methods. The transient voltage variation of the PSO method is larger than the P&O method. In order to characterize the voltage and current ripples on the capacitors, Table I is presented. The transient and steady state voltage and current ripple for each implementation is given for both the PV-side and DC-link capacitors.

B. Cloudy day

The voltage stresses on the PV-side and DC-link capacitor for the cloudy day are shown in Fig. 5 and Fig. 6, respectively. As shown in Fig. 5, the voltage variation at the PV-side caused by variable solar irradiance has an impact during the whole period. The steady-state voltage and current (not shown) ripples are also higher for the cloudy case than for the clear day for both MPPT methods considered. In the case shown here, the P&O method failed to continuously track the voltage of the MPP when there was a rapid change in irradiance due to the clouds.

This result is consistent with other studies that have shown that conventional techniques often fail under rapidly changing and non-uniform environmental conditions [5].

Table I. Voltage and current ripples of capacitors for clear day.

Clear Day		PV Cap. Voltage Ripple (V)	PV Cap. Current Ripple (A)	DC Cap. Voltage Ripple (V)	DC Cap. Current Ripple (A)
P&O $\Delta D=5e-3$	Transient	300 (max)	3 (max)	415 (max)	560 (max)
	Steady-State	25	3.8	1.5	40
P&O $\Delta D=5e-4$	Transient	310 (max)	0.6 (max)	410 (max)	560 (max)
	Steady-State	25	0.5	1.5	40
PSO	Transient	100	11	410(max)	560 (max)
	Steady-State	1.5	1.2	1.5	40

In order to characterize the voltage and current ripples on the capacitors for the cloudy day, Table II is presented. It can be observed that the P&O method failed to track to the MPP under cloudy environmental conditions, which means that the output voltages of the capacitors never truly reached a steady state.

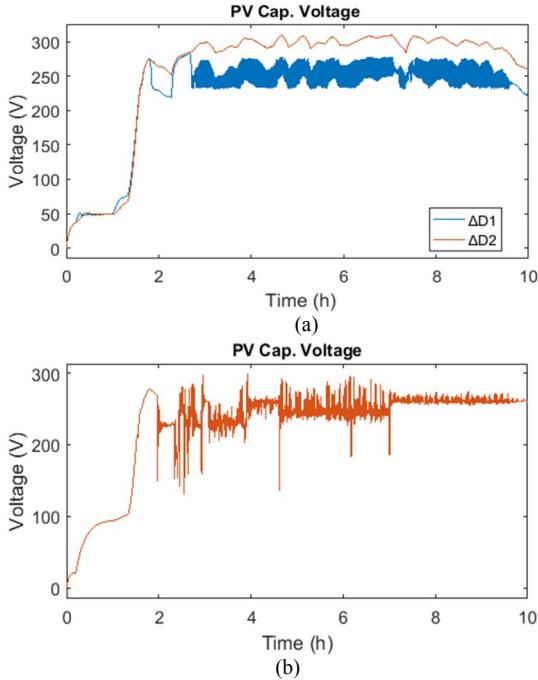


Fig. 5 Cloudy day PV-side capacitor voltage stresses (a) P&O, (b) PSO.

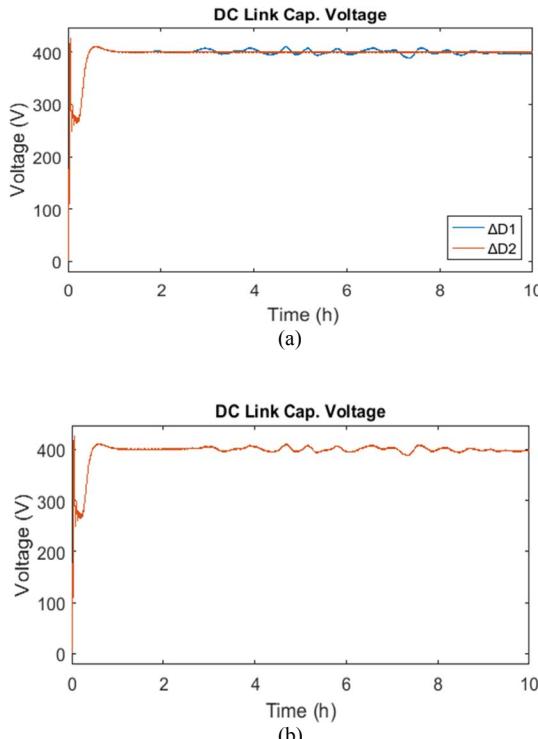


Fig. 6 Cloudy day DC-link capacitor voltage stresses (a) P&O, (b) PSO.

Table II. Voltage and current ripples of capacitors for cloudy day.

Cloudy Day		PV Cap. Voltage Ripple (V)	PV Cap. Current Ripple (A)	DC Cap. Voltage Ripple (V)	DC Cap. Current Ripple (A)
P&O $\Delta D=5e-3$	Transient	310 (max)	2.9 (max)	410 (max)	560 (max)
	Steady-State	-	4.2	1.5	40
P&O $\Delta D=5e-4$	Transient	270 (max)	0.3 (max)	410 (max)	560 (max)
	Steady-State	-	0.6	-	40
PSO	Transient	170	14	410 (max)	560 (max)
	Steady-State	25	2	1.5	40

C. Summary of results

It can be concluded from the two cases studies that the PV-side capacitor experiences voltage and current ripples induced by the mission profile (solar irradiance). The voltage stresses are mainly determined by the power level and MPPT algorithm. By using the P&O method, a larger voltage perturbation step size causes larger PV-side voltage and current ripples and thus more power losses. In the case of the cloudy day, the PV-side capacitor experienced more obvious voltage variation. Meanwhile the transient voltage ripples induced by the mission profile were also observed at the DC-link capacitor, which can affect the capacitors lifetime and cause operation failure of the capacitors.

Generally, the transient voltage variation for the PSO method was larger than for the P&O method, however the steady-state voltage variation was typically smaller with the PSO method.

VI. CONCLUSION AND FUTURE WORK

This paper has presented a preliminary study into the impacts of the chosen MPPT method on the reliability of the power electronic converter by consideration of the PV-side and DC-link capacitor voltage and current variations. The results have shown that less transient voltage ripple on capacitors is observed when the P&O method is applied, thus the P&O algorithm can cause lower voltage stress (electrical stress) compared with the PSO algorithm. From a system design point of view, the PV-side capacitor should have the ability to deal with a wide range of voltage variations caused by the impact of the mission profile and MPPT algorithm. The inverter controller parameters should also be adjusted to reduce voltage and current ripples on the DC-link capacitor [20], [30]. The implementation of the MPPT method has been shown to lead to electrical stresses on power electronics due to the additional measurements of voltage and current [31]. This has the implication that MPPT methods should be designed to both achieve global peak tracking while minimizing the stresses on the elements of the power electronic converter. From the reliability point of view, advanced MPPT methods such as the PSO method, may not have a great performance compared with conventional techniques in practice. Future work is required to determine indices to quantify the impact of the voltage stresses on the lifetime of the components and to determine if the extra energy capture provided from advanced MPPT methods overcomes the limitation of reduced reliability of the power electronics interface.

Future work will involve extending the analysis to focus on the other key components in the converter, consideration of other MPPT methods, and a more extensive investigation of the performance of the MPPT methods and associated converter stresses under simulated non-uniform environmental conditions.

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