



# Article A Methodology to Optimize PMSM Driven Solar Water Pumps Using a Hybrid MPPT Approach in Partially Shaded Conditions

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Abstract: Solar water pumps are crucial for farmers, significantly reducing energy costs and providing independence from conventional fuels. Their adoption is further incentivized by government subsidies, making them a practical choice that aligns with sustainable agricultural practices. However, the cost of the required solar panels for the chosen power makes it essential to optimize solar water pumping systems (SWPS) for economic viability. This study enhances the efficiency and reliability of permanent magnet synchronous motor (PMSM)-driven SWPS in rural areas using hybrid maximum power point tracking (MPPT) algorithms and voltage-to-frequency (V/f) control strategy. It investigates the sensorless scalar control method for PMSM-based water pumps and evaluates various MPPT algorithms, including grey wolf optimization (GWO), particle swarm optimization (PSO), perturb and observe (PO), and incremental conductance (INC), along with hybrid combinations. The study, conducted using MATLAB Simulink, assesses these algorithms on convergence time, MPPT accuracy, torque ripple, and system efficiency under different partial shading conditions. Findings reveal that INC-GWO excels, providing higher accuracy, faster convergence, and reduced steady-state oscillations, thus boosting system efficiency. The V/f control strategy simplifies control mechanisms and enhances performance. Considering system non-idealities and maximum duty cycle limitations, PMSM-based SWPS achieve superior efficiency and stability, making them viable for off-grid water pumping applications.

**Keywords:** PMSM; solar water pumping system; hybrid MPPT; optimization; V/f control; partial shading; non-idealities

### 1. Introduction

In India, where most of the rural households rely on agriculture as their primary source of income, the dependence on seasonal crops poses a challenge to maintaining a steady revenue stream. The majority of agricultural land lacks irrigation, relying heavily on seasonal monsoons, and the absence of rainfall during summers significantly impacts farming. To address the need for year-round water for crop cultivation, many farmers turn to groundwater, often utilizing diesel or electric pumps for irrigation. In remote areas without access to grid electricity, diesel pumps are commonly used, significantly contributing to India's overall diesel consumption. Despite the government's heavy subsidy for electric pumps, their adoption faces challenges, including financial strain on distribution companies. This situation underscores the importance of policy decisions in shaping the agricultural sector and energy consumption patterns in rural India. Recognizing solar energy as a crucial renewable resource, particularly in agriculture, the decreasing cost of photovoltaic (PV) panels has made solar photovoltaic pumps an attractive alternative [1,2]. Solar PV pumps offer reliability, easy installation, low maintenance, and zero emissions during utilization, presenting a sustainable solution for irrigation [3,4]. The 14th National Electricity Plan (NEP14), introduced in May 2023, aims to double the country's electricity generation capacity by 2032, with solar energy poised to play a pivotal role. National Solar



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**Copyright:** © 2024 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). Mission: It is a major initiative of the Government of India and State Governments to promote ecologically sustainable growth while addressing India's energy security challenge [5]. In line with this, the Indian Government has introduced various schemes, aiming to enhance water security and provide financial support to farmers through stand-alone and grid-connected solar water pumps. The system discussed in this research is a groundwater pump without a battery, as including a battery adds significantly to the cost. The focus is on small water pumps, designed to be more affordable and practical for localized water supply needs. The system configuration is a two-stage setup with PV panels connected in series, forming a single array.

The solar PV system's power generation is influenced by both solar irradiance and cell surface temperature. Figure 1 illustrates sample curves used to demonstrate conceptually the electrical characteristics of a PV array, emphasizing the existence of a maximum power point (MPP) where optimal power output occurs. Achieving this MPP requires a maximum power point tracking (MPPT) controller, often working in conjunction with a power electronic converter. Researchers have developed various MPPT techniques, categorized into conventional, soft computing, and hybrid methods [6–8].

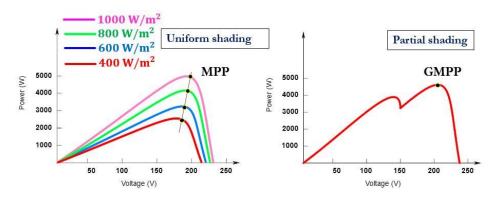


Figure 1. Power versus voltage curves of PV system under uniform and partial shading.

In environments prone to partial shading conditions (PSC) like agricultural farms, characterized by debris such as bird droppings and pollen, P-V characteristics exhibit multiple peaks as shown in Figure 1, posing challenges for global maximum power point (GMPP) extraction. Conventional MPPT algorithms may struggle to navigate local MPPs, highlighting the need for an effective global maximum power point tracking (GMPPT) method in order to enhance power utilization of the solar PV system [9,10]. PSC not only diminishes energy production but also raises module temperatures, leading to hot spots and potential cracks, significantly impairing total power generation [11,12]. Particularly in agricultural settings, panel cleaning is arduous due to elevated installation heights. While traditional methods proficiently identify MPP when there is occurrence of uniform shading conditions, they falter with partial shading, exemplified by perturb and observe (PO), and incremental conductance (INC) methods [13,14]. Conversely, soft computing techniques like evolutionary algorithms (EA) and artificial intelligence (AI) demonstrate high efficiency even in partial shading scenarios, albeit with increased complexity [15,16]. AI methods, integrating fuzzy logic control and optimization, adeptly track MPP under PSC however they entail additional complexities. EA based methods such as artificial bee colony, ant colony, particle swarm optimization (PSO), whale optimization and grey wolf optimization (GWO) are favored for optimizing MPP [17–19]. Hybrid approaches seek to address limitations by amalgamating conventional and AI-based methods or hybridizing techniques within the same category, as evidenced in various studies aiming to enhance convergence time and reduce scanning intervals [20,21]. Prominent hybrid techniques include PO-PSO, PO-GWO, INC-PSO, INC-GWO, and others [22-25].

Various types of motors, including DC motors, induction motors (IM), permanent magnet motors, switched reluctance motors (SRM), and brushless DC (BLDC) motors have

been utilized in solar water pumping systems (SWPS). While DC motors were initially used [26,27], their maintenance issues led to the preference for IMs, which offer low cost and robustness despite lower efficiency and higher reactive power. The permanent magnet synchronous machines (PMSM) have been found to be best suited for water pumping applications as they offer features like high efficiency, high power factor, compact design, and faster acceleration and deceleration. Comparisons between PMSM and IM reveal cost and efficiency advantages for the former, especially in stand-alone systems where the smaller PV array size required for PMSM pumps results in lower installation costs [28]. The efficiency gap between IM and PMSM for fractional horsepower (HP) motors is about 10% [29]. Various control schemes have been proposed for PMSM based SWPS, including direct torque control and field oriented control, aiming to improve performance and efficiency [30,31]. Several studies have proposed various control and MPPT strategies for PMSM-driven solar water pumps. The study in [32] introduced a two-stage conversion PMSM drive system featuring improved fuzzy logic based speed control and the INC MPPT algorithm. Similarly [33] proposed a Vienna rectifier integrated with sensorless vector control for grid integrated PMSM SWPS, employing the PO algorithm for MPPT. Ref. [34] developed an MPPT controller with sensorless speed control of PMSM pump based on a mix multi-resonant configuration. Additionally, [35] enhanced traditional PO MPPT with fuzzy logic control for PMSM PV pumping systems, while [36] applied a SMANN-MPPT controller to a standalone PV-PEMFC system. However, these studies often overlook the effects of partial shading, a critical consideration for system operation. Furthermore, although [37] presented a modified firefly algorithm-based MPPT with vector control, and [38] proposed a sensorless adaptive system, both lacked comprehensive analysis of partial shading.

The literature on MPPT algorithms for SWPS reveals limited use of hybrid combinations. BLDC-driven SWPS is proposed in [39] focusing on sensorless control but lacked consideration of shading. Investigation of BLDC motors employing hybrid MPPT approaches is carried out in [40–42] taking partial shading into account. Shading effect is evaluated on SRM-driven PV water pumps using hybrid methods in [43–45]. Ref. [46] examined partial shading effects on an SWPS driven by IM. Ref. [47] investigated an IMbased SWPS employing a conventional INC MPPT, but without considering shading effects. Ref. [48] offered a dynamic reconfiguration method for smart SWPS systems, using a regular MPPT algorithm. Ref. [49] utilized salp swarm algorithm (SSA) MPPT for a SWPS driven by IM. Notably, the literature lacks exploration of hybrid algorithms for SWPS based on PMSM, highlighting a gap in research. The selection of the suitable MPPT algorithm plays a crucial role in determining the efficiency of PV systems, with partial shading exerting a notable impact. Delays in the attainment of steady-state speed and higher motor torque ripples can arise from slow MPPT tracking during the occurrence of PSC.

In the realm of PMSM control, conventional wisdom dictates the use of vector control techniques, yet scalar control methods are potentially suitable for water pump applications and remain largely unexplored in the literature pertaining to SWPS. The suggested V/f control method in [50] offers a novel approach to ensuring PMSM stability across a broad frequency range, effectively mitigating instability issues encountered at specific frequencies. The introduction of a V/f control method for PMSM operation in [51] capable of discerning between motor and generator modes, demonstrates superior performance at various speeds compared to sensorless vector control approaches. Furthermore, recent studies in [52–54] delve into advanced sensorless control methodologies, focusing on V/f control and other techniques such as maximum torque per ampere (MTPA), aiming to enhance PMSM efficiency without the reliance on position sensors. Ref. [55] contributes a simplified V/f control method tailored for PMSMs in pump and fan applications, leveraging motor parameters from the nameplate for voltage reference generation, thereby ensuring stable operation without the need for position sensors.

The literature review highlights several key points. First, there is a notable lack of extensive analysis regarding the impact of partial shading on PMSM-based solar water

pumps and limited exploration of hybrid algorithms for MPPT, indicating significant gaps in current research. Second, despite the prevalent use of vector control techniques in PMSM solar water pumps, scalar control may offer simplicity and eliminate the need for complex mathematical computations and additional sensors, which could be more suitable for pump applications. Considering the complexities associated with PMSM control, V/f control emerges as a viable alternative for pumping applications, hinting at an avenue for further optimization and exploration. This is because pumping applications generally do not require precise speed or position control, and the load behavior of pumps, which typically follows a quadratic torque–speed relationship, aligns well with the V/f control strategy. Furthermore, by reducing the complexity of motor control, such as using V/f control, the system can achieve enhanced reliability, cost-effectiveness, and ease of implementation, which are crucial for practical applications in resource-constrained environments like agriculture. On the other hand, MPPT algorithms are essential for maximizing the efficiency of the PV system, particularly under varying solar irradiance conditions. Comparing different MPPT algorithms of varying complexity allows for the identification of the most effective methods to optimize power output, which is critical for enhancing overall system efficiency and performance. This dual approach of simplifying motor control while rigorously evaluating MPPT algorithms ensures both efficient energy conversion and reliable motor operation, striking a balance that optimizes the performance of PMSM-based solar water pumps. The potential impact of system non-idealities on the efficiency of PMSM-based solar water pumps under specific shading conditions remains unexplored, suggesting the need for further investigation. Such analysis could prevent operation under unfavorable shading scenarios, thereby improving overall system performance and reliability. From the preceding literature review, the contributions of this research work are outlined as follows:

- To implement different MPPT algorithms for a PMSM-based solar water pump in PSC and investigate their performance based on convergence time, MPPT accuracy, torque ripple, and system efficiency, ultimately identifying the best-performing algorithm.
- To employ a simplified V/f control system for PMSM-based solar water pumps aiming to reduce computational overhead, minimize system complexity, and eliminate the need for additional sensors for feedback.
- To assess the performance of PMSM-based solar water pumps under extreme partial shading scenarios, focusing on the impact of peak power in the left region of the P-V curve on system efficiency while considering the system's non-idealities.

#### 2. Modeling of the PMSM Based SWPS

The solar pump system design begins by calculating the flow rate based on peak sun hours/day from solar insolation data. Pump power requirements are then determined using manufacturers' pump curves, aiding in motor sizing. PV panels are sized to surpass motor rating, factoring in losses in intermediate converters. Finally, intermediate converters are sized per design specifications using relevant equations. This section outlines the design steps, ultimately focusing on building a comprehensive Simulink model of the SWPS. This model includes the selected PV panel, static converters, and PMSM, allowing for detailed simulation and performance analysis of the entire system. The schematic of the PMSM-based SWPS in Figure 2 illustrates the integration of the PV system with the PMSM via a boost converter and three-phase inverter.

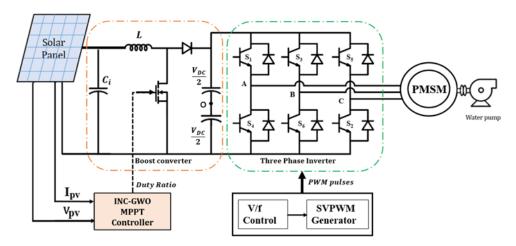


Figure 2. Block diagram of the PMSM driven SWPS.

#### 2.1. Solar PV System Model

The PV system is modelled in MATLAB Simulink (https://www.mathworks.com) as given by [56]. The model takes into account the effect of partial shading. Table 1 presents the specifications of the PV system.

Table 1. PV array specification.

Parameter	Value	
Number of Solar PV Panels	11	
Reference Solar Insolation ( $S_{ref}$ )	$1000 \text{ W/m}^2$	
Reference Module Temperature $(T_{ref})$	25 °C	
Reference Short Circuit Current ( $I_{scref}$ )	4.9 A	
Reference Open Circuit Voltage (V <sub>ocref</sub> )	20 V	
Reference MPP Power	68.55 W	
Reference MPP Current	4.4 A	
Reference MPP Voltage	15.6 V	
Temperature Coefficient of $V_{oc}$ ( $\beta$ )	0.0033	
Number of Solar PV Panels	11	
Temperature Coefficient of $I_{sc}(\alpha)$	0.0004	

The mathematical equations considered for the PV model are highlighted in (1) and (2) represented by the open circuit (OC) voltage,  $V_{oc}$  and  $I_{sc}$ , the short circuit current.

$$V_{oc} = V_{OCREF} n \left[ 1 + \alpha ln \left( \frac{S}{S_{REF}} \right) + \beta (T - T_{REF}) \right]$$
(1)

$$I_{sc} = I_{SCREF} [1 + \alpha (T - T_{REF})] \times \left[\frac{S}{S_{REF}}\right]$$
(2)

where  $\alpha$  and  $\beta$  are the temperature coefficients of  $I_{sc}$  and  $V_{oc}$ , respectively, n is the number of series-connected PV panels in the system. The temperature of the module is T, while at STC it is given as  $T_{REF}$ . The STC OC voltage is designated as  $V_{OCREF}$  and the STC SC current is  $I_{SCREF}$ . The solar insolation is S and the STC insolation of reference is represented as  $S_{REF}$ . Figure 3 displays the P-V and I-V curves of the selected PV array under varying irradiance levels, as computed using the MATLAB Simulink PV model.

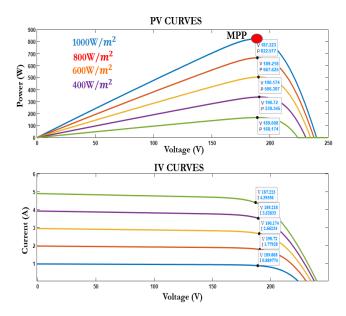


Figure 3. P-V and I-V curves of the PV system for PMSM based SWPS.

#### 2.2. Boost Converter Model with Non-Idealities

The MPPT boost converter shown in Figure 4 operates optimally within a specific operating range determined by the characteristics of the PV system. This range is established by considering maximum irradiance at 1000 W/m<sup>2</sup> and minimum irradiance at 200 W/m<sup>2</sup>. The PV resistance at the MPP, labeled as  $R_{mp}$ , fluctuates with irradiance levels.  $R_{mp}$ , is defined as the ratio of the maximum power point voltage ( $V_{mp}$ ) to the maximum power point current ( $I_{mp}$ ) of the PV panel. At maximum irradiance, it reaches its peak denoted as  $R_{mp(max)}$ , and at minimum irradiance, it decreases to its lowest point denoted as  $R_{mp(min)}$ . The input resistance of the boost converter is equivalent to the PV resistance. By analyzing P-V curves obtained under uniform shading, the PV resistance can be derived. The P-V and I-V characteristics were computed using the MATLAB Simulink PV model of Section 2.1. This model accurately represents the behavior of the PV panels under various conditions and was utilized to generate the results presented in Figures 5 and 6. From the maximum and minimum values of  $R_{mp}$  the operational range of the boost converter,  $A_o$  is delineated on the P-V curves shown in Figure 5. Operating outside this designated area leads to higher ripple factor and deviation from desired system specifications [57].

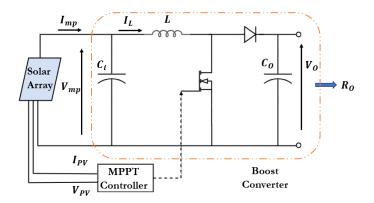
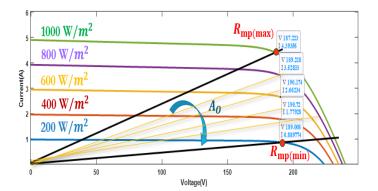


Figure 4. Boost converter schematic.



**Figure 5.** Operating range *A*<sub>O</sub> of the converter under varying uniform shading.

The duty cycle of the boost converter, denoted as *D*, is determined by the relationship between the output resistance  $R_O$  and PV resistance  $R_{mp}$ , given by (3):

$$D = 1 - \sqrt{\frac{R_{mp}}{R_O}} \tag{3}$$

The capacitance,  $C_i$ , is the value of the capacitor connected across the terminals of the PV system. It is computed by analyzing the change in charge,  $\Delta Q$ , over a specified time interval, derived from the observed current waveform of the input capacitor. It is expressed as in (4):

$$C_i = \frac{D}{8L\frac{\Delta V_{mp}}{V_{mn}}f_s^2} \tag{4}$$

where,  $V_{mp}$  represents the PV voltage at MPP,  $\Delta V_{mp}$  denotes voltage ripple,  $f_s$  is the switching frequency of the boost converter, and L is the converter's inductance. The minimum inductance  $L_{min}$ , of the converter given in (5) is dependent on parameters including ripple observed on the inductor current  $\Delta i_L$ , average inductor current  $I_L$ , maximum output resistance  $R_{omax}$ , and maximum PV resistance  $R_{mp(max)}$ :

$$L_{min} = \frac{I_L R_{mp(max)}}{\Delta i_L f_s} \left( 1 - \sqrt{\frac{R_{mp(max)}}{R_{o(max)}}} \right)$$
(5)

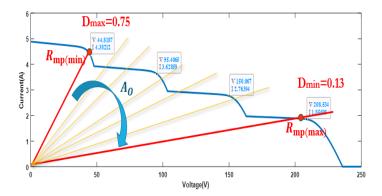
The capacitance  $C_o$  is the value of the capacitor placed across the output terminal of the converter and is determined from the waveform of the current flowing through it, as depicted in (6):

$$C_o = \frac{D(1-D)^2}{R_{mp}\frac{\Delta V_o}{V_o}f_s} \tag{6}$$

where  $\Delta V_o/V_o$  is the term representing the percentage ripple of the output voltage  $V_o$ . While determining  $C_i$  and  $C_o$ , the ESR of the capacitors were considered to reflect accurately the ripple voltage.

To ensure adaptability to changing solar insolation, the boost converter's design must accommodate fluctuations in  $R_{mp}$ . In instances of partial shading, where P-V curves exhibit varying maximum and minimum resistances, a specific shading pattern is selected to capture extreme  $R_{mp}$  values. This P-V curve, illustrating the shading scenario, is depicted in Figure 6.

Taking into account the non-idealities present in the boost converter, the mathematical model can be represented by the following equations, where (7)-(9) describe the behavior during the switch-on state, and the switch-off state is described by (10)-(12).



**Figure 6.** Operating range *A*<sup>*O*</sup> of the converter under partial shading.

During switch-on:

$$v_L(t)_{ON} = L \frac{di_L(t)}{dt} = -[r_{ON} + r_L]i_L(t) + v_{PV}(t)$$
(7)

$$i_c(t)_{ON} = C \frac{dv_c(t)}{dt} = -\frac{v_O(t)}{R_o}$$
 (8)

$$v_o(t)_{ON} = v_c(t) + r_c i_c(t) \tag{9}$$

During switch-off:

$$v_L(t)_{OFF} = L\frac{di_L(t)}{dt} = -\left[r_L + r_D + \frac{R_o r_C}{R_o + r_C}\right]i_L(t) - \frac{R_o r_C}{R_o + r_C}v_C(t) - V_{fD} + v_{PV}(t)$$
(10)

$$i_{c}(t)_{OFF} = C \frac{dv_{c}(t)}{dt} = i_{L}(t) - \frac{v_{O}(t)}{R}$$
(11)

$$v_o(t)_{OFF} = v_c(t) + r_c i_c(t)$$
(12)

where,  $v_L(t)$  and  $i_L(t)$  denote the voltage across the inductor and the current flowing through it, respectively. Similarly,  $v_c(t)$  and  $i_c(t)$  represent the voltage across and the current through the capacitor.  $r_{ON}$  signifies the MOSFET on-state resistance,  $V_{fd}$  is the diode forward voltage drop,  $r_D$  stands for the diode resistance,  $r_L$  signifies the equivalent series resistance (ESR) of the inductor, and  $r_c$  denotes the ESR of the capacitor.  $v_{PV}$  corresponds to the PV voltage, while  $v_o(t)$  represents the output voltage of the boost converter. The specification of the boost converter is shown in Table 2.

Table 2. Specifications of boost converter.

Parameter	Value	
Input Voltage (PV output)	187 V	
Output Voltage	350 V	
Output Current	2.35 A	
Output Power	882.8 W	
Inductor	10 mH	
Capacitor	100 µF	
Inductor Current Ripple	10%	
Output Voltage Ripple	1%	
Inductor Resistance $(r_L)$	0.09 Ω	
Capacitor ESR $(r_c)$	0.01 Ω	
Diode Forward Voltage Drop ( $V_{fd}$ )	1 V	
Diode Resistance $(r_d)$	0.01 Ω	
MOSFET Resistance $(r_{ON})$	0.01 Ω	

#### 2.3. Inverter-Powered PMSM

The three-phase stator currents  $i_a$ ,  $i_b$ , and  $i_c$  in a three-phase PMSM can be transformed to the dq axes currents  $i_d$  and  $i_q$  in the rotor reference frame [58] using the transformation matrix  $T_{abc}$ , given by (13):

$$i_{qdo}^r = [T_{abc}]i_{abc} \tag{13}$$

where  $T_{abc}$  is defined as below in (14):

$$T_{abc} = \begin{bmatrix} \cos\theta_r & \cos(\theta_r - \frac{2\pi}{3}) & \cos(\theta_r + \frac{2\pi}{3}) \\ \sin\theta_r & \sin(\theta_r - \frac{2\pi}{3}) & \sin(\theta_r - \frac{2\pi}{3}) \\ \frac{1}{2} & \frac{1}{2} & \frac{1}{2} \end{bmatrix}$$
(14)

Here,  $\theta_r$  represents the electrical rotor position obtained by multiplying the mechanical rotor position by pairs of electrical poles. The dynamic equations of a PMSM in the rotor reference frame involve current, voltage, and torque, represented in terms of flux linkages. These equations provide a simplified model of the PMSM dynamics, where the speed of the rotor reference frame is  $\theta_r = \omega_r$ . The relevant equations are as follows:

$$v_{qs}^{r} = \frac{R_s}{L_q} \lambda_{qs}^{r} + \frac{d\lambda_{qs}^{r}}{dt} + \omega_r \lambda_{ds}^{r} \lambda_{af}$$
(15)

$$v_{ds}^{r} = \frac{R_{s}}{L_{d}} \left( \lambda_{ds}^{r} - \lambda_{af} \right) + \frac{d\lambda_{ds}^{r}}{dt} + \omega_{r} \lambda_{qs}^{r}$$
(16)

$$T_e = \frac{3}{2} \frac{P}{2} \left[ \lambda_{ds}^r i_{qs}^r - \lambda_{qs}^r i_{ds}^r \right]$$
(17)

Here,  $\lambda_{qs}{}^r$  and  $\lambda_{ds}{}^r$  are the q and d axis stator flux linkages, respectively.  $\lambda_{af}$  is the rotor flux linkage,  $L_q$  is the q axis inductance,  $L_d$  is the d axis inductance,  $R_s$  is the stator resistance.  $v_{qs}{}^r$  is the q axis stator voltage in the rotor reference frame given by (15),  $v_{ds}{}^r$  is the d axis stator voltage in the rotor reference frame as in (16). Electromagnetic torque  $T_e$  is given in (17). P is the number of poles. The specification of the PMSM is shown in Table 3.

Table 3. Specifications of PMSM.

Parameter	Value		
Rated power output	750 W		
Rated supply voltage	220 V		
Rated speed	1500 rpm		
Rated torque	5 Nm		
Stator resistance	3.7 Ω		
d axes winding inductance	0.030 H		
q axis winding inductance	0.038 H		
Mutual flux linkage	0.93 Volt-sec/rad		
Inertia (J)	0.0001584 Kg m <sup>2</sup>		
Viscous coefficient (B)	$2 imes 10^{-3}~{ m Nm/rad/s}$		

The electromechanical phenomenon in the PMSM is represented by (18):

$$T_e = J \frac{d\omega_m}{dt} + T_L + B\omega_m \tag{18}$$

where  $\omega_m$  is the motor speed in rad/sec, *J* is the moment of inertia, *B* is the friction constant.  $T_L$  is the load torque. The PMSM is modeled in MATLAB with the above equations. The three-phase inverter is modeled using (19)–(21):

$$V_{AN} = \frac{2V_{AO} - V_{BO} - V_{CO}}{3}$$
(19)

$$V_{BN} = \frac{2V_{BO} - V_{AO} - V_{CO}}{3}$$
(20)

$$V_{CN} = \frac{2V_{CO} - V_{AO} - V_{BO}}{3}$$
(21)

where  $V_{AN}$ ,  $V_{BN}$ ,  $V_{CN}$  are the phase voltages and  $V_{AO}$ ,  $V_{BO}$ ,  $V_{CO}$  are the pole voltages.  $V_{DC}$  is the voltage applied to the three-phase inverter. MATLAB Simulink is utilized for emulation and analysis, leveraging mathematical models to simulate and evaluate system performance.

#### 2.4. DC Link Voltage Control and V/f Control of the Solar Water Pump Drive

Smooth power transfer from the PV system to the PMSM pump system via a boost converter stabilizes the voltage of the DC bus. The DC link voltage must be maintained constant, irrespective of the changes in the solar irradiance. Control mechanisms, including a PI controller, uphold the DC bus voltage at a designated level  $V_{dc(ref)}$ , ensuring the PMSM pump system operates optimally. This approach, illustrated in Figure 7, incorporates stator frequency commands from the PI controller which is applied to the V/f control block. Accordingly, the pulse width modulation scheme generates pulses to the inverter. The PMSM runs at a constant speed when the frequency is maintained constant. Speed adjustments are facilitated by altering the frequency of the power supply. The frequency and the supply voltage are adjusted simultaneously to uphold a constant V/f ratio as shown in Figure 8. This ensures a consistent air gap flux, critical for preventing saturation, particularly when the frequency drops below the base speed.

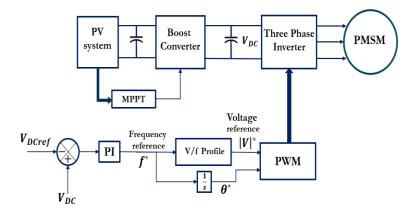


Figure 7. DC Link control and V/f control of PMSM.

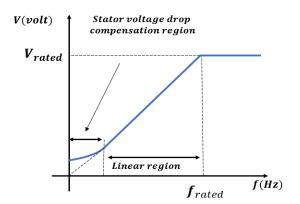


Figure 8. The V/f profile.

In this configuration, V/f control is implemented using a space vector pulse width modulation (SVPWM) with a 2-level inverter. Within a three-phase SVPWM inverter setup, (22) defines the relationship determining the line-line RMS output voltage, denoted as  $V_{LL}$ :

$$V_{LL} = \frac{1.15 \times \sqrt{3}}{2\sqrt{2}} m_a V_{DC} \tag{22}$$

where,  $V_{DC}$  denotes the DC link voltage and  $m_a$  represents the amplitude modulation index, and the relationship between the line–line voltage and the stator frequency f is given by (23):

$$V_{LL} = V_o + K_v f \tag{23}$$

where  $K_v$  is the constant given by (24):

$$K_v = \frac{V_{LL} - V_o}{f} \tag{24}$$

where  $V_o$  is a small percentage of the voltage applied to the PMSM. This compensates for the stator resistance  $R_s$  drop which occurs at a supply frequency value of zero. Assuming the efficiency  $\eta$  of the PMSM to be 95%, Kv is calculated for rated conditions ( $V_{LL} = 220$  V and f = 50 Hz). Substituting these values into the equations above yields the desired  $K_v$  [55]. Furthermore, the expression for  $m_a$  is given by (25):

$$m_a = \frac{V_o + K_v f}{V_{DC} \times 0.612} \tag{25}$$

The modulation ratio  $m_a$  varies as the frequency changes, thus adjusting the inverter output voltage to maintain a constant V/f ratio.

To ensure proper synchronization without the need for position sensors or complex calculations, soft-start techniques using V/f control are employed. This approach gradually increases both voltage and frequency from zero to the desired operating point, facilitating smooth synchronization. By minimizing abrupt changes, the risk of the rotor losing synchronization with the rotating field is significantly reduced. In the simulation, the reference speed curve is fed in the form of Equations (22)–(25), ensuring that the modulation index and voltage adjustments maintain a consistent V/f ratio. Additionally, a voltage boost at start-up is essential for maintaining proper control, particularly as the load increases. Careful optimization of these parameters ensures that the rotating field and rotor remain synchronized throughout operation. It is acknowledged that the DC bus voltage can fluctuate during sudden shading events, leading to transients. The DC link control is designed to maintain a constant voltage of 350 V, but transients may still occur. To address this, the PI controller adjusts the frequency while the V/f control modifies the voltage to maintain the V/f ratio, preserving the slope of the V/f curve. Additionally, a faster MPPT algorithm is employed to reduce transient time and mitigate the impact of shading on system performance.

#### 3. MPPT Algorithms

Various categories of MPPT algorithms of Figure 9 are implemented and evaluated on the PMSM driven SWPS using MATLAB Simulink. The algorithms are assessed based on various parameters. Among the MPPT algorithms tested are PSO, GWO, PO-PSO, PO-GWO, INC-GWO, and modified V<sub>OC</sub> method.

Conventional MPPT algorithms typically employ either PO or INC methods. PO offers simplicity in implementation, while INC provides higher accuracy. In PO, the operating point is continually adjusted until the MPP is reached by perturbing it and observing changes in power. This method may induce power fluctuations at steady state, which can be mitigated by reducing the perturbation step size, albeit at the cost of longer convergence time. On the other hand, INC monitors the slope of P-V curve by comparing changes in current ( $\Delta I$ ) and voltage ( $\Delta V$ ) over time. The MPP is identified when the incremental conductance matches the negative of the conductance, indicating maximum power.

Soft computing techniques are widely utilized in this domain due to their ability to function without prior information of the solar PV system. In the case of the PSO algorithm, a swarm of particles are employed to search for the optimal target, with duty cycles serving as the particles in the context of MPPT. A random set of duty cycles is applied to the DC-DC converter, and the corresponding PV power estimates are designated as  $P_{best}$ . Meanwhile, GWO, another effective method, simulates the predatory tactics exhibited by grey wolves in nature to optimize parameters. Both PSO and GWO iteratively update duty cycles until reaching the MPP.

Hybrid methods amalgamate either a duo of traditional, a duo of soft computing, or a combination of both methodologies. This fusion integrates the strengths of different methodologies, resulting in enhanced effectiveness and overcoming the demerits of traditional and soft computing methods. PO-GWO and PO-PSO are among the most prevalent hybrid techniques. The modified 0.8 V<sub>OC</sub> method blends both the PO and scanning methods. In this study, INC-GWO is favored since both GWO and INC outperform their MPPT counterparts. The flow chart illustrating INC-GWO is depicted in Figure 10.

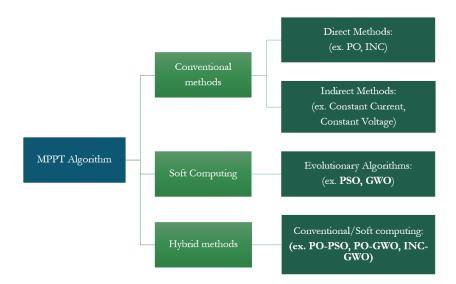


Figure 9. Classification of MPPT algorithms.

This hybridization capitalizes on the strengths of both algorithms: the GWO effectiveness under non-uniform shading conditions and the INC efficiency under uniform shading. The PV power output ( $P_{PV}$ ), serving as the objective function, is calculated by multiplying the PV current ( $I_{PV}$ ) and PV voltage ( $V_{PV}$ ). When the solar PV system's power output decreases by 5% or more, it signals partial shading, prompting the activation of GWO to identify the peak power. Once GWO nears the global peak, operation shifts to INC for accelerated convergence. This transfer occurs when the duty cycle positions of the wolves differ by less than 1%, allowing INC to sustain the global peak. In the INC method, the array terminal voltage dynamically adjusts to align with the MPP voltage, leveraging the incremental and instantaneous conductance of the PV module. The slope dP/dV of the solar array power curve becomes zero, precisely when the MPP is attained, with a positive slope to the left and a negative slope to the right of the MPP. At MPP dP/dV = 0; Left of MPP dP/dV > 0; Right of MPP dP/Dv < 0. The underlying equation governing this method is given in (26):

$$\frac{dP}{dV} = \frac{d(IV)}{dV} = I + V\frac{dI}{dV} = I + V\frac{\Delta I}{\Delta V}$$
(26)

where  $\Delta I$  is change in current and  $\Delta V$  is change in voltage. Accordingly, the modified equations are as follows: At MPP  $\Delta I/\Delta V = (-I)/V$ , Left of MPP  $\Delta I/\Delta V > (-I)/V$ , Right of MPP  $\Delta I/\Delta V < (-I)/V$ .

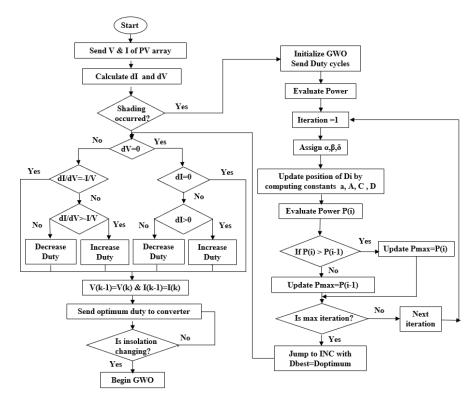


Figure 10. INC-GWO MPPT flow chart.

Grey wolves in the GWO algorithm operate as a pack, typically organized into four groups. However, for specific applications like MPPT, the number of groups is limited to three, designated as alpha, beta, and delta. The mechanism involved in the hunting of the prey is outlined through (27)–(30) describing their movement towards prey:

$$\vec{X}(t+1) = \vec{X}_p(t) - \vec{A}.\vec{D}$$
(27)

$$\vec{A} = 2\vec{a}.\vec{v_1} - \vec{a}$$
(28)

$$\vec{C} = 2.\vec{v}_2 \tag{29}$$

$$\vec{D} = \left| \vec{C} \cdot \vec{X}_p(t) - \vec{X}_p(t) \right|$$
(30)

where  $\dot{X}$  represents the location vector of the grey wolf symbolizing the duty cycle in MPPT applications, while  $\vec{X}_p(t)$  denotes the position vector of the prey. The coefficient vectors A, C, and D play a significant role in this process, depicted as in (28)–(30).  $v_1$ ,  $v_2$  represent random vectors. To adapt this algorithm to MPPT, a modified equation is introduced as below in (31):

$$D_i(k+1) = D_i(k) - A.D$$
(31)

where, *k* is the value of the ongoing iteration while *i* assumes the identities of the three wolves in the hierarchical sequence. The fitness function crucial for optimization is given in (32):

$$P\left(d_{i}^{k}\right) > P\left(d_{i}^{k-1}\right) \tag{32}$$

In this context, the duty cycle  $d_i$  represents a crucial parameter, while P represents the objective function which is the photovoltaic power output. Here the objective function needs to be maximized. Table 4 summarizes the objective function and the constraints.

Table 4. Objective function and the constraints.

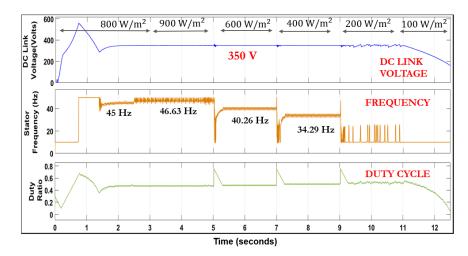
Parameter	Description	Value/Range	
<b>Objective Function</b>	Power from PV array $(P_{pv})$	$P_{pv} = V_{pv} I_{pv}$	
Constraint 1	Number of wolves ( <i>i</i> )	3	
Constraint 2	Duty cycle ( $d_i$ )	$0.1 < d_i < 0.75$	

#### 4. Results and Discussions

This section delves into a comprehensive simulation study conducted on the PMSMdriven SWPS using the MATLAB Simulink Platform. The investigation starts by applying the PO algorithm for MPPT on PMSM-driven solar water pumps. This initial step aims to assess the operating frequency range of the motor under varying solar irradiance levels. Subsequently, the INC-GWO algorithm is simulated for PMSM water pumps. This method's effectiveness is subsequently evaluated through comparison with several other algorithms, including GWO, PSO, PO-GWO, PO-PSO, and Modified 0.8 V<sub>oc</sub>. Following this comparison, the impact of non-idealities on the system's efficiency is examined. Finally, a study is conducted on the THD of the output voltage of the inverter under different shading conditions.

#### 4.1. Analyzing Critical Irradiance Thresholds for PMSM Based SWPS

The performance evaluation of the PMSM driven solar pump commences with simulations utilizing the PO algorithm, with irradiance levels varied under uniform shading conditions. This analysis aims to identify the critical threshold of irradiation below which the pump ceases to function effectively. Figure 11 illustrates the variations in the DC link voltage, stator frequency, and duty cycle applied to the boost converter. Additionally, Figure 12 displays the fluctuations in motor torque, speed, and output power. It is important to note that the numerical values presented in all figures are computed as time averages over a given period. This approach ensures that the values reflect consistent performance over time rather than instantaneous readings, providing a more accurate representation of the system's behavior.



**Figure 11.** Variation in DC link voltage, stator frequency and duty ratio in the PMSM based SWPS with PO algorithm.

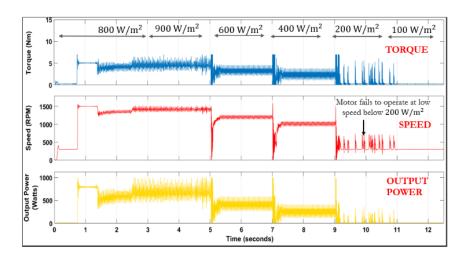


Figure 12. Variation in motor torque, speed, and output power with PO algorithm.

As the irradiance varies from 900 W/m<sup>2</sup>, the motor demonstrates stable operation, while operation below 200 W/m<sup>2</sup> proves unsustainable, exhibiting instability in the motor parameters. Consequently, for boost converter design, a minimum irradiance requirement of 200 W/m<sup>2</sup> and a maximum of 1000 W/m<sup>2</sup> are established. Subsequently, duty cycle limits are determined based on this criterion. Calculations reveal a maximum duty cycle of 0.75 and a minimum of 0.13 according to the findings in Section 2.2. The minimum frequency required to operate the pump must be greater than 25 Hz. The pump will fail to operate below 25 Hz. In the simulation, the PI controller output was kept at a minimum of 10 Hz, which is not representative of the actual physical behavior. In reality, the motor will not operate at such a low frequency when it fails. Based on the V/f control scheme, the relationship between the minimum power  $Pm_{min}$  and the rated pump power  $Pm_{rated}$  is given in (33):

$$P_{mmin} = \left(\frac{f_{min}}{f_{rated}}\right)^3 P_{mrated} \tag{33}$$

Minimum frequency  $f_{min}$  should be 25 Hz and  $f_{rated}$  is rated frequency of 50 Hz.

# 4.2. Analysis of Hybrid INC-GWO MPPT Algorithm for PMSM Based SWPS under Partial Shading

The application of the hybrid INC-GWO MPPT algorithm for the PMSM solar water pump undergoes a comprehensive performance analysis. The simulation begins by subjecting the system to uniform shading of 800 W/m<sup>2</sup>, followed by the introduction of four different patterns of partial shading (PS) shown in Figure 13 at specific intervals: PS1 at 3 s, PS2 at 5 s, PS3 at 7 s, and PS4 at 9 s.

Various parameters are scrutinized for comparison, including convergence time/speed settling time, accuracy of the MPPT algorithm, and torque ripple. Convergence time in this study refers to the duration required for the algorithm to transition from the onset of shading to achieving peak power tracking. This measurement ensures that the motor stabilizes at a consistent speed, allowing the system to maintain optimal performance despite variations in shading. Accuracy assessment of the MPPT algorithm involves evaluating its precision in identifying optimal peak power under diverse shading conditions. The fluctuations in motor torque during steady-state oscillations, known as torque ripple, are dependent on the MPPT process. This measurement offers valuable insights into the stability and performance of the system. Figure 14 depicts the voltage, current, and power of the PV system for the aforementioned PSCs corresponding to the P-V curves outlined in Figure 13. In Figure 15, the fluctuations in the DC link voltage, stator frequency and duty cycle from the INC-GWO MPPT are illustrated. Additionally, the DC link voltage remains constant at 350 V across all shading patterns, a task overseen by the PI controller, which adjusts the frequency accordingly. The stator frequency changes with the power from the

PV system according to (33) and the duty cycle is accordingly applied to the boost converter. The control loop of V/f ensures that the voltage supplied to the inverter aligns with the set parameters. Each shading pattern operates the motor at a distinct frequency: 40.56 Hz for PS1, 46.17 Hz for PS2, 37.43 Hz for PS3, and 30.08 Hz for PS4. These frequencies correspond to duty cycles of 0.54, 0.45, 0.71, and 0.86, respectively. The convergence times for various shading patterns are as follows: 0.38 s for PS1, 0.43 s for PS2, 0.26 s for PS3, and 0.37 s for PS4.

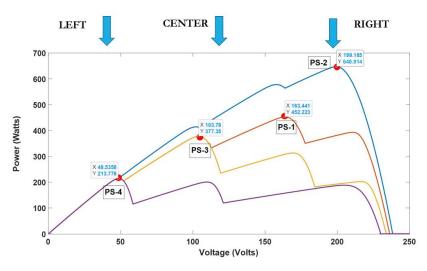


Figure 13. Partial shading patterns having GMPP in the left, center, and right of P-V curve.

Figure 16 showcases the variations in motor torque, speed and output power under different partial shading scenarios. The torque output varies accordingly: PS1 yields 3.09 Nm, PS2 4.02 Nm, PS3 2.70 Nm, and PS4 1.71 Nm. The torque ripple percentages for various shading patterns are as follows: 6.92% for PS1, 4.57% for PS2, 7.51% for PS3, and 1.17% for PS4. Moreover, the output power stands at 401.33 W for PS1, 587 W for PS2, 321 W for PS3, and 160 W for PS4.

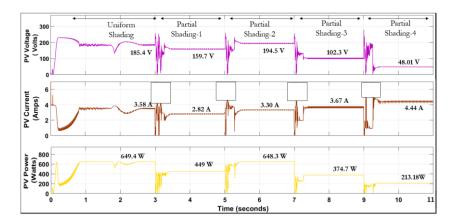


Figure 14. PV-voltage, current, and power under the different PSCs.

Figure 17 illustrates the power progression through various stages, beginning with PV power, secondly the MPPT power via the boost converter, and thirdly the motor output power. The MPPT efficiency for PS1 stands at 99.56%, for PS2 it is 99.80%, for PS3 it reaches 99.92%, and for PS4 it is 99.62%. Correspondingly, system efficiency is recorded at 89.34% for PS1, 90.53% for PS2, 85.81% for PS3, and 75.28% for PS4. The INC-GWO MPPT demonstrates shorter convergence time, facilitating quicker system stabilization for enhanced efficiency. Additionally, reduced torque ripple, as indicated by less steady-state oscillation, contributes to prolonged machine lifespan. Moreover, the high MPPT accuracy

boosts overall system efficiency. These advantages are evident in the comparison with other methodologies discussed in the subsequent section.

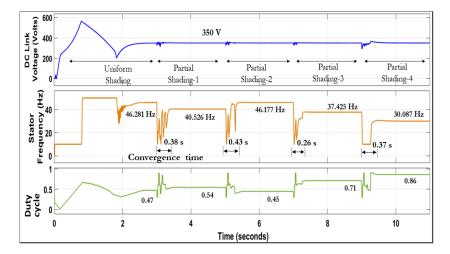


Figure 15. DC link voltage, stator frequency, and duty with INC-GWO in PMSM based SWPS.

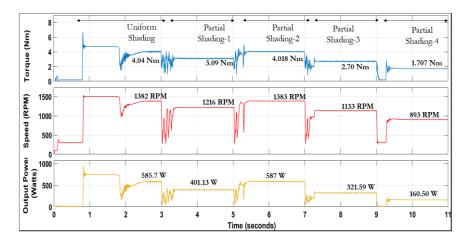


Figure 16. PMSM torque, speed, and output power with INC-GWO.

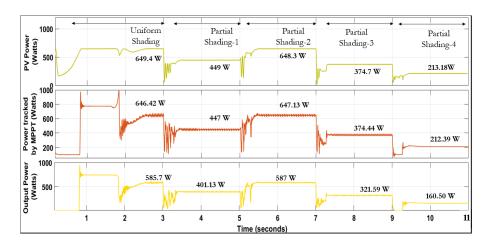


Figure 17. PV power, power tracked by INC-GWO MPPT, and PMSM output power.

## 4.3. Comparing INC-GWO MPPT with Other MPPT Techniques

The performance of the INC-GWO MPPT algorithm is systematically compared with other popular techniques. The exploration begins with evaluating the effectiveness of

the PSO technique on the PMSM driven SWPS. Subsequently, the results obtained are compared with those achieved using the GWO method. Hybrid methodologies are then scrutinized in a similar manner, comparing the performance of PSO combined with PO (PO-PSO) against GWO combined with PO (PO-GWO), as well as the Modified 0.8 V<sub>oc</sub> approach. Figure 18 illustrates the DC link voltage, stator frequency, and duty cycle for PSO, while Figure 19 showcases motor torque, speed, and output power under PSO optimization. Similarly, Figures 20 and 21 present the corresponding parameters for GWO.

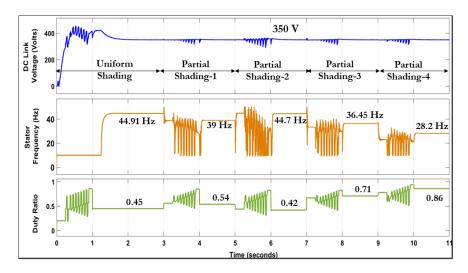


Figure 18. DC link voltage, stator frequency, and duty with PSO in PMSM based SWPS.

Figure 22 displays the DC link voltage, stator frequency, and duty cycle for the PO-PSO approach, while Figure 23 exhibits the resulting motor torque, speed, and output power. Figure 24 provides insight into the PO-GWO technique, detailing the variation in DC link voltage, frequency, and duty while the corresponding motor performance metrics are shown in Figure 25. Lastly, Figure 26 displays the DC link voltage, stator frequency, and duty cycle, while Figure 27 exhibits the motor parameters within the Modified 0.8  $V_{OC}$  technique [59].

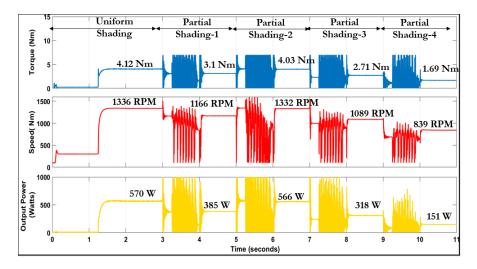


Figure 19. PMSM torque, speed, and output power with PSO.

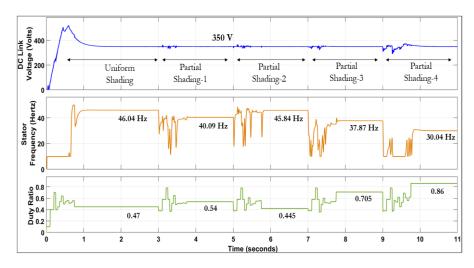


Figure 20. DC link voltage, stator frequency, and duty with GWO in PMSM based SWPS.

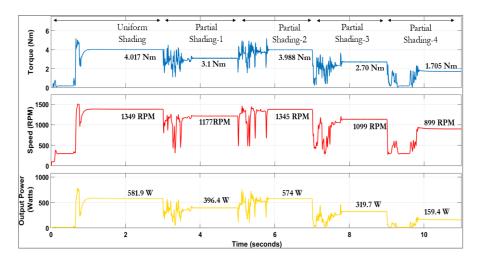


Figure 21. PMSM torque, speed, and output power with GWO.

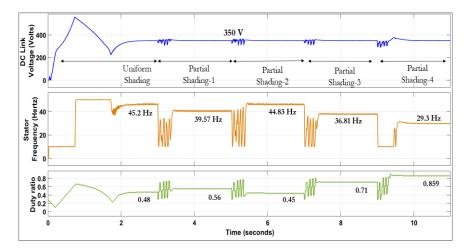


Figure 22. DC link voltage, stator frequency, and duty with PO-PSO in PMSM based SWPS.

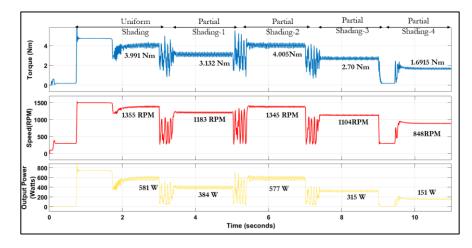
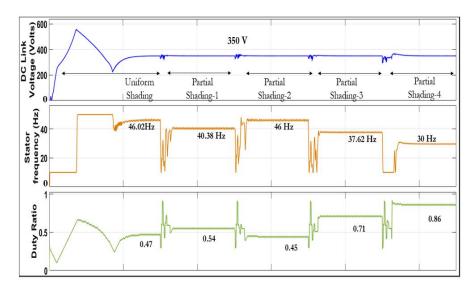
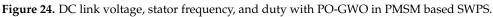


Figure 23. PMSM torque, speed, and output power with PO-PSO.





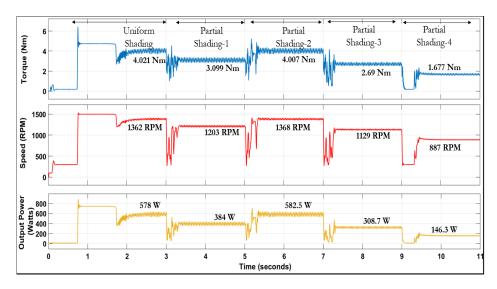


Figure 25. PMSM torque, speed, and output power with PO-GWO.

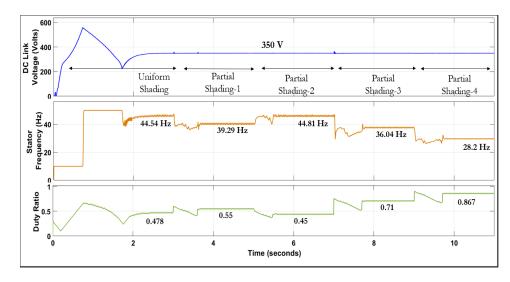


Figure 26. DC link voltage, stator frequency, and duty with Modified 0.8  $V_{oc}$  in PMSM based SWPS.

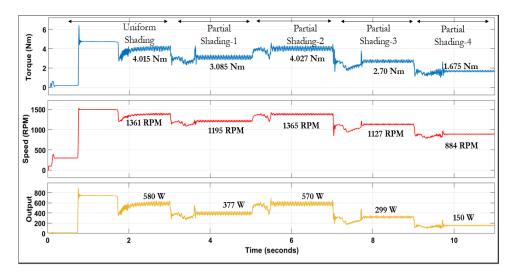


Figure 27. PMSM torque, speed, and output power with Modified  $V_{oc}$ .

The outcomes of the aforementioned MPPT techniques are compared with the INC-GWO MPPT, and the findings are presented in Table 5. The parameters considered for comparison include MPPT accuracy, convergence time, torque ripple, and system efficiency. This comparison encompasses all four partial shading patterns. Notably, within the INC-GWO method, there are observed enhancements in convergence time, torque ripple, and system efficiency when compared to alternative methods discussed in this section.

Table 5. Comparison of MPPT techni
------------------------------------

MPPT	Shading Pattern	MPPT η (%)	Convergence Time (seconds)	Torque Ripple (%)	System η (%)
PSO	US	96.70%	1.15	5.30%	89.92%
	PS1	99.33%	1.16	5.45%	84.63%
	PS2	98.60%	1.13	5.59%	88.22%
	PS3	99.64%	1.17	5.96%	82.44%
	PS4	99.82%	1.19	3.13%	67.94%

MPPT	Shading Pattern	MPPT η (%)	Convergence Time (seconds)	Torque Ripple (%)	System η (%)
GWO	US	96.40%	0.80	5.42%	90.01%
	PS1	99.33%	0.86	2.35%	86.41%
	PS2	98.60%	0.84	2.15%	89.26%
	PS3	99.64%	0.84	2.73%	85.10%
	PS4	99.84%	0.89	1.73%	72.25%
	US	97.15%	0.55	10.68%	88.73%
DO	PS1	98.89%	0.58	13.62%	84.78%
PO	PS2	99.84%	0.78	13.56%	86.82%
PSO	PS3	99.11%	0.65	12.47%	82.62%
	PS4	97.30%	0.91	16.39%	67.78%
	US	97.15%	0.34	10.73%	89.96%
DO	PS1	98.23%	0.39	13.07%	88.73%
PO	PS2	99.22%	0.43	12.77%	89.63%
GWO	PS3	98.05%	0.35	11.92%	85.29%
	PS4	95.89%	0.42	12.57%	68.24%
	US	97.15%	2.30	11.48%	86.88%
	PS1	98.23%	0.73	14.33%	86.93%
$0.8 V_{oc}$	PS2	99.07%	0.77	12.71%	87.57%
	PS3	98.05%	0.78	13.59%	85.67%
	PS4	94.96%	0.86	12.05%	68.47%
	US	99.53%	2.41	5.66%	90.19%
	PS1	99.56%	0.38	6.92%	89.34%
INC-GWO	PS2	99.80%	0.43	4.57%	90.53%
	PS3	99.92%	0.26	7.51%	85.81%
	PS4	99.62%	0.38	1.17%	75.28%

Table 5. Cont.

Figure 28 illustrates this comparison primarily concerning partial shading pattern 1. The results indicate that INC-GWO demonstrates impressive accuracy, closely aligning with optimization techniques, with faster convergence time than other methods, exhibiting minimal torque ripple, and offering notably high system efficiency.

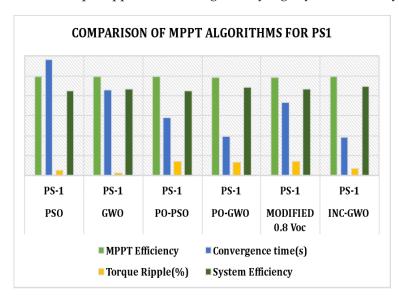


Figure 28. Comparison of parameters for different MPPT techniques for PS1.

#### 4.4. Impact of Peak Power in Left Region of P-V Curve on SWPS Efficiency

An examination is carried out on one of the partial shading patterns that presents peak power occurrences in both the left and right regions of the P-V curve as shown in Figure 29.

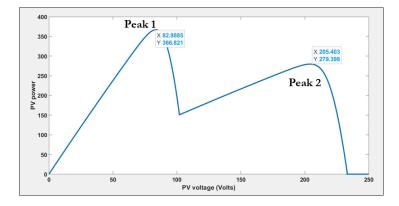


Figure 29. P-V curve with GMMP in the left region and local peak in the right region.

The operation of PMSM-SWPS starts with uniform shading as shown in Figure 30. The partial shading 5 (PS5) of Figure 29 is introduced at 2 s and the INC-GWO fetches the peak power of 366 W which is observed at the PV terminals. However, the PMSM output power available amounts to 250 W, with a corresponding duty ratio of 0.78, resulting in an efficiency of 68.31%. Subsequently, at the 3-s mark, adjustments are made to the MPPT, with the maximum duty ratio constrained to 0.75. As a result, the MPPT identifies the second local peak power of 279 W, applying a duty ratio of 0.42, leading to an output power of 220 W and an efficiency of 78.82%. This underscores the importance of imposing duty cycle limits, as higher duty cycles can lead to diminished efficiency of the boost converter. The efficiency of the boost DC-DC converter decreases for higher duty cycles due to the ESR of the inductor, which is one of the non-idealities considered in the analysis. Consequently, higher duty ratios are best avoided as they lower the system's efficiency.

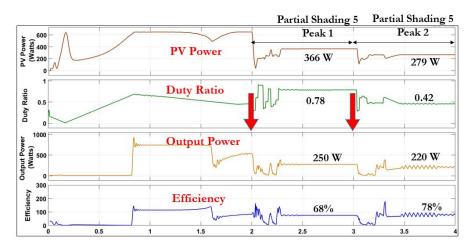


Figure 30. Efficiency comparison with the MPP in the left and right regions of the P-V curve.

The peak power occurrence in the left region of the P-V curve necessitates a higher duty cycle. For instance, PS-4 exhibits a peak in the left region of the P-V curve, resulting in lower system efficiency, as evidenced in Table 5. Specifically, with INC-GWO MPPT, the efficiency is 75.28%, and even lower for other MPPT techniques. Hence, setting the maximum duty ratio at 0.75 is recommended, which is then incorporated into the MPPT algorithm, thereby avoiding all shading patterns with peak power on the left region of P-V curve.

#### 4.5. Assessment of THD of Inverter Output Voltage for Various Shading Conditions

This section delves into the THD of the output voltage generated by the three-phase inverter. The analysis is conducted without connecting the filter to the motor terminal. The LC filter, when connected, would typically mitigate the harmonics and the overvoltage across the machine terminals and reduce the overall THD. However, for this analysis, the focus is on the inherent characteristics of the inverter out-put without the influence of the LC filter to better understand the raw output behavior. The THD is calculated using MATLAB Simulink's fast Fourier transform (FFT) analysis. In this context, THD is defined as the ratio of the root mean square (RMS) value of the harmonics to the RMS value of the fundamental frequency. This definition quantifies the distortion in the inverter's output voltage caused by the harmonics relative to the primary frequency component.

The PMSM is exposed to all four partial shading patterns in the same sequence as detailed in Section 4.2. The THD of the inverter output voltage is captured for each of these partial shading scenarios. Figure 31 illustrates the THD for PS1, introduced at 3 s. The inverter output voltage operates at a frequency of 40 Hz, exhibiting a THD of 79.00%. The dominant harmonic occurs at twice the switching frequency of the inverter, which is 1050 Hz. Figure 32 showcases the THD for PS2, introduced at 5 s. The inverter output voltage operates at a frequency of 46 Hz, with a THD of 65.23%. Similarly, Figures 33 and 34 display the THD for PS3 and PS4, introduced at 7 and 9 s, respectively. For PS3, the inverter output voltage operates at a frequency of 37 Hz, exhibiting a THD of 87.61%, while for PS4, the frequency is 30 Hz, with a THD of 109.74%.

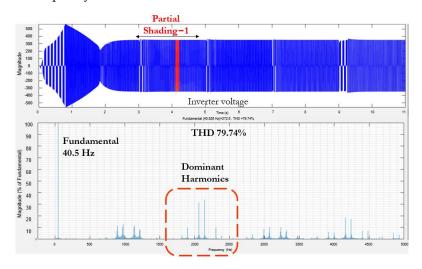


Figure 31. THD of the inverter output voltage for PS1.

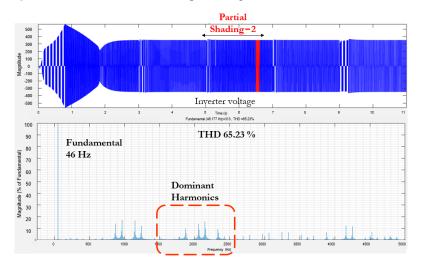


Figure 32. THD of the inverter output voltage for PS2.

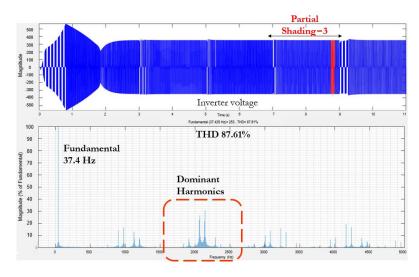


Figure 33. THD of the inverter output voltage for PS3.

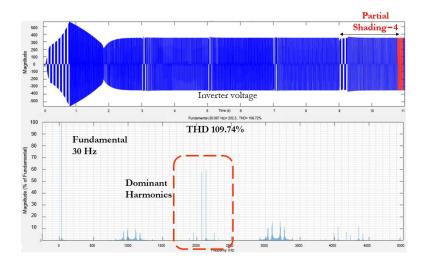


Figure 34. THD of the inverter output voltage for PS4.

The examination reveals that the THD is highest for PS4, with dominant harmonics displaying higher peaks compared to other scenarios, as shown in Figure 35. This is attributed to the operating frequency being much lower than the rated 50 Hz. As the operational frequency decreases, the THD increases. PS4 necessitates a higher THD due to its operating frequency being on the lower side. The filter design needs to encompass the operating frequency range from 25 Hz to 50 Hz. The cutoff frequency of the LC filter is determined as one seventh of the lowest possible harmonic frequency. The value of the filter inductor  $L_f$  and the filter capacitor  $C_f$  are specified as in (39) and (40), respectively [60]:

$$L_f \ge \frac{V_{DC}}{8\Delta i_{L_f} f_{sw}} \tag{34}$$

$$C_f \ge \frac{V_{DC}}{64L_f \Delta V_{Cf} f_{sw}^2} \tag{35}$$

where  $\Delta i_{Lf}$  is the ripple on the peak current through the filter inductor and  $\Delta V_{Cf}$  is the ripple on the voltage across the filter capacitor.  $f_{sw}$  is the switching frequency of the inverter. The switching frequency of the inverter is 1050 Hz and the DC link voltage is 350 V. The peak current through the filter inductor, which is also the peak current flowing through the PMSM, is 2.78 A. With a current ripple of 30%, and a voltage ripple voltage of 1 V, the

values of the filter inductor  $L_f$  and the filter capacitor  $C_f$  are calculated. This results in  $L_f$  being 0.0249 H and  $C_f$  being 50 µF. The harmonic spectrum is then observed with the LC filter at the output of the inverter. The harmonic spectrum of inverter output voltage with filter, only for the case of PS4 is shown in Figure 36, and that of output current is shown in Figure 37. The THD of the filtered output voltage is 0.42% and that of filtered output current is 1.08%. Thus, the filter design ensures effective mitigation of harmonic distortions across varying operating frequencies. For effective hardware implementation of the LC filter, considerations such as thermal management, component tolerances, and EMI mitigation are crucial. These factors ensure the filter's reliability and performance in real-world applications. While these aspects are essential for practical hardware design, they fall outside the scope of the current simulation study.

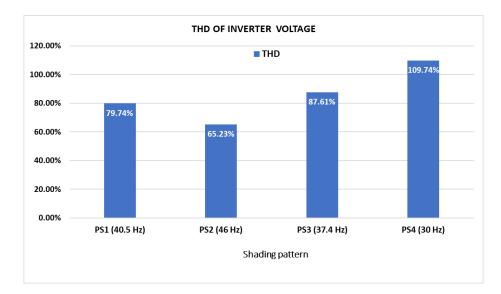


Figure 35. Comparison of THD for various partial shading patterns.

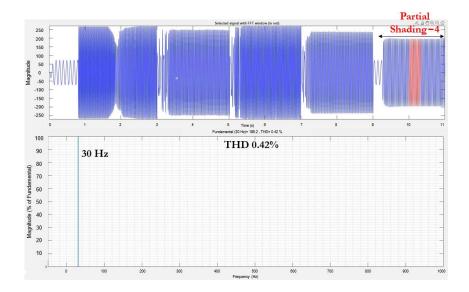


Figure 36. THD of the filtered inverter output voltage for PS4.

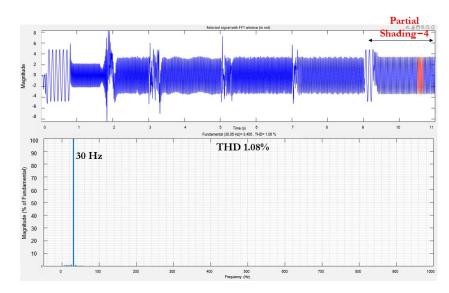
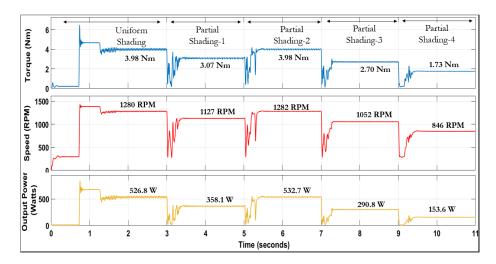
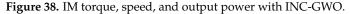


Figure 37. THD of the filtered inverter output current for PS4.

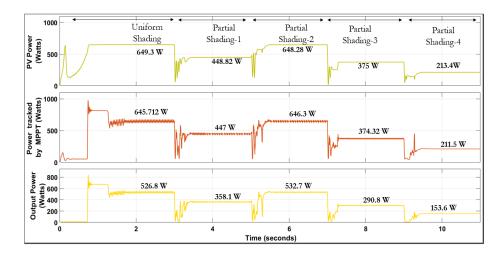
#### 4.6. Comparative Analysis of PMSM and Induction Motor Based SWPS

IM has traditionally been favored for pumping applications due to its ruggedness. However, in SWPS, where system efficiency is paramount due to the relatively low conversion efficiency of solar cells, opting for a PMSM can significantly enhance overall efficiency. Thus, the same INC-GWO MPPT algorithm is applied to an IM-based SWPS [46], mirroring the specifications of the PMSM system. Figure 38 depicts changes in motor torque, speed, and output power in IM driven SWPS. Additionally, Figure 39 presents the PV power, the power obtained by the INC-GWO MPPT through the boost converter, and the IM pumping system's output power. Comparative analysis from Figure 40 reveals that the efficiency of PMSM-based solar pumping systems surpasses that of IM-based systems by 10%.





It is commonly found that IMs are less efficient compared to PMSMs when motors have similar ratings. For motors below one kilowatt, the efficiency difference is typically around 10%. This gap is substantial and can result in notable cost savings, particularly in grid-connected setups. In stand-alone systems, this comparison becomes even more crucial, as additional PV panels are often required to achieve equivalent pump power. The expense of these extra PV panels can often surpass the cost differential between PMSMs and IMs, especially for motors with nominal power ratings in the range of a few kilowatts. Although motor performance can vary, PMSMs generally demonstrate higher efficiency than IMs.



This efficiency benefit makes PMSMs a more economical choice, especially in stand-alone systems where the need for fewer PV panels can lead to lower overall costs.

Figure 39. PV power, power tracked by INC-GWO MPPT, and IM output power.

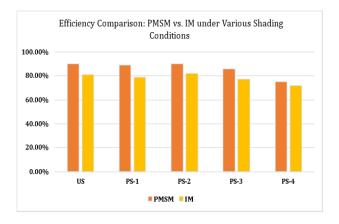


Figure 40. Efficiency comparison between PMSM and IM based SWPS.

#### 5. Conclusions

This paper provides a detailed investigation of PMSM-based SWPS with hybrid MPPT techniques, focusing on the performance of various MPPT algorithms and their behavior under different partial shading conditions. Among the different MPPT methods, INC-GWO demonstrates superior accuracy, faster convergence, reduced steady-state oscillations, leading to minimized power loss and torque ripple, with improved system efficiency. Utilizing V/f control in PMSM-based SWPS simplifies the control strategy, making it suitable for pump applications. Comparative analysis with IM-based SWPS reveals a 10% higher efficiency for the PMSM-based SWPS. The research additionally integrates system nonidealities to simulate real-world scenarios, offering a more practical assessment of system functionality and efficiency. The study evaluates various peak conditions across the P-V curve, including center, left, and right regions. The partial shading, particularly with peaks in the left region of the PV array, significantly reduces the SWPS efficiency due to higher duty cycle demands on the boost converter. Hence, the MPPT algorithms should accommodate limitation on the maximum duty cycle to optimize performance. The THD analysis of inverter output voltage indicates higher distortion in the low-frequency range, providing valuable insights for filter design. This analysis is instrumental in identifying the specific harmonics that require mitigation measures. Future work should address the limitations of this study by exploring a range of system sizes and including realistic scenarios such as experimental weather time series. A detailed cost-benefit analysis for implementing

PMSM-based SWPS, assessing scalability to larger systems, and optimizing filters based on THD analysis will further enhance the practical applicability and performance of the proposed solutions.

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