

Metaheuristic Optimization of PID Controllers for Improved Stability and Oscillation Control in Solar PV and Battery-Integrated DC

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ABSTRACT

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A DC microgrid is increasingly preferred for integrating renewable energy sources such as solar, wind, and biodiesel for electrical power distribution. Solar photovoltaic (PV) power generation, in particular, is often supported by a battery energy storage system (BESS) to ensure continuous and reliable power supply to the loads. To maximize power extraction from solar or wind sources, Maximum Power Point Tracking (MPPT) combined with DC-to-DC voltage control plays a crucial role. This paper analyzes the early synchronization and MPPT of solar power with the grid, as well as the enhanced active power transfer capability. For this purpose, Metaheuristic Optimization-based Proportional Integral and Derivative (MOPID) controllers, such as Whale Optimization Algorithm (WOA) and Grey-Wolf Optimization (GWO), are compared to demonstrate their operational effectiveness. These controllers are incorporated into the control scheme of the solar MPPT DC-DC converter, offering improved damping, better power transfer capability, faster settling times, and reduced overshoot compared to systems without controllers. The performance of the system is verified using MATLAB/Simulink in a simple DC-microgrid environment.

Keywords: Solar photovoltaic (P.V.), Microgrid (M.G.), Power Oscillations Damping, (BESS), Adaptive Fuzzy Proportional Integral and Derivative (FPID) Controller.

INTRODUCTION

With the rapid advancements in power electronics and renewable energy resources, the interest in solar photovoltaic (P.V.) cells has been growing at an exceptional rate [1]. These solar P.V. cells are being used in both developing and developed countries, with applications ranging from low-power systems, such as toys, electronic boards, lighting, and traffic control systems, to larger-scale systems for electric vehicle charging and power generation for nearby industrial loads, ranging from a few watts to several megawatts [2]. Since P.V. cells generate DC power and grids and loads typically operate on AC, at least one stage of conversion is required [3]. For handling higher power and ensuring rapid control, multi-stage converters have been widely used for years [4-6]. Recently, single-stage solar P.V. inverter topologies have gained popularity, especially for low-power, direct grid-tied applications or smaller load systems.

There has been considerable interest globally in the integration of renewable energy sources, particularly solar and wind-based power generation. According to global statistics from the wind energy organization, China, the U.S., and India are the top three countries that have each produced over 10,000 MW of solar power as of March 2018 [7]. China's solar power capacity grew from 43.5 GW in 2015 to 175 GW in 2018, with a growth rate of 3%. Other countries, such as Germany, Italy, Japan, and India, have also experienced significant growth rates, with India alone targeting 175 GW by 2022. Many countries are now allocating about 2.5% of their total budget towards renewable energy, with half of that earmarked for solar energy. In 2016, European countries had installed 98.8 GW of solar capacity, Asia 92.3 GW, East Asia 79.5 GW, North America 29.8 GW, and the remaining continents around 50 GW, totaling 323.73 GW globally. India alone produced 9,200 MW of solar power in 2017 and is progressing toward 9,600 MW for the same year.

The integration of solar P.V. systems into DC microgrids is a growing area of research. For example, the use of particle Swarm Optimization (PSO) and Perturb & Observe (P&O) algorithms for Maximum Power Point Tracking (MPPT) has been demonstrated to improve stability and dynamic response in real-time environments [9]. Additionally, fuzzy logic controllers (FLC) have been implemented in solar PV systems with DC microgrids to enhance efficiency [10]. FLC-based MPPT algorithms have been shown to be significantly faster than other control

methods, efficiency [10]. FLC-based MPPT algorithms have been shown to be significantly faster than other control methods, including neural networks and PSO [11]. Further studies have focused on improving the performance of Battery Energy Storage Systems (BESS) in solar PV systems, addressing issues like voltage variations and oscillations due to irregular irradiance and transient load conditions [12]. Additionally, various control strategies, such as dual-loop PI-based control, have been proposed to enhance the efficiency of solar PV and BESS in low-voltage DC microgrids [13].

Several metaheuristic optimization algorithms, including the Real Coded Genetic Algorithm and Artificial Neural Network-based global optimization, have been employed to enhance the performance of MPPT and fault detection in solar PV systems [14-15]. Among these, the Grey-Wolf Optimization (GWO) and Whale Optimization Algorithm (WOA) have gained attention for their ability to optimize controllers for better synchronization and active power extraction in solar PV systems. Studies have shown that hybrid methods such as PSO-GSA can improve efficiency, though they can be more complex to implement [18]. Other optimization techniques, including the Water Cycle Algorithm and Moth-Flame metaheuristic algorithms, have been explored for their applications in solving economic load dispatch and emission problems in solar PV systems [19].

Passivity-based voltage regulation methods have been applied to battery-supported solar PV systems in DC microgrids to improve transient response and stability [20, 21]. Topologies involving SEPIC converters, wind PMSG rectifiers, and bidirectional BES systems have been employed to manage load in DC microgrids [22]. Hybrid energy storage systems and distributed energy resources (DERs) have also been studied in hardware-in-loop setups to evaluate power management strategies [23]. Experimental evaluations of solar PV, batteries, and fuel cells for DC microgrid power management have been conducted [24].

Despite the significant advancements, challenges still exist in optimizing the performance of solar PV inverters, including limited power handling capabilities, varying power output characteristics, and constrained operational ranges. To overcome these challenges, researchers are working towards simpler MPPT designs with fewer switches, improved efficiency, and reduced weight, especially for rooftop installations and hybrid electric vehicle applications. This paper focuses on comparing Grey-Wolf Optimization (GWO) and Whale Optimization Algorithm (WOA) for optimizing PID controllers in solar PV-based DC microgrids. The study aims to analyze the synchronization and active power extraction capabilities of these controllers. Key parameters such as solar PV voltage, current, micro-turbine synchronous generator, and BESS performance are verified. The goal is to ensure that the DC-DC chopper-based solar PV system achieves the following key features:

Effective operation at the Maximum Power Point Tracking (MPPT) of the P.V. cells. Capability to operate efficiently over the entire MPPT range of the P.V. array. Matching the power rating to the maximum rating of the P.V. cells. Handling the highest voltage and current ratings of the P.V. cells despite environmental temperature variations. Achieving a better performance-to-cost ratio for residential rooftop installations.

Enhanced reliability comparable to that of conventional P.V. panels. Improved efficiency. However, challenges remain, such as: Limited power handling capability. Significant variability in power output. Operational range constraints due to the imposed DC source. Increased inverter costs with higher power handling. High peak current stress with higher power handling.

Limited applicability of some MPPT techniques due to the absence of an intermediate chopper circuit.

This paper seeks to address these challenges by exploring a simpler and more efficient MPPT chopper design with

fewer switches, reduced weight, and enhanced performance compared to standard microgrid connections.

Section 2 presents the solar PV grid-tied test-bed system. Section 3 discusses the two-area solar PV test-bed system. Section 4 provides an overview of metaheuristic algorithms, including WAO and GWO, and their pseudo-codes. Section 5 presents the simulation results using GWO and WAO in the MATLAB environment. The paper concludes in Section 6, with the appendix and references provided at the end.

D.C. MICROGRID CONNECTED SOLAR P.V. BATTERY ENERGY STORAGE SYSTEM

This section presents the analytical modeling of a solar photovoltaic (P.V.) panel integrated with a Battery Energy Storage System (BESS), both connected to a common DC microgrid (M.G.) and a DC load. A detailed mathematical representation of the block diagram for the DC M.G. solar P.V. system is also provided. The modeling includes key subsystem components, switching operations, and dynamic equations for current and voltage behavior. Additionally, the output voltage equation governed by a Proportional-Integral (P.I.) controller is derived. The block diagram illustrates the interaction between the P.I. controller, the solar P.V. cell with a Maximum Power Point Tracking (MPPT) controller, and the buck-boost converter, all of which are modeled using transfer function techniques.

Modeling of Dc Microgrid based Solar PV Bess System

In general, a solar photovoltaic (P.V.) electrical power generation system is supported with a battery energy storage system (BESS) for continuous and reliability of the power supply. This solar P.V. system is connected to ac or dc or hybrid AC/DC MG. A solar P.V. dc M.G. system topology along with dc load is shown in Fig.1. This topology consists of subsystems like solar P.V. panel, solar MPPT boost converter, battery bank, bi-directional dc to dc converter connected to a common dc link terminal, buck converter for load connection. The solar P.V. panel consists of a current source with series and parallel resistances forming layers in the cell panel. This cell produces constant current and variable voltage depending on irradiation, temperature, shading, and other input factors. To extract continuous voltage from the solar P.V. cell with consistent D.C. output, the maximum power point tracking (MPPT) technique with dc voltage stepping up and to extract maximum power from the solar panel subsystem is beneficial [20-24]. The input voltage is V_1 , and current i_1 is given to the solar MPPT cell and is boosted using a designed inductor, switch, and a diode.

The switch S_1 is having a duty cycle of d_1 , the current through the MPPT diode D_3 is i_2 , and the output voltage of V_2 from the MPPT subsystem produces constant voltage if input parameters are stable. This voltage is equal to the dc M.G. voltage. A battery bank (BESS) with voltage E and internal resistance is in the figure supporting energy storage and retrieving when solar P.V. cells cannot supply power to the M.G. and the load. The BESS is connected to the dc M.G. using a bidirectional dc to dc converter with two switches numbered S_3 and S_4 with duty cycle d_2 . If solar power output is sufficient, the battery gets charged, else it will supply power by discharging it based on the load and grid requirement. The output from the dc M.G. is connected to the load using a buck step-down converter with the operation supported by switch S_2 with duty cycle d_3 , inductor L_3 , and diode D_4 . The output from the buck load converter is V_3 which is the voltage across the capacitor C_2 and is supplied to the load R.L. The voltages and currents dynamic equations are represented.

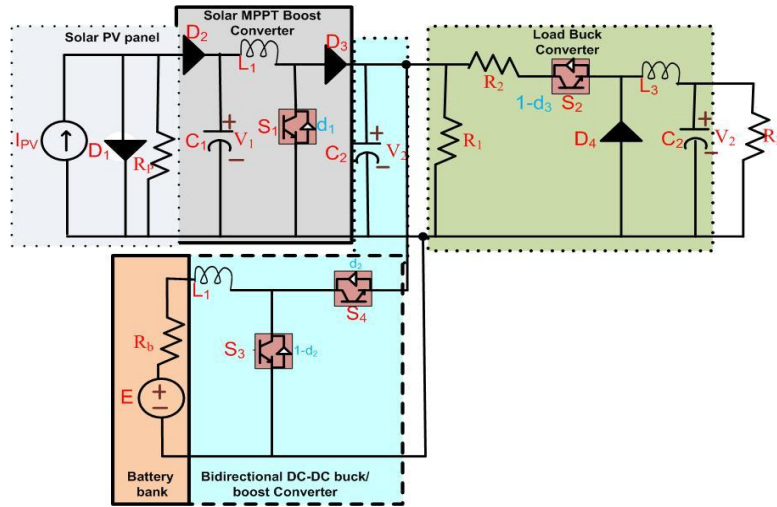


Figure 1. Solar PV BESS system connected to a dc microgrid

The input solar PV dynamic current flow is given by the equation (1)

$$L_1 \frac{di_1}{dt} = V_1 - V_2(1 - d_1) \quad (1)$$

Kirchoff's current and voltage equations are used for deriving each subsystem's voltage and current. Here, V_1 is solar P.V. voltage, and V_2 is M.G. voltage with duty cycle d_1 at switch S_1 at solar MPPT boost converter [20, 21]. The battery energy storage system (BESS) dynamic current flow is given by equation (2). Here, the battery voltage is E , BESS current i_2 with internal battery resistance R_b and the switch S_3 at the bidirectional dc-dc buck-boost charging controller converter with duty cycle d_2 .

$$L_2 \frac{di_2}{dt} = E - i_2 R_b - V_2 d_2 \quad (2)$$

The load current i_3 flows through the load resistance R_L and switching operation controlling the buck voltage using the switch S_2 with duty cycle d_3 , and the load voltage V_3 is represented by the equation (3).

$$L_3 \frac{di_3}{dt} = (V_2 - i_3(1 - d_3)R_L)(1 - d_3) - V_3 \quad (3)$$

The solar P.V. cell output capacitor C_1 dynamic voltage equation V_1 is represented (4). This voltage is the difference between the source P.V. current and the boost converter current i_1 . The solar P.V. current i_{PV} , diode current i_D . The diode voltage constant is 'a'.

$$C_1 \frac{dV_1}{dt} = i_s - i_1 = i_{pv} - i_D(e^{aV_1} - 1) - \frac{V_1}{R_p} - i_1 \quad (4)$$

The M.G. voltage dynamic equation is given by all the switches duty cycles, and the M.G. voltage is provided by the equation (5). Based on controlling the IGBT switches, voltage buck or boost operation is done, or in other terms, the dc M.G. voltage is controlled using the switches duty cycles d_1 , d_2 and d_3 .

$$C_2 \frac{dV_2}{dt} = i_1(1 - d_1) + i_2 d_2 - i_3(1 - d_3) - \frac{V_2}{R_1} \quad (5)$$

The dc M.G. dynamic load voltage V_3 equation is represented using the equation (6).

$$C_3 \frac{dV_3}{dt} = i_3 - \frac{V_3}{R_2} \quad (6)$$

The solar P.V. output regulated voltage capacitor C₁ value based on a common base capacitance value is given by equation (7). Here, the P.V. capacitor voltage value is taken one-fifth times its base value-based.

$$C_1 = \frac{0.01}{0.05C_b} \quad (7)$$

If the filter capacitor, power factor variation of the M.G. is tacit within the limits of 5%. The maximum ripple current in the inductor L₁ with switching time constant T_{sw} is given by the equation (8)

$$\Delta I_{L1 \max} = \frac{2V_{dc}}{3L_1} (1 - d_1) d_1 T_{sw} \quad (8)$$

The same inductor ripple current represented in terms of switching frequency F_{sw} instead of switching time constant is shown in equation (9) and if the PV IGBT switch d₁ is considered as 0.5.

$$\Delta I_{L1 \max} = \frac{V_{dc}}{6F_{sw} L_1} \quad (9)$$

To obtain the maximum ripple from the panel MPPT output, if 10% ripple of rated current is considered, then the maximum ripple current is given by the equation (10),

$$\Delta I_{L1 \max} = 0.1 I_{\max} \quad (10)$$

Further, the maximum current output from the solar P.V. panel is given by the equation (11) represented in the form of solar P.V. real power PPV and solar P.V. input voltage V.P.V. (which is also equal to V₁)

$$I_{\max} = \frac{\sqrt{2} P_{pv}}{3V_{pv}} \quad (11)$$

To reduce the current ripple to 20% with an attenuation factor Ka, the inductor MPPT L₁ and battery-MG inductor L₂ values can be represented using the equations (12) and (13)

$$L_1 = \frac{V_{dc}}{6F_{sw} \Delta I_{L1 \max}} \quad (12)$$

$$L_2 = \frac{1 + \frac{1}{\sqrt{K_a^2}}}{C_2 \omega_{sw}^2} \quad (13)$$

To prevent the resonant conditions, R₁ and R₂ are helpful. They are also responsible for the reduction of ripple on switching frequency. Hence, the resistor R₁ can be represented in terms of angular resonance frequency (ω_{res}, rad/sec) is shown in equation (14)

$$R_1 = \frac{1}{3C_2 \omega_{res}} \quad (14)$$

Where the angular resonance frequency (ω_{res}) is given by the equation (15)

$$\omega_{res} = \sqrt{\frac{L_1 + L_2}{L_1 L_2 C_2}} \quad (15)$$

The final bus voltage is given by vectorially all the subsystems voltages given by the equation (16)

$$V_2 = V_{20} + \frac{1}{C_2} \int_0^T (I_{PV,out} + I_{BESS} + I_{grid,out} - I_{charging}) dt \quad (16)$$

The V_{20} is the initial bus voltage of the solar PV MPPT subsystem, C_2 is the DC MG capacitor value. The solar P.V. panel MPPT subsystem output current at time t is $I_{PV,out}$, BESS charging and discharging current is I_{BESS} (or I_2) and the final grid current output is $I_{grid,out}$. The BESS charging current is given by the equation (17)

$$I_{charging} = \frac{P_{charging}}{V_2 \eta_{DC-DC1}} \quad (17)$$

In this, the BESS charging current is determined by the real power flow at the charging terminal through inductance L_1 . the DC MG voltage is V_2 and the efficiency of the dc to dc bidirectional chopper η_{DC-DC1} . This efficiency depends on the load chopper converter also. The M.G. current output $I_{grid,out}$ is given in equation (18) in terms of the M.G. real power P_{grid} , MG voltage V_2 , and grid boost voltage conversion efficiency η_{DC-DC2} .

$$I_{grid,out} = \frac{P_{grid}}{V_2} \eta_{DC-DC2} \quad (18)$$

The BESS current flow into the M.G. is represented in terms of battery voltage E , the current through the battery cell I_{BESS} with bidirectional dc to dc converter efficiency η_{DC-DC3} is shown in equation (19)

$$I_{BESS,out} = \frac{EI_{BESS}}{V_2} \eta_{DC-DC3} \quad (19)$$

The load voltage V_{load} or V_3 is given by the buck chopper switching duty cycle d_3 is provided by the equation (20).

$$V_{load} = V_2 \frac{1}{1-d_3} \quad (20)$$

M.G. terminal current i_{mg} gives the dynamic dc link voltage (V_{dc}) through the diode D_2 and the bidirectional buck-boost converter with switching duty-cycle d_2 is given by equation (21). The constant $a = 1$ represents boost and $a = -1$ for buck operation. So, buck and boost operation controlled by the duty cycle d_2 and grid currents.

$$\frac{dV_{dc}}{dt} = a \left(-\frac{i_{mg}}{C_2} + \frac{d_2 i_2}{C_2} \right) \quad (21)$$

The bidirectional buck-boost converter inductor dynamic current flow i_{L2} is represented using the battery voltage E and M.G. voltage V_2 is given by the equation (22).

$$\frac{di_{L2}}{dt} = a \left(\frac{E}{L_2} - d_2 \frac{V_2}{L_2} \right) \quad (22)$$

The vectorial controlled bidirectional buck-boost converter inductor current represented in terms of M.G. capacitor C_2 in terms of transfer function form with the Laplace parameter 's' is given by equation (23)

$$\frac{\bar{i}_{L2}}{\bar{d}_2} = \frac{-C_2 V_2 s - d_2 i_{L2}}{C_2 L_2 s^2 + d_2^2} \quad (23)$$

The M.G. terminal voltage-controlled V_2 is done using a current-controlled tuned proportional-integral (P.I.)

controller is given by the equation (24). Here, the input inductor boost converter subsystem current reference (\bar{i}_{L1}^*) and actual boost converter current (\bar{i}_{L1}). The objective of the current P.I. controller is maintaining zero or very minimum value between the reference and the actual current value, and ideally, zero is its value.

$$\bar{V}_2 = (\bar{i}_{L1}^* - \bar{i}_{L1})(K_{pi} + \frac{1}{K_{ii}s}) \quad (24)$$

The final terminal voltage V_2 and the input solar P.V. current (i_{L1}) are written in the transfer function model with current tuned P.I. controller and boost converter duty cycle d_1 is given by the transfer function equation (25)

$$\frac{\bar{V}_2}{\bar{i}_{L1}^*} = \frac{-K_{pi}K_{ii}d_1V_2s - d_1V_2}{C_2s^3 - C_2V_2K_{pi}K_{ii}s^2 + (d_1^2K_{ii} - C_2V_2)s} \quad (25)$$

Block Diagram Representation of Solar P.V. System based dc M.G.

The dc M.G. consisting of a solar P.V. cell system with closed-loop controller representation is shown in Fig.2. The current tuned P.I. controller block diagram is GPI(s), offset switching frequency ($G_{sw}(s)$), solar P.V. panel system connected to a dc M.G. is G.P.V. (s) and dc voltage gain function is given by $A_v(s)$. The current P.I. controller is given by the equation (26) with 's' as the Laplace parameter, current proportionality (K_{pi}), and the current integral constant (K_{ii}).

$$G_{PI}(s) = K_{pi} + \frac{K_{ii}}{s} \quad (26)$$

The offset switching block ($G_{sw}(s)$) is a relay block that operates based on the reference (V_2^*), and actual M.G. voltage (V_2) is shown in equation (27)

$$G_{sw}(s) = \begin{cases} 1 & V_2 > V_2^* \\ 0 & V_2 < V_2^* \end{cases} \quad (27)$$

The solar P.V. panel transfer function is considered to be a standard 2nd order function with natural undamped frequency (ω_n), and damping ratio (ξ) is given by the equation (28)

$$G_{PV}(s) = \frac{\omega_n^2}{s^2 + 2\xi\omega_ns + \omega_n^2} \quad (28)$$

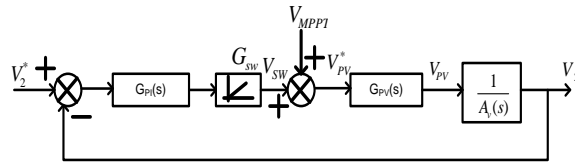


Figure 2. Solar P.V. microgrid block diagram representation

The dc-dc M.G. voltage gain in BESS switching duty cycle d_2 and solar P.V. panel inductor L_1 and MG capacitor C_2 is given by the equation (29)

$$A_v(s) = \frac{1 - d_2}{L_1C_2s^2 + \frac{L_1}{R_1}s + (1 - d_2)^2} \quad (29)$$

The MG terminal voltage (V_2) with initial voltage v_{20} , mppt voltage (V_{mppt}), output limited transfer function ($G_{olimit}(s)$) and MPPT output transfer function (G_{omppt}) is given by the transfer function equation (30)

$$V_2 = G_{olimit}(s)V_{20} - G_{omppt}V_{mppt} \quad (30)$$

The internal transfer functions for the equation (30) are defined and shown in the equations from (31) to (33) as

$$G_{olimit}(s) = \frac{G_{PI}(s)G_{SW}(s)G_{PV}(s)}{G_{PI}(s)G_{SW}(s)G_{PV}(s) - A_V(s)} \quad (31)$$

$$G_{ompppt}(s) = \frac{G_{SW}(s)}{G_{PI}(s)G_{SW}(s)G_{PV}(s) - A_V(s)} \quad (32)$$

$$G_{vmpppt}(s) = \frac{\Delta V_2}{\Delta V_{mpppt}} = -\frac{G_{PI}(s)}{G_{PI}(s)G_{PV}(s) - A_V(s)} \quad (33)$$

The change or error in the M.G. terminal voltage is given by the difference between reference and actual M.G. voltage, as shown by equation (34). Here, the error in the M.G. terminal voltage to zero is the objective.

$$\Delta V_2 = V_2^* - V_2 = \lim_{s \rightarrow 0} s \Delta V_2 = 0 \quad (34)$$

The final output microgrid voltage is represented in the form of a transfer function ($G_{ov}(s)$) in terms of a controller transfer function, solar P.V. panel transfer function, and dc-dc M.G. voltage gain as depicted by equation (35)

$$G_{ov}(s) = G_{PI}(s)G_{PV}(s) \frac{1}{A_V(s)} \quad (35)$$

The ratio of integral to proportional gain constants with a frequency of operation from 5 to 150 Hz is given by (36)

$$\frac{K_{ii}}{K_{pi}} = 2\pi * 100 \quad (36)$$

The final output voltage transfer function is controlled to 1 p.u.,(per unit) value as equation (37)

$$|G_{ov}(s)|_{s=j20\pi} = 1 \quad (38)$$

From the equation (35), the open loop output microgrid voltage transfer function based Bode plot and Root-Locus plots are shown for different integral constants are shown in Fig. 3. and Fig.4. bwith plot parameters are shown in table 1. With increase in the K_{ii} , the phase margin is moving away from -180 degrees and gain margin is decreasing considerably, thereby stability margin is decreasing. the normal values of K_{pp} and K_{ii} are 1.22e-3 and 0.77.

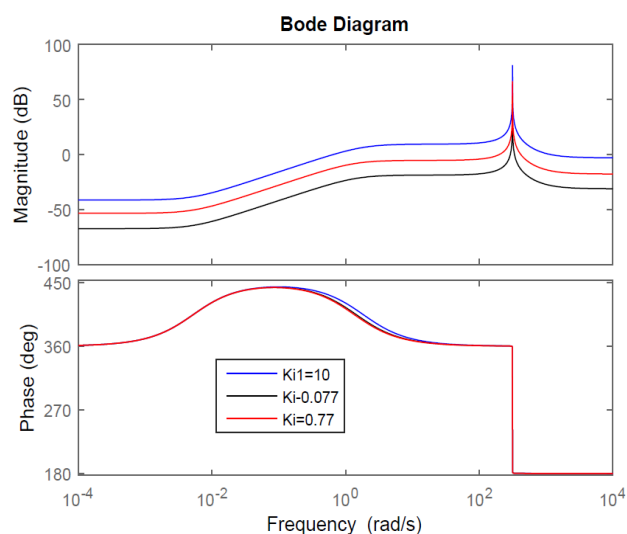


Figure 3. Bode Plot for Gov(s)

TABLE 1

Table 1. The frequency domain analysis parameters for different k_i values

Parameters	Gain Margin	Phase Margin	PM Frequency	Delay Margin	DM Frequency	Stable
Ki=10	1.4084	-110.2359	0.6537	6.6688	0.6537	1
Ki=0.77	35.8508	-179.8441	291.3206	0.0108	291.3206	1
Ki=0.077	7.6823	-179.6415	199.9663	0.0157	199.9663	1

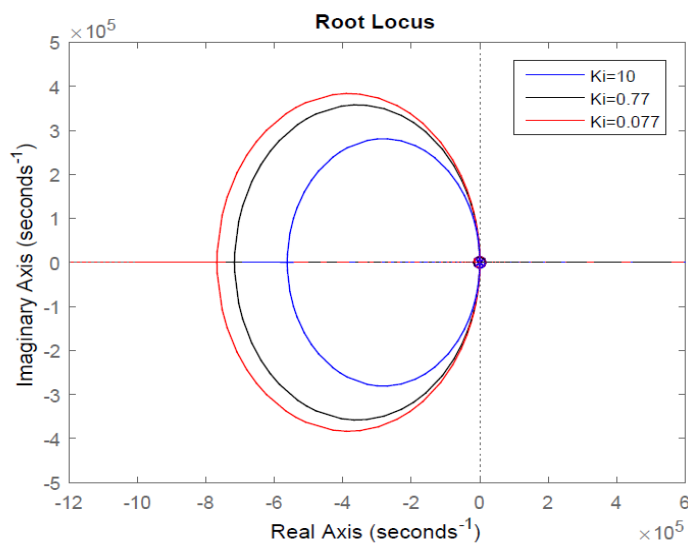


Figure 4. Root-Locus Plot for Gov(s)

TWO AREA-BASED SOLAR PV DC MICROGRID TESTBED SYSTEM

A two-area testbed system interconnected by a shared transmission line network is shown in Fig.5. Each area consists of a small microgrid (M.G.) generation system, a BESS, and a solar-PV panel with dc-dc MPPT system tied to a common dc micro-grid with internal loading as shown in Fig.6.

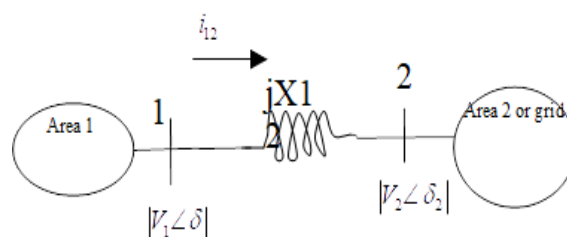


Figure 5. Two area system under study with FACTS device

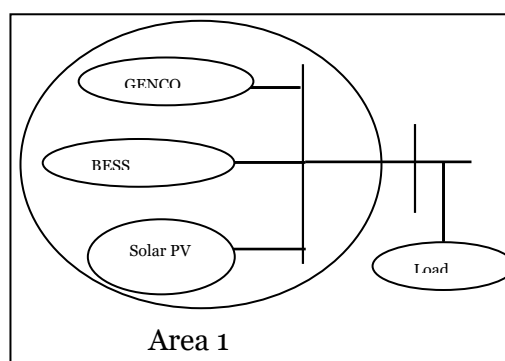


Figure 6. One area source, load schematic

The solar P.V. panel system with an inverter unit simplified block diagram is shown in Fig.5. There will be a source side inductor for current smoothening and then a switch in parallel for chopping or regulating dc voltage application to a constant voltage irrespective of irradiance. Then, capacitors supply constant voltage to the inverter switches even with a large load or grid disturbances. The filter bank contains L.C.L. elements to improve the voltage and current waveforms to the grid requirements. The (IV) current-voltage and (P.V.) power-voltage characteristics of the solar panel at different irradiance values are shown in Fig. 7. and Fig. 8.

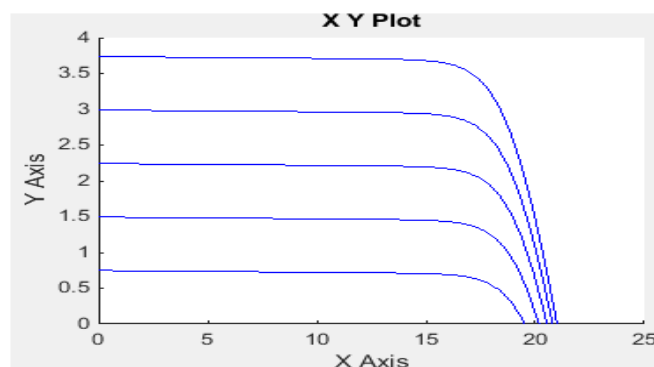


Figure 7. IV- Characteristics

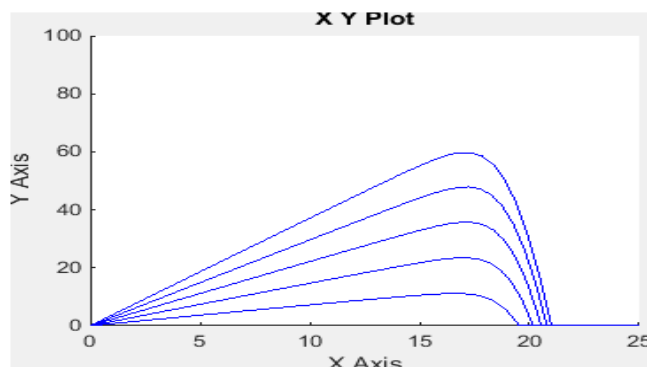


Figure 8. PV- Characteristics

The values of the DC MG solar PV BESS panel system parameters are shown in the Appendix at the end of the paper Conclusion section. The solar panel current-voltage (IV) and power-voltage (P.V.) characteristics at different irradiance values simulation outputs is shown in Fig.7. and Fig.8.

Modeling of Bess for Solar PV Grid-Connected System For Real Power Flow Sharing

The grid voltage is supposed to be 230V, and the battery converter voltage set at 1.2 times the voltage, which is 276V. If for a nominal lithium-ion battery rating of 9V, the number of series battery cells required is $(270/9)$ 31number. If an Ampere-hour of the battery set to 100, and the power rating for compensation for the solar PV-load system is assumed to be 300KWh, the desired Ah is $(300K/276)= 1087Ah$ and hence requires $(1087/100)=11$ cells in parallel. For a voltage source of 276 V the Li-ion battery modellingwith the equivalent capacitance C_b is given as [35]. To analyse the battery energy storage with the parallel combination of capacitance (C_b) and resistance (R_b) in series with internal resistance (R_{in}) is done using Thevenin's model [35].

Solar PV Panel Closed Loop Control for Maximum Real Power Extraction

The maximum power point tracking (MPPT) technique is generally adopted extractmaximum power from the PV cell. The solar PV panel performance will be improved and voltage profile can be maintained at desirable valuecan be done based on the MPPT technique adopted. There are numerous MPPT techniques available in the literature

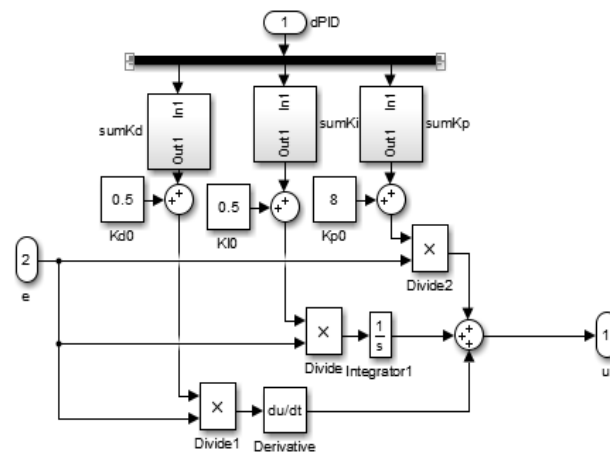


Figure 10. Output sub-block diagram to get output

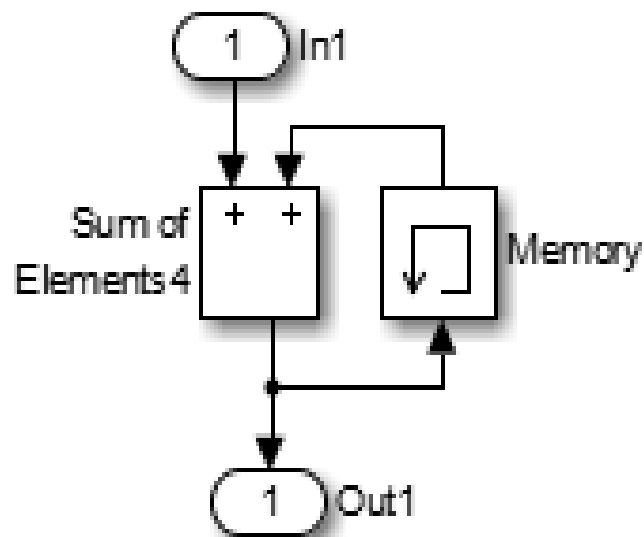


Figure 11. PID error-gain sub-block

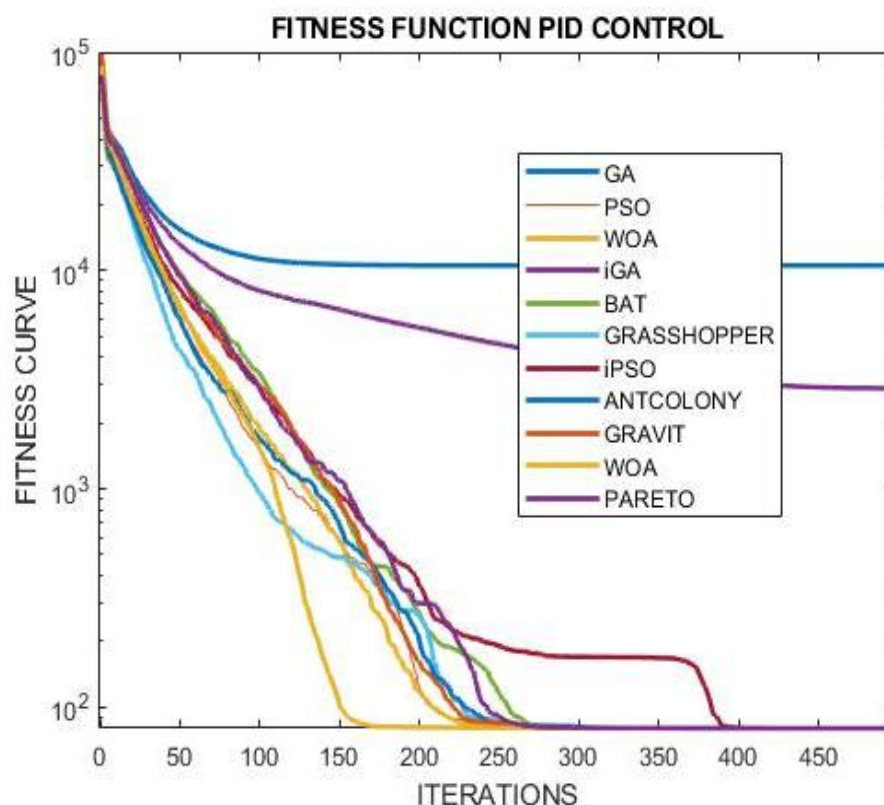


Figure 12. Fitness curve optimization graphs using various metaheuristic techniques

The different and most famous metaheuristic techniques like genetic algorithm (GA), particle swarm optimization (PSO), BAT, GWO, improved GA, improved PSO, grasshopper, Ant-Bee Colony, Gravity search, WOA and Pareto search are used for PID tuning and the fitness curve with 500 iterations count is observed as shown in Fig. 12. It is found that GWO and WOA are having very quick fitness curve capability, improved dynamic response, better stability enhancement characteristics among all these metaheuristic algorithms. Hence, we considered to show the GWO and WAO algorithms for oscillations damping and stability improvement in a dc microgrid with solar BESS power network in the next section analyzing about the results. The different pseudo-codes for few algorithms are discussed very briefly and complete details will be available in the respective references. This paper used these techniques for the proposed network with PID controller performance enhancement.

The multi-objective pseudo code for solar PV MPPT using Gravitational Search Algorithm (GSA) [36 and 37] is shown in algorithm 1. While the real coded binary ant bee colony algorithm for a generalized system with islanded microgrid [38] is shown in algorithm 2.

Algorithm 1:

Gravitational Search Algorithm (GSA)

Begin

 initialize population and evaluate generation

 evaluate fitness of agents

while

 test for population, mutation until not met;

 evaluate different directions of total force;

 calculate velocity and acceleration;

 repeat while loop

end

end

Algorithm 2:

Real Coded Ant Bee Colony Algorithm (RCABC)

Begin

 initialize population

 evaluate fitness

while

 apply greedy selection process;

 for every unemployed bee;

 look for new population;

 check for fitness

 apply and update for greedy selection process

 until (best solution achieved)

end

end

Algorithm 3:**Strength Pareto Evaluation Algorithm (SPEA)****Begin**

initialize population
evaluate solutions
create empty external set
test for fitness in population and
test further for external set

while

update external set;
repeat till number of non-dominated solutions are higher than the
specified size of external set;
or maximum number of generations are achieved;
making pool updated with binary tournament
solution with replacement on updated external set
check for best solution

end**end**

Thesolar photovoltaic MPPT and stability enhancement using WOA and GWO algorithms are discussed in [40 and 41] and their pseudo-code algorithms are discussed briefly in algorithms4 and 5.

Algorithm 4:**Whale Optimization Algorithm (WOA)****Begin**

initialize population of whales randomly
create fitness for search and grading of all the whales
test for fitness in population and
test further for best search agent (X)

while

Calculate value of a and other parameters
for $h < 0.5$ and then for $h > 0.5$
different $|A|$ values, calculate X
each search agent
repeat till all agents, and positions are checked;
update and repeat for all the grading agents
or maximum number of populations are achieved;
solution with replacement on updated agent solution
check for best solution
repeat all these steps till all the iterations are checked

end**end**

Algorithm 5:**Grey Wolf Optimization Algorithm (GWO)****Begin**

initialize population of grey wolves, a, A and C
 evaluate solutions
 create fitness for search and grading of agents
 test for fitness in population and
 test further for first, second and third best solutions

while

for each search agent

update search agent position;

repeat till all agents, and positions are checked;

update and repeat for all the grading agents

or maximum number of populations are achieved;

solution with replacement on updated agent solution

check for best solution

repeat all these steps till all the iterations are checked

end

end

RESULT ANALYSIS

The solar PV BESS system connected to a dc M.G. with voltage control action using GWO and WAO and without controller response is shown in Fig. 13. to Fig. 23.. The M.G. is started suddenly at 1 second of simulation time, and different parameters' response is analyzed. Based on Fig. 13, the solar P.V.increases output voltage without a controller with time and is said to be unstable when black-started immediately. With WAO, the solar P.V. output has a peak value of 1.065 p.u.,(perunit)and reaches reference 1.02 value at 3 seconds (s) without oscillations. With GWO, the voltage at the start is 0.99 and also settles at 3s. It can be observed that instead of voltage peak (rise) with WAO, the dip, which is a better feature for GWO proposed. The oscillations are damped effectively, and improved overall stability with WAO and GWOobserved a better response with GWO.

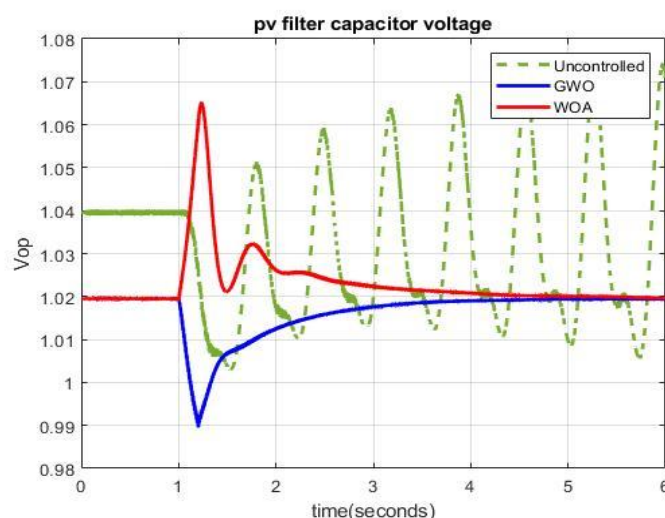


Figure 13. Solar PV output voltage

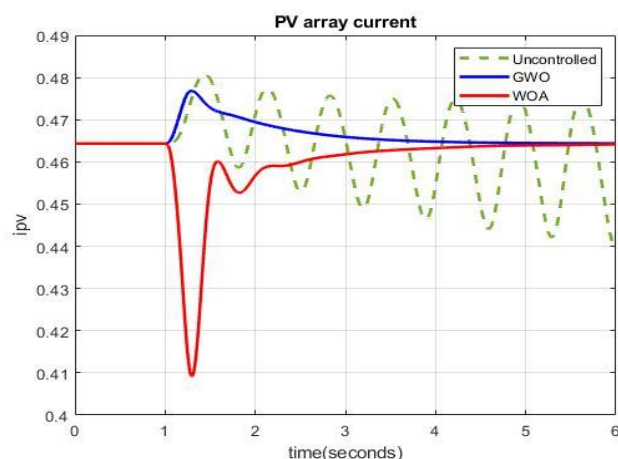


Figure 14. Solar PV current after MPPT

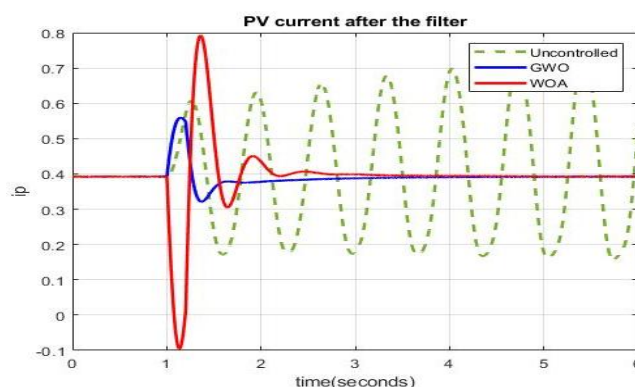


Figure 15. Solar PV current after filter

The solar P.V. current output after MPPT without a controller, with WAO and GWO, is shown in Fig. 14. The solar P.V. current is unstable without a controller, is having starting impulse to a value of 0.41 pu, and reached its reference value of 0.465 p.u., with WAO and settled at 3s. With the proposed GWO, the current rises to 0.476 p.u., and settles at the same period of 3s. The current surge value is smaller with GWO compared to the WAO value. The solar P.V. panel output current after the inductor filter bank and at the point of M.G. connection without a controller, with WAO and GWO, is shown in Fig. 15. The solar current after the filter bank is having a sustainable operation without a controller with oscillations from 0.65 to 0.2 p.u., range. With FPID, the current surge at 1s black-start has a large spike varying between -0.1 p.u., and 0.8 p.u., and settles at 3s and has two considerable oscillations. The same current with GWO, the current starting surge is 0.55 p.u., and settles at 1.5s to the reference value of 0.4 p.u., depicts better settling time, lower peak-overshoot, quicker and smoother response.

The solar P.V. current before the filter without a controller, with WAO and GWO, is shown in Fig. 16. The current is oscillatory when using the controller. With FPID, the current surges starting are 0 to 0.8 p.u., and settle at 2.5s with three damped oscillations and settled at 0.4 p.u., reference value. The same current has a peak of 0.58 p.u., at 1s, and resolves to 0. p.u., at 1.5s with effective damping.

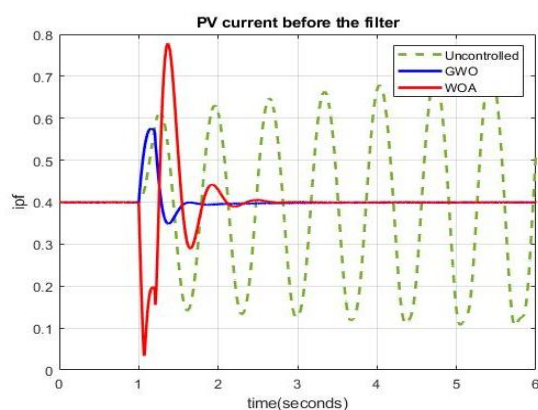


Figure 16. Solar PV current before filter

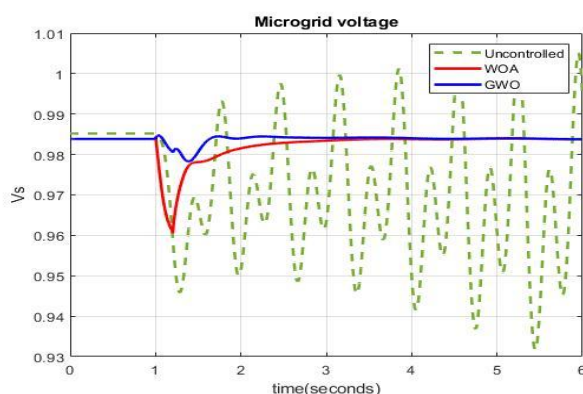


Figure 17. MG injected voltage

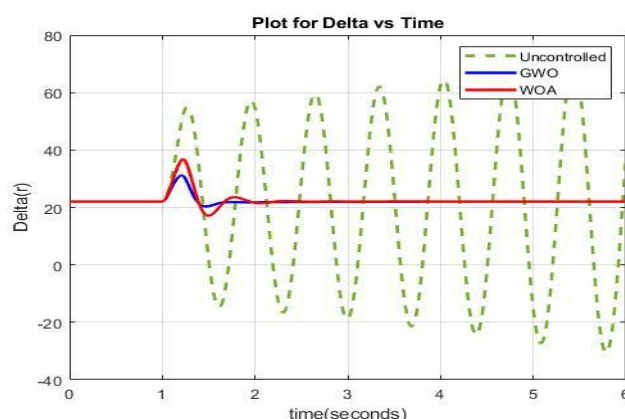


Figure 18. SG power angle (delta)

The voltage at the M.G. terminal (V_2) without a controller, with FPID, and with GWO is shown in Fig. 17. The M.G. voltage is unstable when the controller is not used, and the range of oscillations is from 1 to 0.93 p.u., and increasing with time. The WAO based M.G. voltage has a voltage dipped to 0.98 p.u., when the solar PV system is started at 1 p.u., and settles at 3s to 0.982 p.u., reference value. The M.G. voltage with GWO, voltage dipped to 0.98 p.u., and settles to 0.98 p.u., reference voltage quickly at 1.5s smoothly and without oscillations. The S.G. load angle (delta) plot with time in Fig. 18. The load angle is unstable without any controller and oscillates between 60 and -40 degrees, increasing exponentially and cosine with time. The WAO and GWO based load angle in degrees increased to 38 and 30 degrees and settled at 2s and 1.5s, respectively, and settled to 20 degrees after that.

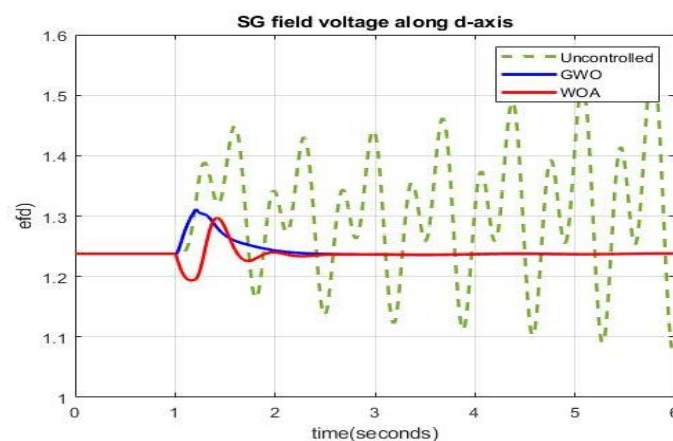


Figure 19. SG d-axis voltage

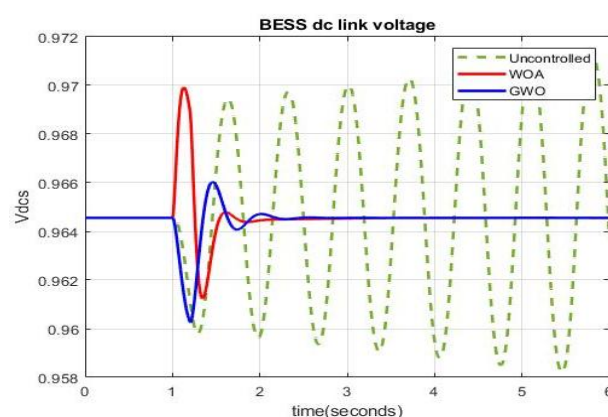


Figure 20. BESS dc link voltage

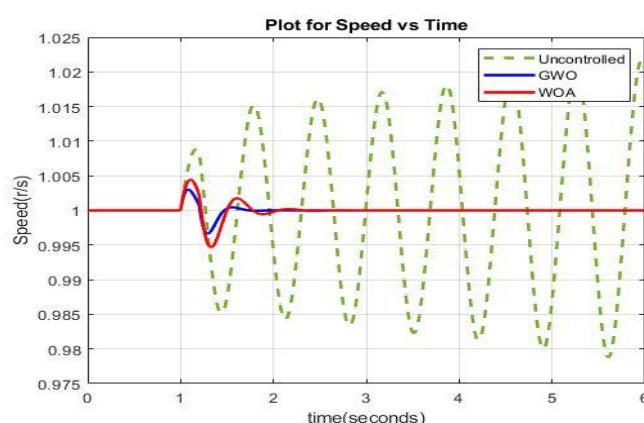


Figure 21. SG rotor speed

The d-axis voltage of the S.G. is shown in Fig. 19. Without a controller, voltage is unstable and increasing oscillatory with a range of 1.5 to 1.1 p.u. With the FPID, this d-axis S.G. voltage has two oscillations in the range of 1.3 to 1.2 p.u. and settles at 2.5s to 1.25 p.u.. The d-axis voltage with the GWO controller rises to 1.3 p.u., with a single oscillation and settles at 2.5s. The BESS terminal voltage without a controller, with WAO and GWO, is shown in Fig. 20. The battery chopper voltage rises to 0.97 p.u., then to 0.96 p.u., and then settles to 0.965 p.u., at 2.5s, the same voltage with GWO reached 0.96 and then settled at 2s at 0.965 p.u. The GWO is not producing overshoot and results in a smoother and quicker response than the WAO controller.

The S.G. rotor speed without any controller, with WAO and with GWO is shown in Fig. 21. The pace is oscillatory and unstable when not using the controller. The rotor speed changed from 1.005 to 0.995 p.u., and settles at 2s, while with GWO, the rotor speed changed from 1.003 to 0.998 p.u., and drops at 1.5s to 1 p.u., speed value.

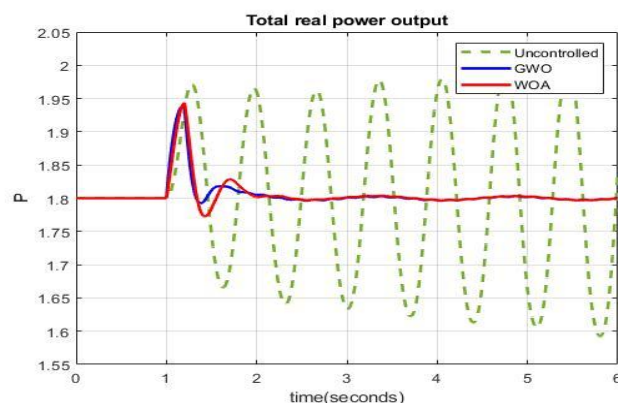


Figure 22. Injected real power

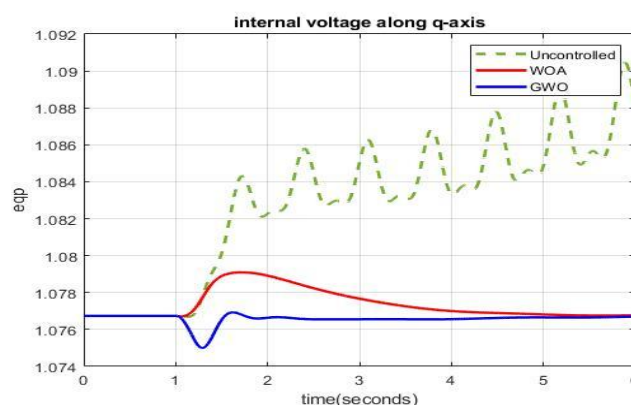


Figure 23. Internal voltage along q-axis supplied to the M.G.

The real power injected to the dc M.G. by the solar PV BESS system without a controller, FPID, and GWO controller is shown in Fig. 22. The real power is unstable and oscillatory when using no controller. With FPID, the real power increased to 1.95 and then to 1.78 p.u., then settles to 1.8 p.u. At 2.2s and with GWO, the real power injected rises to 1.93, then to 1.8 p.u., and pays at 1.6s earlier than WAO controller. The real power injected into the dc M.G. by a P.I. controller is 1.774940269747908 p.u., with FPID, 1.79214638652114 p.u. GWO, 1.801264409755665 p.u. Hence, the active power injection is more with GWO compared to WAO and P.I.D. Controller. The elapsed time for the simulation took 25.569193 seconds to complete.

CONCLUSION

This paper presents the use of metaheuristic Proportional-Integral-Derivative (MPID) controllers, optimized using Whale Algorithm Optimization (WAO) and Grey Wolf Optimization (GWO), for enhanced power flow control and oscillation damping in a DC microgrid (MG) system. The performance of key components—including the synchronous generator (SG), solar photovoltaic (PV) cell, microgrid (MG), and battery energy storage system (BESS)—is analyzed during sudden start-up conditions. The BESS plays a critical role in supporting the PV system during periods of low or no solar generation, such as at night or under partial shading.

The results show that without any controller, system parameters become unstable, leading to significant oscillations. In this uncontrolled scenario, the system fails to maintain a constant grid voltage or rotor speed, and

exhibits sustained fluctuations in PV voltage, current, power angle (δ), rotor speed, and BESS terminal voltage. However, the application of WAO- and GWO-tuned PID controllers significantly improves the system's dynamic performance.

Among the two, the GWO-based controller demonstrates superior performance. It results in reduced peak overshoot, faster settling time, lower oscillations, and smoother system response compared to the WAO-based controller. Furthermore, the GWO controller exhibits faster computation time and better adaptability to various system parameters, making it less dependent on specific system conditions. Additionally, the GWO controller facilitates higher real power injection into the system. Therefore, the GWO-optimized PID controller proves to be more robust and effective than the WAO counterpart for regulating power flow and enhancing stability in DC microgrid applications.

Appendix

Inductances L_1 , L_2 and L_3 are 5mH, capacitances $C_1=200\mu\text{F}$, $C_2=2000\mu\text{F}$ and $C_3=300\mu\text{F}$, resistances $R_1=14.4\Omega$, $R_2=9\Omega$, R_E and $R_L=1\Omega$, $R_p=106\Omega$, $I_{pv}=9\text{A}$, $a=0.767$, $\beta=0.05$.

REFERENCES

- [1] Tie, Siang Fui, and Chee Wei Tan. "A review of energy sources and energy management system in electric vehicles." *Renewable and sustainable energy reviews* 20 (2013): 82-102.
- [2] Rauschenbach, Hans S. *Solar cell array design handbook: the principles and technology of photovoltaic energy conversion*. Springer Science & Business Media, 2012.
- [3] Li, Quan, and Peter Wolfs. "A review of the single phase photovoltaic module integrated converter topologies with three different D.C. link configurations." *IEEE Transactions on power electronics* 23, no. 3 (2008): 1320-1333.
- [4] Hafiz, Faeza, Anderson Rodrigo de Queiroz, and Iqbal Husain. "Multi-stage stochastic optimization for a PV-storage hybrid unit in a household." In *2017 IEEE Industry Applications Society Annual Meeting*, pp. 1-7. IEEE, 2017.
- [5] Gouda, Eid Abdelbaki, Ahmed Abd-Alaziz, and Magdi El-Saadawi. "Design modeling, and control of multi-stage SMES integrated with P.V. system." *Journal of Energy Storage* 29 (2020): 101399.
- [6] Hu, Yihua, Wenping Cao, Bing Ji, Jikai Si, and Xiangping Chen. "New multi-stage D.C.–D.C. converters for grid-connected photovoltaic systems." *Renewable energy* 74 (2015): 247-254.
- [7] Chaurasiya, Prem Kumar, Vilas Warudkar, and Siraj Ahmed. "Wind energy development and policy in India: A review." *Energy Strategy Reviews* 24 (2019): 342-357.
- [8] <https://www.worldenergy.org/data/resources/resource/solar/>.
- [9] El-Shahat, Adel, and Sharaf Sumaiya. "DC-microgrid system design, control, and analysis." *Electronics* 8, no. 2 (2019): 124.
- [10] Nansur, Ainur Rofiq, Alfis Syah Laili Hermawan, and Farid Dwi Murdianto. "Constant voltage control using fuzzy logic controller (FLC) to overcome the unstable output voltage of MPPT in DC microgrid system." In *2018 International Electronics Symposium on Engineering Technology and Applications (IES-ETA)*, pp. 19-24. IEEE, 2018.
- [11] Vasantharaj, Subramanian, Vairavasundaram Indragandhi, Vairavasundaram Subramaniaswamy, Yuvaraja Teekaraman, Ramya Kuppusamy, and Srete Nikolovski. "Efficient Control of DC Microgrid with Hybrid PV–Fuel Cell and Energy Storage Systems." *Energies* 14, no. 11 (2021): 3234.
- [12] Yan, Hein Wai, Glen G. Farivar, Neha Beniwal, Naga Brahmendra Yadav Gorla, Hossein Dehghani Tafti, Salvador Ceballos, Josep Pou, and Georgios Konstantinou. "Control strategy for effective battery utilization in a stand-alone dc microgrid with solar energy." In *2021 IEEE Energy Conversion Congress and Exposition (ECCE)*, pp. 1046-1051. IEEE, 2021.
- [13] Satapathy, Manoranjan, Meher Preetam Korukonda, Amir Hussain, and Laxmidhar Behera. "A direct perturbation based sensor-free mppt with dc bus voltage control for a standalone dc microgrid." In *2019 IEEE PES Innovative Smart Grid Technologies Europe (ISGT-Europe)*, pp. 1-5. IEEE, 2019.
- [14] Das, Saborni, Abhik Hazra, and Mousumi Basu. "Metaheuristic optimization based fault diagnosis strategy for solar photovoltaic systems under non-uniform irradiance." *Renewable energy* 118 (2018): 452-467.

- [15] Pathak, Pawan Kumar, Anil Kumar Yadav, and P. A. Alvi. "A state-of-the-art review on shading mitigation techniques in solar photovoltaics via meta-heuristic approach." *Neural Computing and Applications* (2021): 1-39.
- [16] Bodha, Kapil Deo, Vinod Kumar Yadav, and Vivekananda Mukherjee. "A novel quantum inspired hybrid metaheuristic for dispatch of power system including solar photovoltaic generation." *Energy Sources, Part B: Economics, Planning, and Policy* 16, no. 6 (2021): 558-583.
- [17] Pillai, Dhanup S., and N. Rajasekar. "Metaheuristic algorithms for PV parameter identification: A comprehensive review with an application to threshold setting for fault detection in PV systems." *Renewable and Sustainable Energy Reviews* 82 (2018): 3503-3525.
- [18] Mohamed, Mohamed A., Ahmed A. Zaki Diab, and Hegazy Rezk. "Partial shading mitigation of PV systems via different meta-heuristic techniques." *Renewable energy* 130 (2019): 1159-1175.
- [19] Das, Monotosh, Maisanam Anil Kumar Singh, and Agnimitra Biswas. "Techno-economic optimization of an off-grid hybrid renewable energy system using metaheuristic optimization approaches—case of a radio transmitter station in India." *Energy conversion and management* 185 (2019): 339-352.
- [20] Sun, Jiwei, Wei Lin, Mingguo Hong, and Kenneth A. Loparo. "Voltage Regulation of DC-microgrid with P.V. and Battery." *IEEE Transactions on Smart Grid* 11, no. 6 (2020): 4662-4675.
- [21] Gu, Yunjie, Wuhua Li, and Xiangning He. "Passivity-based control of D.C. microgrid for self-disciplined stabilization." *IEEE Transactions on Power Systems* 30, no. 5 (2014): 2623-2632.
- [22] Doshi, Karan, and V. S. K. V. Harish. "Analysis of a wind-PV battery hybrid renewable energy system for a dc microgrid." *Materials Today: Proceedings* (2020).
- [23] Alam, Mohd, Kuldeep Kumar, Saket Verma, and Viresh Dutta. "Renewable sources based D.C. microgrid using hydrogen energy storage: Modelling and experimental analysis." *Sustainable Energy Technologies and Assessments* 42 (2020): 100840.
- [24] Wang, Shuoqi, Languang Lu, Xuebing Han, Minggao Ouyang, and Xuning Feng. "Virtual-battery based droop control and energy storage system size optimization of a D.C. microgrid for electric vehicle fast charging station." *Applied Energy* 259 (2020): 114146.
- [25] Han, Ying, Hanqing Yang, Qi Li, Weirong Chen, Firuz Zare, and Josep M. Guerrero. "Mode-triggered droop method for the decentralized energy management of an islanded hybrid P.V./hydrogen/battery D.C. microgrid." *Energy* 199 (2020): 117441.
- [26] Matayoshi, Hidehito, Mitsunaga Kinjo, Shriram S. Rangarajan, Girish Ganesan Ramanathan, Ashraf M. Hemeida, and Tomonobu Senjyu. "Islanding operation scheme for D.C. microgrid utilizing pseudo Droop control of photovoltaic system." *Energy for Sustainable Development* 55 (2020): 95-104.
- [27] Singh, Prashant, and J. S. Lather. "Dynamic current sharing, voltage and S.O.C. regulation for HESS based D.C. microgrid using CPISM technique." *Journal of Energy Storage* 30 (2020): 101509.
- [28] Singh, Prashant, and J. S. Lather. "Dynamic current sharing, voltage and S.O.C. regulation for HESS based D.C. microgrid using CPISM technique." *Journal of Energy Storage* 30 (2020): 101509.
- [29] Naik, Jyotirmayee, Snehamoy Dhar, and P. K. Dash. "Adaptive differential relay coordination for PV DC microgrid using a new kernel based time-frequency transform." *International Journal of Electrical Power & Energy Systems* 106 (2019): 56-67.
- [30] Armghan, Hammad, Ming Yang, M. Q. Wang, Naghmash Ali, and Ammar Armghan. "Nonlinear integral backstepping based control of a D.C. microgrid with renewable generation and energy storage systems." *International Journal of Electrical Power & Energy Systems* 117 (2020): 105613.
- [31] Nguyen, Duy-Long, and Hong-Hee Lee. "Fuzzy P.I.D. Controller for Adaptive Current Sharing of Energy Storage System in D.C. Microgrid." In *International Conference on Intelligent Computing*, pp. 213-223. Springer, Cham, 2020.
- [32] Al-Sakkaf, Shehab, Mahmoud Kassas, Muhammad Khalid, and Mohammad A. Abido. "An energy management system for residential autonomous D.C. microgrid using optimized fuzzy logic controller considering economic dispatch." *Energies* 12, no. 8 (2019): 1457.
- [33] Sun, Qian, Qiuye Sun, and Dehao Qin. "Adaptive fuzzy droop control for optimized power sharing in an islanded microgrid." *Energies* 12, no. 1 (2019): 45.
- [34] Ananth, D., G. N. Kumar, D. Deepak Chowdary, and K. Appala Naidu. "Damping of Power System Oscillations and Control of Voltage Dip by Using STATCOM and UPFC." *International Journal of Pure and*

- Applied Mathematics 114, no. 10 (2017): 487-496.
- [35] Gayathri, T., D. V. N. Ananth, GV Nagesh Kumar, and G. Sivanagaraju. "Enhancement in dynamic and LVRT behaviour of an EFOC controlled DFIG with integrated Battery Energy Storage System." In 2013 Annual IEEE India Conference (INDICON), pp. 1-6. IEEE, 2013.
- [36] Pani, Alok Kumar, and Niranjana Nayak. "Forecasting solar irradiance with weather classification and chaotic gravitational search algorithm based wavelet kernel extreme learning machine." International Journal of Renewable Energy Research (IJRER) 9, no. 4 (2019): 1650-1659.
- [37] Li, Ling-Ling, Guo-Qian Lin, Ming-Lang Tseng, Kimhua Tan, and Ming K. Lim. "A maximum power point tracking method for PV system with improved gravitational search algorithm." Applied Soft Computing 65 (2018): 333-348.
- [38] Marzband, Mousa, Fatemeh Azarnejadian, Mehdi Savaghebi, and Josep M. Guerrero. "An optimal energy management system for islanded microgrids based on multiperiod artificial bee colony combined with Markov chain." IEEE Systems Journal 11, no. 3 (2015): 1712-1722.
- [39] Basu, M. "Economic environmental dispatch of solar-wind-hydro-thermal power system." Renewable Energy Focus 30 (2019): 107-122.
- [40] Xiong, Guojian, Jing Zhang, Dongyuan Shi, and Yu He. "Parameter extraction of solar photovoltaic models using an improved whale optimization algorithm." Energy conversion and management 174 (2018): 388-405.
- [41] Chawla, V., A. Chanda, and S. Angra. "Automatic guided vehicles fleet size optimization for flexible manufacturing system by grey wolf optimization algorithm." Management Science Letters 8, no. 2 (2018): 79-90.