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Performance Assessment of an Islanded Hybrid Power System with Different Storage Combinations Using an FPA-Tuned Two-Degree-of-Freedom (2DOF) Controller

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Abstract: During the past few decades, there has been significant growth in the renewable energy market because of increased concern over global warming and the continuous depletion of fossil fuel resources. There is a promising solar thermal technology that utilizes low-temperature heat to generate electricity. The conversion process of thermal energy to electricity is based on the principle of an organic Rankine cycle (ORC). This study investigated a novel islanded hybrid power system consisting of an ORC low temperature solar thermal system, wind (WTG), diesel generation (DEG) set, and combined application of an energy storage system (ESS), such as a battery (BESS), super magnetic energy storage (SMES), and an ultracapacitor (UC) unit. Furthermore, the hybrid system was employed with a single controller (one of proportional-integral (PI), PI with derivative (PID), two-degree-of-freedom (2DOF) PI, and 2DOF PID controllers) with proportionate gains to the DEG, and the ESS, which is another unique aspect of this work. Moreover, a comparative performance assessment of the flower pollination algorithm (FPA) to tune the PI, PID, 2DOF PI, and 2DOF PID controllers was carried out. Finally, the performance of the above hybrid system was compared with different ESS combinations, namely, (i) only BESS, (ii) BESS + UC, and (iii) BESS + SMES. The simulation results indicated that a renewable integrated isolated power system with BESS + SMES provided a better response than the other ESS combinations. In fact, the presence of comparative dynamic responses verified the superiority of an FPA-tuned 2DOF PID compared with other FPA-tuned controllers.

Keywords: organic Rankine cycle; wind; diesel generation set; flower pollination technique; power system optimization

1. Introduction

Over the past few decades, there has been significant growth in the solar thermal market because of increased concern over global warming and the continuous depletion of fossil fuel resources [1]. However, solar thermal generating systems usually use a steam cycle with a high absorber temperature (about 400 °C), and hence, to reduce the cost of generation to a reasonable value, the capacity should be in the megawatt range [2]. There is another promising solar thermal technology that utilizes



low-temperature heat to generate electricity. The conversion process of thermal energy to electricity is based on the principle of an organic Rankine cycle (ORC). In fact, for small- or medium-capacity power applications, an ORC has a number of advantages over a steam cycle. For example, an operating temperature of less than 300 °C does not produce droplets throughout the expansion period, it requires less frequent maintenance, and is much simpler in design [3]. These benefits have driven the application of ORCs to become more striking in low- and medium-capacity power networks, where the services of electricity are not accessible by the centralized grid. A recent commercial 1 MW ORC-based solar power plant is in use in Arizona (APS), which leverages n-pentane, with an overall efficiency of 12.1% and accumulator efficiency of 59%. Since ORC solar thermal system can be integrated with the renewable energy system, it is suitable for hybrid power systems [4]. In the present work, an ORC-based solar thermal–wind generation (WTG)–diesel generation (DEG) autonomous hybrid power network was considered.

Despite their abundance and relative ease of access, wind and low temperature solar thermal energy have intermittency issues and require a sufficient backup for power quality improvement. Using an energy storage system (ESS) has come out as the potential solution for reducing the intermittence, providing back-up energy reserves, and improving power quality [5]. A battery storage unit (BESS) has been regarded as a suitable option for short-term energy storage and leveling power fluctuations due to the presence of renewable energy sources in power networks [6]. BESS has been used in autonomous hybrid power systems [7–10] for storing the excess power and supplying it back when it is required. Nonetheless, BESS has some limitations, such as slower charging and discharging rates and high maintenance requirements [11]. An ultracapacitor (UC) is another energy storage option for renewable-source-based hybrid power network. It has been deployed in renewable-dependent hybrid power networks to mitigate frequency fluctuations [4,12–15]. A UC has a higher power density than batteries, a high charge–discharge cycle frequency, a high cycle efficiency, and better depth-of-discharge characteristics [16]. A superconducting magnetic storage unit (SMES) also has been leveraged in an islanded hybrid power network [17,18] for mitigating low-frequency power oscillations and stabilizing the system frequency to the nominal value (50 Hz). During transient conditions, an SMES has the ability to damp out short-range power frequency oscillations and to steady the system frequency. It has a low power loss, fast response time, and a high charging–discharging rate [19]. Nonetheless, the dynamic responses of the proposed hybrid system employed with SMES + BESS or BESS + UC need to be explored.

The performance of an autonomous hybrid power network not only depends on the choice of the appropriate generation unit but also on the proper control strategy. Islanded hybrid power networks enabled with an integral (I), proportional with integral (PI), and proportional-integral with derivative (PID) controllers were examined in [20–24].

In any control process, disturbance rejection and tracking the setpoint are two vital features. A PID controller finds difficulty in solving these issues simultaneously. A 2DOF controller is capable of solving these problems. There are several advantages of a 2DOF controller over the PID controller, for instance, (i) more flexibility as there are additional parameters to be tuned, (ii) it is competent enough at disturbance rejection at a faster rate with a slight rise in overshoot while tracking the setpoint, and (iii) it is effective at mitigating the effect of variations in the reference. There could also be certain difficulties in implementing a 2DOF PID controller, namely, (i) sensors of the same compatible bandwidth need to be employed and (ii) the total effort or energy requirement for implementing a 2DOF PID controller will be higher than that of a single degree of freedom controller. However, a 2DOF PID controller provides higher performance than that of a single degree of freedom controller. The application of this controller in the frequency control of a conventional power system has been reported in [25]. However, its application in the proposed islanded hybrid microgrid model has not been explored.

In light of the above discussions, this work investigated the performance assessment of 2DOF controllers in a WTG–solar thermal power generation (STPG)–DEG–ESS autonomous hybrid power

system. The success of the recently developed flower pollination algorithm (FPA) [26] is the reason for choosing FPA for tuning the gains of the controllers instead of other algorithms, such as the genetic algorithm (GA) and particle swarm optimization (PSO) techniques. The suggested control mechanism was expected to deliver optimal coordinated control within the considered subunits by regulating the power-sharing during the contingencies such that the frequency could be stabilized within the acceptable range. The key objectives of this research are summarized below:

- (a) To investigate the dynamic behavior of PI, PID, 2DOF PI, and 2DOF PID controllers in time-domain simulations of a WTG-STPG-DEG-based autonomous hybrid energy system with the following ESS combinations: (i) only BESS, (ii) BESS + UC, and (iii) BESS + SMES.
- (b) To optimize the gains of the PI, PID, 2DOF PI, and 2DOF PID controllers using the heuristic FPA and to investigate their comparative dynamic performance on the proposed system for all three cases.
- (c) To study the dynamic responses of the FPA-tuned 2DOF PI and 2DOF PID controllers compared with their PI and PID counterparts for regulating the system frequency deviation during the disturbances of the sub-components, i.e., load, renewable power generations, or all of the above cases.
- (d) To compare the performance of the hybrid system model in terms of the frequency deviation in two different energy storage combinations, i.e., UC + BESS-based model compared with a BESS-based model.
- (e) To assess the similar performance between combined use of the SMES + BESS model compared with an only BESS-based hybrid system model.
- (f) Finally, to analyze the performance of the SMES + BESS-based hybrid energy system in contrast to the UC + BESS-based hybrid energy system regarding mitigating power fluctuations.

The rest of the paper is organized as follows: The next section of the proposed assignment deliberated the investigation of the proposed hybrid power model. The problem formulation is discussed in Section 3. The detailed steps of the FPA are illustrated in Section 4. The simulated results for the considered cases are discussed in Section 5 to support the claim and Section 6 briefly concludes the work.

2. Investigated Islanded Hybrid Power System

The WTG–STPG–DEG–BESS–UC/SMES-based islanded hybrid energy system is depicted in Figure 1. The system parameters of the autonomous hybrid system are taken from [7,17,21,24] and are presented in Table 1, along with their generation capacities. An overview of each of the components and their mathematical linearized transfer functions are discussed in [7,8,10,18].



Figure 1. Conceptual wind–solar thermal power generation (STPG)–diesel–battery energy storage system (BESS)–ultracapacitor (UC)/super magnetic energy storage (SMES)-based autonomous hybrid energy system.

SI. No.	Generating Units	Capacity	Gains	Time Constant (sec)
1	Wind turbine unit	200 kW	$K_{WTG} = 1.0$	$T_{WTG} = 1.5$
2	Solar thermal unit	50 kW	$K_S = 1.8, K_T = 1$	$T_S = 1.8, T_T = 0.3$
3	Diesel engine generator	150 kW	$K_{DEG} = 1/300$	$T_{DEG} = 2$
4	Super magnetic storage unit	200 kW	$K_{SMES} = -3/100$	$T_{SMES} = 0.1$
5	Battery storage unit	150 kWh	$K_{BESS} = -1/300$	$T_{BESS} = 0.1$
6	Ultracapacitor	200 kWh	$K_{UC} = -0.7$	$T_{UC} = 0.9$
7	Speed governor	-	$K_D = 1$	$T_D = 1$
8	Load	230 kW		
9	Damping factor, $D = 0.2$; inert	ia Coefficient, N	M = 0.012, regulation,	/droop constant = 1/5

Table 1. Nomenclature with the capacity of the considered system parameters.

3. Objective Problem Formulation

Any imbalance in the real power generation and demand causes a frequency deviation (Δf). The transfer function hybrid power system in term of *f* and the mismatch in real power (ΔP_e) is given by:

$$G_{sys}(s) = \frac{\Delta f}{\Delta P_e} = \frac{1}{K_{sys}(1 + sT_{sys})} = \frac{1}{M_s + D'}$$
(1)

where *Tsys*, *M*, and *D* are called the time constant, system inertia, and damping, respectively, of the system.

The control strategy employed with the system ensures the stable operation of the system by making Δf a minimum, if not zero. Therefore, the performance index in terms of Δf is represented by Equation (2):

$$J = \int_{0}^{t} (\Delta f)^2 dt,$$
(2)

subject to the constraints given by the Equations (3)–(7):

$$K_p^{\min} \le K_p \le K_p^{\max},\tag{3}$$

$$K_i^{\min} \le K_i \le K_i^{\max} \tag{4}$$

for PI controllers and:

$$K_p^{\min} \le K_p \le K_p^{\max},\tag{5}$$

$$K_i^{\min} \le K_i \le K_i^{\max},\tag{6}$$

$$K_d^{\min} \le K_d \le K_d^{\max} \tag{7}$$

for PID controllers, where K_p , K_i , and K_d are the three gain parameters of the PID controller.

In the Matlab R2013a (MathWorks, Natick, Massachusetts, USA) Simulation model of the proposed hybrid power system, three controllers were enabled with generation (DEG) and storage units (SMES, BESS), respectively. During the optimization of the PID control units' parameters in the frequency response model, the convergence curve *J* was minimized using the tuned K_p , K_i , and K_d parameters of all three PID control units. For the PI control unit, a similar process was followed by tuning all three PI control units' K_p and K_i gains. However, in the case of the 2DOF PI controller, in addition to the K_p and K_i parameters, the setpoint *b* of each of the three controllers was optimized. Similarly, in the case of the 2DOF PID controllers, the K_p , K_i , K_d , *b*, and *c* parameters were optimized simultaneously. The ranges of K_p , K_i , K_d , *b*, and *c* are presented in Table 2.

Variables	Minimum	Maximum
K_P	0	15,000
K_i	0	15,000
K_d	0	1500
Ь	0	1
С	0	1
N	0	100
р	0	18
9	0	18
r	0	1

Table 2. Ranges of the variables.

4. Flower Pollination Algorithm

The FPA is a newly established powerful metaheuristic tool that is centered on the notion of flower pollination, as proposed by Yang et al. [27]. In this pollination process, the pollen is distributed by interacting the male with the female flower part named the stigma. With a variety of pollinators in an ecosystem, it is assumed that there are almost two hundred diversified pollinators (such as bats, insects, and birds). Generally, two types of pollination are leveraged to process the pollinator: namely, biotic and abiotic processes. The FPA technique leveraged four rules to establish the real interaction process [27]:

- (a) The global pollination approach by enabling two biotic cross-pollinations with the distribution of the pollinators followed by Levy flights.
- (b) Consideration of abiotic self-pollination to lead toward local pollination.
- (c) The reproduction probability of a flower pollination approach is directly proportional to the similarity factor between the two engaged flowers.
- (d) A switching probability factor $P_s \in \{0, 1\}$ is utilized to contain the local and global pollination approach.

The detailed concept of the FPA may be found in [26–28]. In brief, for this study, the main objective was to find the fitness function in terms of J while optimizing the control parameters using FPA, which was as follows:

fitness_i =
$$\frac{1}{(1+J)}$$
 for the *i*th population. (8)

The tuned parameters of the FPA technique are shown in Table 3.

Table 3. Constraints of the flower pollination algorithm (FPA).

Maximum Generations	Population Size, <i>n</i>	Switch Probability, P_s	Levy Flight, λ
100	50	0.80	1.5

5. Results and Analysis

This section investigates the dynamic responses and their assessment of the proposed hybrid power system using time-domain simulations. In contrast to the utilization of separate controllers for different subsystems (generating/storage units), i.e., DEG, BESS, SMES, and UC, a lesser utilized load frequency controller (only one controller) was employed as shown in Figure 2. When the load demand exceeded the sum of the generation from the WTG and STPG, the DEG and ESS catered to the load with proper coordination. Table 4 presents the simulation conditions for the following three case studies.



Figure 2. Linearized frequency response model consisting of a wind generation (WTG)–STPG–diesel generation (DEG)–BESS-based autonomous hybrid energy system.

Sl. No.	Case Studies	Hybrid System Components	Operating Situations
1	Case 1	WTG, STPG, DEG, BESS	$\begin{split} P_{WTG} &= 0.4 \text{ p.u up to } 80 \text{ s} \\ &= 0.6 \text{ p.u at } 80 \text{ s onwards} \\ P_{STPG} &= 0.1 \text{ p.u up to } 40 \text{ s} \\ &= 0.2 \text{ p.u at } 40 \text{ s onwards} \\ P_{Load} &= 0.6 \text{ p.u at } 0 \text{ s onwards} \end{split}$
2	Case 2	WTG, STPG, DEG, BESS, UC	$\begin{split} P_{WTG} &= 0.4 \text{ p.u up to } 80 \text{ s} \\ &= 0.6 \text{ p.u at } 80 \text{ s onwards} \\ P_{STPG} &= 0.1 \text{ p.u up to } 40 \text{ s} \\ &= 0.2 \text{ p.u at } 40 \text{ s onwards} \\ P_{Load} &= 0.6 \text{ p.u at } 0 \text{ s onwards} \end{split}$
3	Case 3	WTG, STPG, DEG, BESS, SMES	$\begin{split} P_{WTG} &= 0.4 \text{ p.u up to } 80 \text{ s} \\ &= 0.6 \text{ p.u at } 80 \text{ s onwards} \\ P_{STPG} &= 0.1 \text{ p.u up to } 40 \text{ s} \\ &= 0.2 \text{ p.u at } 40 \text{ s onwards} \\ P_{Load} &= 0.6 \text{ p.u at } 0 \text{ s onwards} \end{split}$

Table 4. Operating conditions for the simulation studies.

5.1. Time-Domain Response Analysis: Case 1

The linearized model of the WTG–STPG–DEG–BESS-based autonomous hybrid energy network of this case is shown in Figure 2. P_{WTG} and P_{STPG} were the main power resources of the hybrid energy system, and DEG was expected to provide long-term energy balance, whereas the BESS integration acted as buffer storage for short-term compensation.

The generated power (P_S) in this scenario can be illustrated by Equation (9):

$$P_S = P_{WTG} + P_{STPG} + P_{DEG} \pm P_{BESS}.$$
(9)

The power-sharing from the WTG and STPG with a load demand is given in Figure 3. In this base scenario, a constant sharing of 0.6 p.u load power is leveraged. To study the controller responses caused by step disturbances in input powers, the following time-domain analysis was carried out. During 0 < t < 40 s, as shown in Figure 3, the total power generated by the P_{WTG} and P_{STPG} system was less than the load power-sharing; thus the DEG and BESS units provided the extra power required to balance the load demand. At t = 40 s, the solar P_{STPG} increased to 0.36 p.u from its base value of 0.18 p.u due to an increase in solar radiation, and at 80 s, P_{WTG} was suddenly uplifted to 0.6 p.u from its previous value of 0.4 p.u. During 80 < t < 120 s, the system had surplus generation; hence,

there was no power generation from the diesel generator and the BESS started absorbing the excess power (Figure 4).



Figure 3. Power-sharing between a wind generator, solar thermal power system, and load in case 1.



Figure 4. Power-sharing of the (a) BESS and (b) DEG in case 1.

During the abovementioned uncertainties, the system frequency deviated due to an imbalance in the aggregated generation-load power. The controller integrated into the hybrid energy network automatically regulated the power-sharing of the DEG and BESS to the corresponding values to eliminate the power difference. Finally, the frequency settled down to its base value because of the action of the controllers. The transient response of the frequency deviation observed with the FPA-optimized PI, PID, 2DOF PI, and 2DOF PID controllers are depicted in Figure 5.



Figure 5. Comparative changes in the frequency deviations observed with the FPA-tuned proportional-integral (PI), PI with derivative (PID), two-degree-of-freedom (2DOF) PI, and 2DOF PID controllers in case 1.

From the comparative dynamic responses of the change in frequency fluctuations leveraging the FPA-tuned PI, PID, 2DOF PI, and 2DOF PID controllers, it can be seen that the system dynamics of the FPA-optimized 2DOF PID controller was superior compared to the PI, PID, and 2DOF PI controllers, which was due to decision parameters, such as the peak transient deviation and the settling time.

The optimized gain values of the PI, PID, 2DOF PI, and 2DOF PID controllers attained using the FPA are displayed in Tables 5–8, respectively.

Variable	Case 1	Case 2	Case 3
K_{pDEG}	8002.31	6999.01	9000.12
K_{iDEG}	7001.43	5000	6998.44
р	2	1.98	2
9	0.99	1	1
r	-	0.01	0.06

Table 5. Optimum PI controller parameters after leveraging the FPA.

Fable 6. Optimum PID controller pa	arameters after lever	raging the FPA
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Variable	Variable Case 1		Case 3
K _{pDEG}	2160.83	1400.59	1460.36
K _{iDEG}	1800	1000	1300
K_{dDEG}	1100.78	998.78	150.78
р	15	10	13
9	6.38	4.5	4.48
r	-	0.1	0.68

Variable	Case 1	Case 2	Case 3
K _{pDEG}	9745	10,001	9689
K _{iDEG}	10,540	8984	9012
b	0.979	0.962	0.958
р	7.5	7.42	10.50
9	9.81	9.9	11.02
r	-	0.05	0.8

Table 7. Optimum 2DOF PI controller parameters after leveraging the FPA.

Table 8. Optimum 2DOF PID controller parameters after leveraging the FPA.

Variable	Case 1	Case 2	Case 3
K_{pDEG}	12,458.46	11,997.12	12,668.69
K _{iDEG}	12,238.84	12,189.46	11,997.37
<i>K</i> _{dDEG}	1	0.99	1
N	75.865	76	81
b	0.951	0.949	0.960
С	0.9192	0.9089	0.8998
р	8	7.89	12
q	11	10	14
r	0.01	0.04	0.0331

The maximum frequency deviations (Δf in Hz) of the autonomous hybrid power network for various operating conditions are tabulated in Table 9.

Table 9. Change in the frequency fluctuations (Δf in Hz) of the proposed system for different cases.

Variable	Case 1	(BESS)	Case 2 (BI	ESS + UC)	Case 3 (BES	SS + SMES)
Time (s)	t = 40 s	t = 80 s	t = 40 s	t = 80 s	t = 40 s	t = 80 s
Δf	Overshoot	Overshoot	Overshoot	Overshoot	Overshoot	Overshoot
PI	0.001762	0.002394	0.0009171	0.001261	0.0005068	0.0006786
PID	0.001159	0.001593	0.0006243	0.0008791	0.0003091	0.0004147
2DOF PI	0.0007034	0.0009497	0.0004831	0.0006707	0.0002328	0.0003128
2DOF PID	0.0005593	0.0007652	0.0003517	0.000498	0.0001132	0.0001574

5.2. Time-Domain Response Analysis: Case 2

The transfer function model of the WTG–STPG–DEG–BESS–UC-based islanded hybrid energy network of this case is shown in Figure 6. In this case, P_{WTG} and P_{STPG} were also the prime power sources of the hybrid energy system, and DEG was expected to provide long-term energy balance, whereas the BESS and UC integration acted as energy storage devices.

The power generation in this case can be expressed by Equation (10):

$$P_S = P_{WTG} + P_{STPG} + P_{DEG} \pm P_{BESS} \pm P_{UC}.$$
(10)

In this case, the loading conditions of the system remained the same as in case 1. Figure 7 shows the output power of (a) BESS, (b) DEG, and (c) UC.

Figure 8 depicts the comparative performance assessment of Δf for the considered case model after leveraging the FPA-optimized PI, PID, 2DOF PI, and 2DOF PID controllers. From the above, it can be concluded that the response of the FPA-optimized 2DOF PID controller was better than the PI, PID, and 2DOF PI controllers considered for this study under disturbed conditions in terms of the peak transient deviation and settling time.

The optimized gain values of the PI, PID, 2DOF PI, and 2DOF PID controllers obtained using the FPA are presented in Tables 5–8, respectively. The maximum change in frequency deviations (Δf in Hz) of the hybrid response model for various operating conditions are shown in Table 9.



Figure 6. Linearized frequency response model consisting of a WTG–STPG–DEG–BESS–UC-based autonomous hybrid energy system.



Figure 7. Output power of the (a) BESS, (b) DEG, and (c) UC in case2.



Figure 8. Comparative changes in the frequency deviations observed with the FPA-tuned PI, PID, 2DOF PI, and 2DOF PID controllers in case 2.

5.3. Time-Domain Response Analysis: Case 3

The transfer function model of the WTG–STPG–DEG–BESS–SMES-based autonomous hybrid energy system of this case is shown in Figure 9. In this case, P_{WTG} and P_{STPG} were also the primary power sources of the hybrid energy system, and DEG was expected to provide the long-term energy balance, whereas the BESS and SMES integration acted as energy storage devices.



Figure 9. Linearized frequency response model of the WTG–STPG–DEG–BESS–SMES integrated autonomous hybrid energy network.

The generated power in this scenario could be described by Equation (11):

$$P_S = P_{WTG} + P_{STPG} + P_{DEG} \pm P_{BESS} \pm P_{SMES}.$$
(11)

In this case, the loading conditions of the system remained the same as in case 1. Figure 10 shows the output power of the (a) BESS, (b) DEG, and (c) SMES.

Figure 11 depicts the comparative performance assessment of Δf for the considered case model after leveraging the FPA-tuned PI, PID, 2DOF PI, and 2DOF PID controllers. From the above, it can be concluded that the response of the FPA-optimized 2DOF PID controller under the disturbed conditions

performed better than the PI, PID, and 2DOF PI controller units, which was due to decision parameters such as the peak transient deviation and settling time.



Figure 10. Power-sharing of the (a) BESS, (b) DEG, and (c) SMES in case3.



Figure 11. Comparative changes in the frequency deviations observed with the FPA-optimized PI, PID, 2DOF PI, and 2DOF PID controllers in case 3.

The optimized gain values of the PI, PID, 2DOF PI, and 2DOF PID controllers attained using the FPA are displayed in Tables 5–8, respectively. The maximum changes in the frequency fluctuations (Δf in Hz) of the hybrid response model for different operating conditions are shown in Table 9.

5.4. Comparative Performance of the Frequency Responses of the Above Three Cases

In this section, the comparative performance in mitigating the frequency fluctuations was carried out for three cases: (i) only BESS, (ii) BESS + UC, and (iii) BESS + SMES.

5.4.1. Frequency Response of BESS (Case 1) vs. BESS + UC (Case 2)

The comparative assessment of the frequency deviation for the BESS and BESS + UC hybrid energy systems using the PI and PID controllers is given in Figure 12, while that using the 2DOF PI and 2DOF PI PID controllers is shown in Figure 13. Figure 14 illustrates the comparative performance of the PID and 2DOF PID controllers.



Figure 12. Comparative performances of the frequency responses of BESS (case 1) and BESS + UC (case 2) with the FPA-optimized PI and PID controllers employed in a hybrid response model.



Figure 13. Comparative performances of the frequency responses of BESS (case 1) and BESS + UC (case 2) with the FPA-optimized 2DOF-PID-controller-based hybrid energy systems.



Figure 14. Comparative performances of the frequency responses of BESS (case 1) and BESS + UC (case 2) with the FPA-optimized PID- and 2DOF-PID-controller-based hybrid energy systems.

It may be observed that the combined use of UC and BESS performed better than using only a BESS-based hybrid energy system and provided better frequency control in the hybrid energy system. Moreover, the performance assessment of the different controllers engaged in the energy storage revealed the superiority of the 2DOF PID controller against other combinations of controllers. The frequency deviation and setting time observed in these figures and in Table 9 (for Δf) confirmed the superiority of the 2DOF PID control strategy.

5.4.2. Frequency Response of BESS (Case 1) vs. BESS + SMES (Case 3)

The comparative assessment of the frequency fluctuation for the BESS and BESS + SMES hybrid energy systems using PI and PID controllers are provided in Figure 15, while that using the 2DOF PI and 2DOF PID controllers are shown in Figure 16. Figure 17 illustrates the comparative performances when using the PID and 2DOF PID controllers.



Figure 15. Comparative performances of the frequency responses of BESS (case 1) and BESS + SMES (case 3) with the FPA-optimized PI and PID controllers employed in a hybrid response model.



Figure 16. Comparative performances of the frequency responses of BESS (case 1) and BESS + SMES (case 3) with the FPA-optimized 2DOF-PI- and 2DOF-PID-controller-based hybrid energy systems.



Figure 17. Comparative performances of the frequency responses of BESS (case 1) and BESS + SMES (case 3) with the FPA-optimized PID- and 2DOF-PID-controller-based hybrid energy systems.

It may be observed that the combined use of SMES and BESS performed better than the only BESS-based hybrid energy system and caused better frequency control in the hybrid energy system. In fact, the performance assessment of different controllers engaged with the energy storage systems revealed the superiority of the 2DOF PID relative to the other combinations of controllers. The frequency deviation and setting time observed in Figures 15–17 and in Table 9 (for Δf) confirmed the superiority of the 2DOF PID control strategy.

5.4.3. Frequency Response of BESS + UC (Case 2) vs. BESS + SMES (Case 3)

The comparative assessment of the frequency deviations for the BESS + UC and BESS + SMES hybrid energy systems using PI and PID controllers is provided in Figure 18, while that using the 2DOF PI and 2DOF PID controllers are depicted in Figure 19. Figure 20 illustrates the comparative

performances when using the PID and 2DOF PID controllers. It may be observed that the combined use of SMES and BESS performed better than the BESS + UC-based hybrid energy system and caused better frequency control in the hybrid energy system. Moreover, the performance assessment of different controllers engaged in the energy storage revealed the superiority of the 2DOF PID controller against other storage combinations of enabled controllers.



Figure 18. Comparative performances of the frequency responses of BESS + UC (case 2) and BESS + SMES (case 3) with the FPA-optimized PI and PID controllers employed in a hybrid response model.



Figure 19. Comparative performances of the frequency responses of BESS + UC (case 2) and BESS + SMES (case 3) with the FPA-optimized 2DOF-PI- and 2DOF-PID-controller-based hybrid energy systems.



Figure 20. Comparative performances of the frequency responses of BESS + UC (case 2) and BESS + SMES (case 3) with the FPA-optimized PID- and 2DOF-PID-controller-based hybrid power networks.

Thus, the comparative assessment of frequency deviations for the hybrid energy systems revealed that the combined use of UC + BESS performed better than the only BESS-based hybrid energy system and caused better frequency control in the hybrid energy system. Furthermore, the combined use of SMES + BESS demonstrated better performance than the only BESS-based hybrid energy system. Finally, it was observed that the performance of the SMES + BESS-based hybrid energy system was more effective than the UC + BESS-based hybrid energy system at mitigating power fluctuations and achieved better frequency control in the hybrid energy system.

6. Conclusions

An islanded hybrid power system consisting of an ORC low-temperature solar thermal system, wind turbine generator, diesel engine generator, and the combined application of various energy storage systems was investigated for the first time. Furthermore, the hybrid system was employed with a single controller (any of the PI, PID, 2DOF PI, and 2DOF PID controllers) with proportionate gains to the DEG and the ESS, which is another unique aspect of this work. Moreover, a comparative performance assessment of the FPA-tuned PI, PID, 2DOF PI, and 2DOF PID controllers was carried out for three case studies. Finally, the performance of the above hybrid system was compared with different ESS combinations, namely, (i) only BESS, (ii) BESS + UC, and (iii) BESS + SMES. The simulation results indicated the following:

- (a) It was observed that the response of the FPA-optimized 2DOF PID controller was superior to the PI, PID, and 2DOF-PI controllers due to decision parameters such as the peak transient deviation and settling time.
- (b) The assessment of the responses of the hybrid system model for only BESS compared with UC + BESS under the same operating conditions showed that the UC + BESS-based hybrid system model performed better than the only BESS-based model. At the same time, the 2DOF PID controller provided a superior result compared with the other controllers.
- (c) Furthermore, the comparative performances of the only BESS-based hybrid system model against the SMES + BESS-based hybrid system model under the same operating conditions indicated

that the SMES + BESS-based hybrid system model performed better than the only BESS-based model. Furthermore, the 2DOF PID controller performed better than the other controllers.

- (d) However, the comparative performances of the BESS + UC-based hybrid system model against the SMES + BESS-based hybrid system model under the same operating conditions revealed that the SMES + BESS-based hybrid system model performed better than the BESS + UC-based model. Here, the performance assessment of the various controllers revealed the superiority of the 2DOF PID controller.
- (e) It was observed that the response of the FPA-optimized 2DOF PID controller was superior compared with the PI, PID, and 2DOF PI controllers due to decision parameters such as the peak transient deviation and settling time.
- (f) Finally, it was concluded that despite uncertainties or disturbances in the input due to the wind or the ORC low-temperature solar thermal system, a single controller with appropriate gains could maintain the system frequency within the acceptable limits. The use of a single controller is expected to reduce the costs while preserving the stability and reliability of the supply and system.

Our future study will include a comparative performance of the hybrid system model employed with other recent optimization-algorithm-based controllers.

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Abbreviations

ORC	Organic Rankine cycle
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- ESS Energy storage system
- UC Ultracapacitor unit
- WTG Wind generator
- BESS Battery
- SMES Super magnetic energy storage
- 2DOF Two-degree-of-freedom
- STPG Solar thermal power generation
- FPA Flower pollination algorithm
- DEG Diesel generation
- PI Proportional-integral
- PID Proportional-integral-derivative
- Δf Change in frequency deviation
- *J* Objective function

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