# FREQUENCY CONTROL OF AN ISOLATED HYBRID POWER SYSTEM USING PARTICLE SWARM OPTIMIZATION OPTIMIZED PID CONTROLLER

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### ABSTRACT

The mitigation of frequency fluctuation using Particle Swarm Optimization (PSO) based controllers for an isolated hybrid power system is explored in this paper. The proposed system consists of solar photovoltaic (PV), electric water heater (EWH) and diesel engine generator (DEG) and battery energy storage system (BESS). The intermittent output power of PV and load variations cause frequency fluctuations with several adverse effects on the power system. This paper presents a methodology for maintaining system frequency within acceptable employing electric water heater as a controllable load. The generating units and EWH system are equipped with PSO based proportional–integral (PI)/ proportional–integral–derivative (PID) controllers. The solutions obtained through the optimization are capable of handling higher variations in the controllers' gains without a significant decrease in the system performance. Also, a comparison is made between the PI and PID controllers to show the effectiveness of the proposed scheme. MATLAB/Simulink was used for simulation to verify the performance of the proposed system.

Index Terms- solar photovoltaic, electric water heater, diesel engine generator, Particle Swarm Optimization, Frequency deviation

### I. INTRODUCTION

Due to the continuous depletion of the fossil fuel, as well CO<sub>2</sub> emissions have demanded neat and clean energy sources [1]. Renewable energy sources such as wind and solar can be used to harness the plentiful energy which can play a major role in meeting the supply-demand as well as maintaining the mother earth clean. Nowadays, small-scale, isolated hybrid power system is gaining more and more importance because in remote or in hilly areas where grid connection is not feasible due to economic or technical reason [2]. As the renewable energy sources are intermittent in nature, out power from them causes the mismatch between the supply-demand. This mismatch in active power gives rise to frequency deviations. Hence, frequency control issue in power system has become very essential to ensure reliable power supply [2-4].

Given the above, mitigation of frequency fluctuations in a PV-EWH-DEG-BESS based isolated hybrid power system has been investigated. An efficient control strategy together with artificial intelligence (AI) technique has been used for effectively maintaining the active power balance. Thus, the proposed strategy is expected to mitigate the oscillations which is caused due to the mismatch in the active power, so as to maintain the system frequency within an acceptable range of the proposed isolated hybrid power system [5].

Different controllers and several optimization techniques for tuning the parameters of the controllers have been reported in the previous works [6-14]. In hybrid system studies, PI controllers have been used for maintaining the energy balance [6-8]. The parameters of the PI controllers in [9] has been tuned by Ziegler and Nichols method. GA optimized PI/PID [10,11], Fuzzy based PI controller [12,13], and neural network based PI controller [12] are also used. Firefly algorithm is optimized PID controllers [14] were successfully employed for an interconnected power system for load frequency control. Application of controllable loads for maintaing system frequency have been reported has been reported in [15, 16].

The present work presents a method for frequency control of the small isolated hybrid power system using EWH. PSO algorithm has been used for obtaining the gains of the PI/ PID controllers' parameters. The main objectives of the paper includes:

- Augmenting the PSO algorithm to find the gains of PI and PID controllers of the proposed system.
- Comparative analysis of the dynamic performance of PI and PID based controllers.
- Study the robustness of the controllers when the system system is subjected to several uncertainties and random load fluctuations.

The paper is organized as follows. Section 2 describes the configuration of the proposed system modeling in the form of transfer functions. Section 3 describes the effectiveness of EWH in the proposed system. Particle Swarm Optimization Technique is described in Section 4. Section 5 describe PID controller. The simulation results in the analysis in section 6 and section 7 describes the conclusion.

II. CONFIGURATION OF THE PROPOSED HYBRID SYSTEM

The schematic diagram of the isolated hybrid power system is shown in Fig. 1. Table 1 shows the nominal parameters of the hybrid system [1-17].

TABLE I. Nominal parameters					
Component	Gain (K)	Time Constant (T)			
Solar Photovoltaic (PV)	K <sub>PV</sub> =1	$T_{PV}=1.4$			
Diesel Engine Generator (DEG)	K <sub>DEG</sub> =0.03	T <sub>DEG</sub> =2			
Speed Governor (SG)	K <sub>SG</sub> =1	$T_{SG}=0.4$			
Electric Water Heater (EWH)	K <sub>EWH</sub> =1	T <sub>EWH</sub> =0.1			
Battery Energy Storage System (BESS)	$K_{\text{BESS}}=0.03$	$T_{BESS}=0.1$			

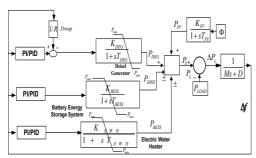


Fig. 1 Schematic block diagram of the isolated hybrid power system with different energy generation and storage.

#### A. Models of various generation subsystems

For small signal analysis, the transfer functions of the PV, DEG, and EWH can be modeled by using first order transfer functions (1 - 3). The gain and time constants of these are presented in Table I [1,10,11, 16].

$$G_{PV}(s) = \frac{K_{PV}}{(1 + sT_{PV})}$$
(1)

$$G_{EWH}(s) = \frac{K_{EWH}}{(1 + sT_{EWH})}$$
(2)

$$G_{DEG}(s) = \frac{K_{DEG}}{(1 + sT_{DEG})}$$
(3)

The BESS is used in this system, which will either absorb or release energy from or to the system depending upon whether there is surplus power or deficit power in the system respectively. The corresponding transfer function can be represented as (4) [11].

$$G_{BESS}(s) = \frac{K_{BESS}}{(1 + sT_{BESS})}$$
(4)

B. Power and frequency deviation

The mismatch in active power generation  $(P_S)$  and load demand  $(P_L)$  is given by

$$\Delta P_e = P_s - P_L \tag{5}$$

The transfer function model of power system in terms of system frequency deviation and active power mismatch can be expressed as follows:

$$G_{sys}(s) = \frac{\Delta f}{\Delta P_e} = \frac{1}{Ms + D} \tag{6}$$

where M and D represent the equivalent inertia constant and damping constant of the said system. In this paper, M=0.1 and D=0.12 have been considered [16].

III. EFFECT OF EWH ON THE PROPOSED SYSTEM The function of EWH in the proposed system is to

The function of EWH in the proposed system is to maintain the active power balance in the hybrid system. Frequency deviation occurs due to the imbalance in the supply and demand. EWH play a significant role in managing this deficit along with power generating sources, thus suppressing the frequency deviations. The desired requirement is that, the supply error  $\Delta Pe$  and frequency deviation  $\Delta f$  should be zero. The controllers are employed to control the power consumption by EWH which is determined by using the amount of power imbalance and the frequency deviation.

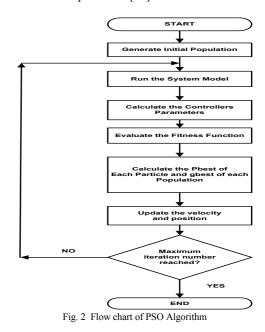
IV. PARTICLE SWARM OPTIMIZATION (PSO)

Particle Swarm Optimization is a population-based optimization technique inspired by the swarming or collaborative behavior of bird flocking and fish schooling, developed by Russell Eberhart and James Kennedy in 1995 [19]. The fitness function is a particular type of objective function to find the best solution from among all feasible solutions [1, 8]. The flow chart of PSO algorithm is shown in Fig. 2.

Several works has reported the PSO [1, 5, 19-21]. In the present paper PSO is used to optimize the parameters of the PI/PID controllers. Population size: 60;  $\omega$ max = 0.91;  $\omega$ min=0.88; C1 =0.12; C2 =1.2; Iteration: 60. In this paper, we consider Integral Square Error (ISE) of frequency deviation as the objective function (fitness function) [1].

$$ISE = \int \left(\Delta f\right)^2 dt \tag{7}$$

The fitness function is the objective function which is minimize to obtain the optimal parameters of PI/PID controllers. Steps for PSO based controllers' parameters optimization is explained in [22].



V. PID CONTROLLER

The PID controller is employed to enhance the dynamic performance by minimizing the frequency deviation of the system based in proportional, integral, integral and derivative terms. The derivative controller improves the transient response by adding a finite zero to the system while the integral controller reduces the steady-state error by adding a pole at the origins. The PID controller transfer function is [23]

$$C(s) = k_p + \frac{k_i}{s} + k_d s \tag{8}$$

where  $K_p$ ,  $K_d$  and  $K_i$ , represents the gains of coefficients for the proportional, integral, and derivative terms, respectively

### VI. SIMULATION RESULTS AND ANALYSIS

Here, simulations are carried out consisting of PV-DEG-EWH-BESS system using time domain analysis. The dynamic responses of the simulations under random generation and load demand have been presented. The parameters of PI/PID controllers has been tuned using PSO technique. Table I shows the gains of PI and PID controllers obtained through PSO technique.

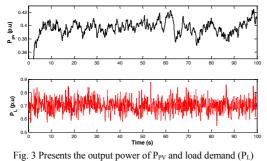
### A. Controllable load

EWH and battery used in this system are considered as controllable loads. EWH is used to suppress the system frequency by providing active power control. BESS is used for providing power during peak time as well as acts as backup source [24].

# B. Time-Domain Analysis

In this section, time-domain analysis of the proposed hybrid power system under random load and generating conditions of supply and demand conditions are carried out. There occurs fluctuation in system frequency due to the intermittent output power from solar photovoltaic and stochastic variation in load demand. This deviation in frequency is mitigated by PI/ PID controllers. The controllers adjust the output power of the generating units automatically so as to maintain the balance between the active power generation and demand.

Here, the dynamic performance of the proposed system is investigated when subjected to randomly variable characteristics in  $P_{PV}$  and  $P_L$ . Fig. 3 presents the  $P_{PV}$  and load demand ( $P_L$ ).



Variations in load demand and  $P_{PV}$  cause the controllers to adjust the output power of the BESS, DEG and EWH so that frequency deviancy is minimized and base frequency the system is restored. Fig. 4 and Fig. 5 represents the output power of BESS and DEG with and without PI and PID controllers while Fig. 6 accounts for the power consumption of EWH with PI and PID controllers.

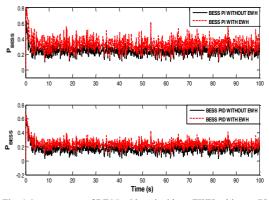


Fig. 4 Output power of BESS with and without EWH subject to PI and PID controllers

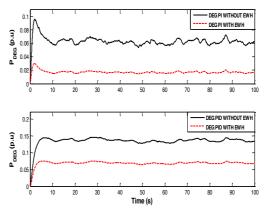


Fig. 5 Output power of DEG, with and without EWH subject to PI and PID controllers

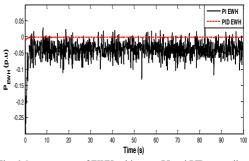


Fig. 6 Output power of EWH subjects to PI and PID controllers

Fig. 7 and Fig. 8 shows the transient response of frequency deviation observed with PSO optimized PI and PID controllers respectively. Fig. 9 shows the convergence plots of objective function value versus iteration for with PSO optimized PI and PID controllers. The gain values of PI and PID controllers that were optimized with PSO technique are given with and without EWH are presented in Table II and Table III.

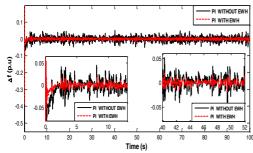


Fig. 7 Transient response of frequency deviation observed with PSO optimized PI controller

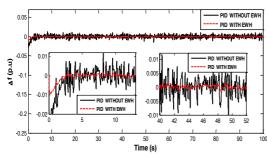


Fig. 8 Transient response of frequency deviation observed with PSO optimized PID controller

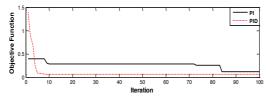


Fig. 9 The convergence plots of objective function value versus iteration for with PSO optimized PI and PID controllers

The simulation results as shown in the above figures show that the proposed PSO based PID controller is effectively able to suppress the frequency deviation as compared to PI controller for random variations in power generation and load.

The comparative performance of the hybrid with EWH vis-a-vis without EWH as shown in Fig. 8 and Fig. 9 demonstrates that that hybrid system with EWH performs better than the hybrid system without EWH in mitigating frequency fluctuations.

TABLE II. Gain values of PSO optimized PI controller with and

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without EWH					
Case	WITH	WITHOUT			
	EWH	EWH			
$K_p DEG$	994.41	1088			
$K_i DEG$	260.73	255			
$K_p EWH$	10.11	-			
$K_i EWH$	2	-			
$K_p BESS$	9199.68	2199.55			
$K_i BESS$	5006.01	1012.29			

TABLE III.	Gain values	of PSO	optimized PID	controller with

and without EWH					
Case	WITH EWH	WITHOUT EWH			
$K_p DEG$	1987.45	1846.64			
$K_i DEG$	1289.28	1301.25			
$K_d DEG$	29.87	33			
$K_p EWH$	10	-			
K <sub>i</sub> EWH	1.5	-			
$K_d EWH$	1.01	-			
$K_p BESS$	19991.58	6978.43			
$K_i BESS$	8088.70	1597.04			
$K_d BESS$	3401.91	150.79			

### VII. CONCLUSION

The paper investigates the use of PI/PID controller for suppressing the system frequency deviation by using controllable load in an isolated hybrid power system. The duo EWH and DEG reduce the high-frequency and low-frequency component of supply error in load and generator side respectively by using the PID controller. Simulation results show that the PID controller is better than the PI controller under the nominal operating condition and gives better robustness for the large parametric uncertainty of the proposed system. Therefore, the proposed PSO optimized PID controller can ensure the real power balance condition despite variations in power generated by solar PV and or change in load. Future work may be directed toward looking at analytical controller design methods for such hybrid power systems together with other meta-heuristic optimization algorithms like Ant Colony, Flower Pollination, etc.

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