



Hybrid PSO-HHO Optimal Control for Power Quality Improvement in Autonomous Microgrids

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ABSTRACT

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The focus on resilience, energy security, and renewable energy is increased. Hence the necessity of autonomous microgrids has become more prevalent. These autonomous microgrids can operate independently and provide stable energy to the users. The design and performance of an autonomous microgrid depends on the control system which will play a significant role in its ability to provide reliable and resilient energy. Hence to account this a hybrid PSO-HHO based optimal control strategy is proposed for power quality improvement. A test case of 3.5 kW PV based autonomous micro grid system is considered and implemented in MATLAB/Simulink. The proposed hybrid PSO-HHO based optimal control strategy is compared with PSO and HHO based optimal control strategies. The performance parameters such as PV maximum voltage PV_{vmax} , PV maximum current PV_{imax} , Voltage RMS V_{RMS} , Current RMS I_{RMS} , PV output power PV_{op} , Autonomous grid power A_{gp} , THD, Efficiency, Inverter Losses Inv_{loss} are evaluated in all the cases. The proposed hybrid PSO-HHO based optimal control strategy exhibited the mark improved performance.

1. INTRODUCTION

An autonomous microgrid is a type of power system that operates independently of the larger electrical grid. These systems usually utilize wind and solar power, as well as storage devices like batteries. They can provide sustainable and reliable power to communities. It utilizes advanced control systems to manage its energy consumption and supply balance. Some of the advantages of an autonomous microgrid include increased energy security, better resilience against power outages, reduced carbon emissions and peak demand charges, and avoidance of costly upgrades to the electrical grid [1, 2].

These types of systems are particularly useful in areas where there is a lack of access to reliable power. They can be utilized to provide local power to military bases, hospitals, and data centres. Despite the advantages of autonomous microgrids, they still face various challenges when it comes to their development and deployment. Some of these include the need for efficient and cost-effective energy systems, the complexity of their operation, and the regulatory obstacles they can face [3-5]. Control of autonomous micro grid is one of the complex system. Hence to reduce the complexity optimal controllers are required.

Autonomous microgrids have numerous applications and case studies as shown below:

- Remote Communities and Islands
- Military Installations and Forward Operating Bases
- Emergency Response and Disaster Management
- Industrial and Commercial Applications
- Rural Electrification and Developing Regions
- Smart Cities and Urban Developments

2. LITERATURE REVIEW

The study [6] presented a decentralized secondary controller that can be used in autonomous microgrids to provide accurate power sharing and frequency regulation. It does not require a communication network. Frequency based optimal control strategy is presented in the study [7]. The study [8] proposed a cost-effective hybrid control approach that can achieve both stability and optimal operation in an autonomous microgrid. The influence of the cost-based schemes on the stability of the system is studied using a small-signal model. The study [9] proposed a resilient and robust distributed optimal control scheme for addressing cyber-attacks. The study [10] presented a novel formulation for determining the optimal droop type and characteristic. The study [11] proposed a multi-agent reinforcement learning approach that can learn the optimal policy for a microgrid without the complexity of system modelling. A game based multi agent approach for energy management is presented in the study [12]. The paper [13] presented a decentralized power flow model that takes into account the multiport control strategy of PET for running AC/DC hybrid microgrids. The research [14] presented an optimal control scheme for an isolated DC microgrid with a composite load and multiple sources.

The study [15] presents an extensive analysis of the literature on the subject of droop-controlled microgrids. It includes a critical evaluation of over 150 studies. The study [16] aims to improve the island-level microgrid's frequency resilience by implementing the virtual inertia control method. Related studies are also presented in the study [17-21]. The recent literature lacks in hybrid optimal control strategies for autonomous micro grids. Hence to account this a hybrid PSO-HHO based optimal control strategy is proposed for power

quality improvement. The following are the numerous advantages of PSO-HHO over conventional optimal controllers

- Enhanced Exploration and Exploitation
- Improved Convergence Speed
- Handling Different Types of Optimization Problems
- Improved Solution Quality
- Reduced Risk of Getting Stuck in Local Optima

A test case of 3.5 kW PV based autonomous micro grid system is considered and implemented in MATLAB/Simulink.

The proposed hybrid PSO-HHO based optimal control strategy is compared with PSO and HHO based optimal control strategies. The performance parameters such as PV maximum voltage (PV_{vmax}), PV maximum current (PV_{imax}), Voltage RMS (V_{RMS}), Current RMS (I_{RMS}), PV output power (PV_{op}), Autonomous grid power (A_{gp}), THD, Efficiency, Inverter Losses (Inv_{loss}) are evaluated in all the cases. The proposed hybrid PSO-HHO based optimal control strategy exhibited the mark improved performance.

3. HYBRID PSO-HHO OPTIMAL CONTROLLER

In this paper hybrid PSO-HHO based optimal control scheme is proposed as shown in Figure 1. In this control scheme the voltage and current controller gain values are tuned by using hybrid PSO-HHO algorithm based on Integral Time Absolute Error (ITAE) as shown in the following:

$$\text{Integral Time Absolute Error (ITAE)} = \int_0^t t|e(t)|dt$$

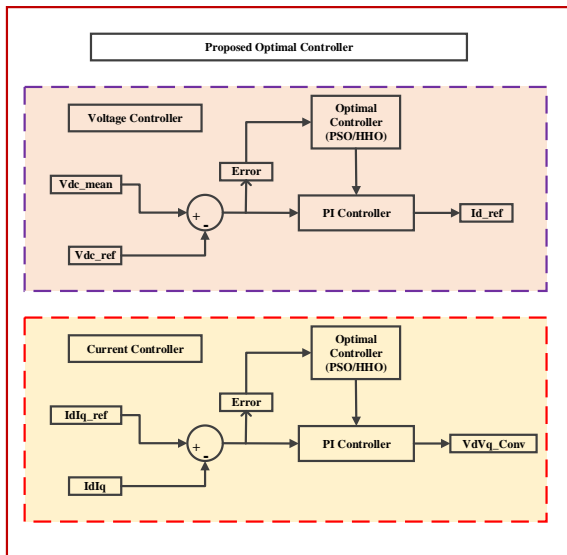


Figure 1. Proposed hybrid PSO-HHO Optimal Controller

The flow chart of the proposed hybrid PSO-HHO Optimal Controller is presented in Figure 2.

4. RESULTS AND DISCUSSIONS

In this paper a hybrid PSO-HHO based optimal control strategy is proposed for power quality improvement. A test case of 3.5 kW PV based autonomous micro grid system is considered and implemented in MATLAB/Simulink under the following cases:

- PSO based Optimal Controller
- HHO based Optimal Controller
- Proposed PSO-HHO Optimal Controller

4.1 PSO based Optimal Controller

In this case the voltage and current controller gain values are tuned using PSO algorithm under Standard Test Condition (Solar Irradiance is 1000 w/m² and Ambient Temperature is 25°C) and Variable Test Condition (At time period 0s, 0.9s Solar Irradiance is 1000 w/m², 800 w/m² and Ambient Temperature is 25°C, 35°C respectively). The PSO parameters are tabulated in Table 1.

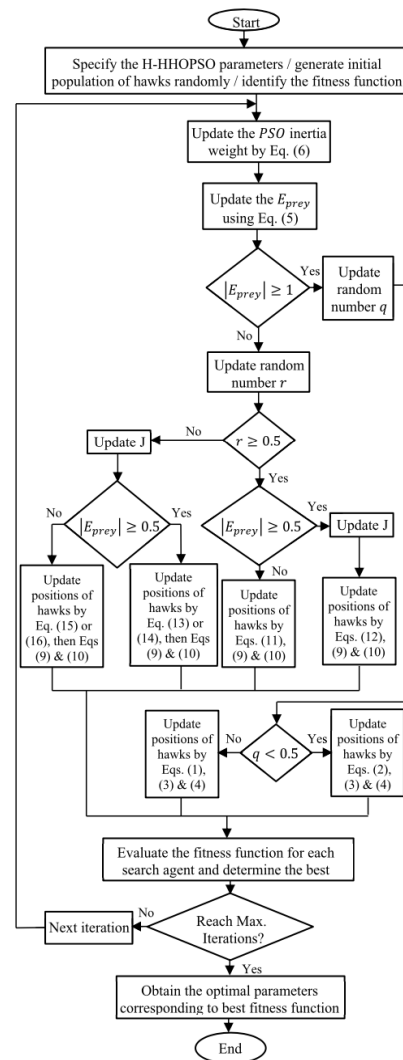


Figure 2. Flow chart of PSO-HHO Optimal Controller

Table 1. PSO parameters

Parameter	Value
Population (swarm) Size	50
Iterations	200
Constant C ₁	0.5
Constant C ₂	1.25
Weight W	1
Velocity V	10

The gain values obtained for Voltage controller are K_{pv} is 1.5016, K_{iv} is 3.2419, Similarly the gain values obtained for

Current controller are K_{pc} is 0.6277, K_{ic} is 3.5928. By using these gain values the following are the performance parameters obtained and tabulated in Table 2.

Table 2. Performance parameters

Performance Parameter	STC	VTC
PV_{vmax}	433.8 V	401.5 V
PV_{imax}	8.05 A	6.624 A
V_{RMS}	239 V	238.9 V
I_{RMS}	14.41 A	10.27 A
PV_{op}	3492.09 W	2659.536 W
A_{gp}	3433.99 W	2453.503 W
η	98.62%	92.25%
Inv_{loss}	1.377399%	7.746953%

The THD using PSO controller is 3.22% as shown in Figure 3.

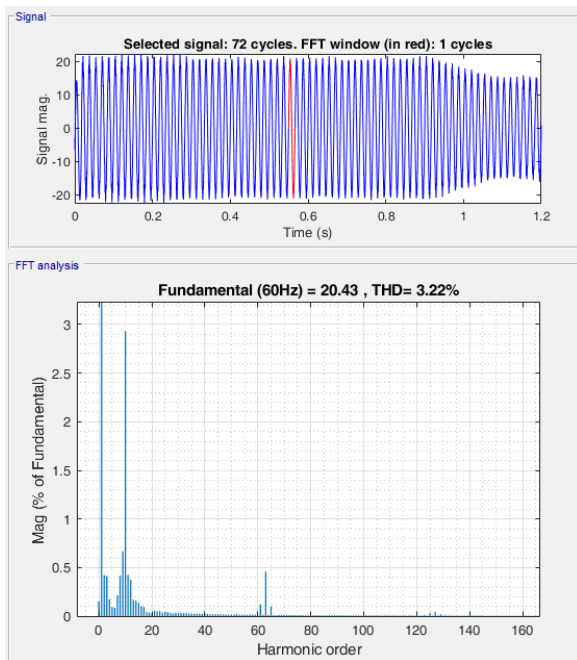


Figure 3. THD Analysis using PSO controller

4.2 HHO based Optimal Controller

In this case the voltage and current controller gain values are tuned using HHO algorithm under Standard Test Condition (Solar Irradiance is 1000 w/m^2 and Ambient Temperature is 25°C) and Variable Test Condition (At time period 0s, 0.9s Solar Irradiance is 1000 w/m^2 , 800 w/m^2 and Ambient Temperature is 25°C , 35°C respectively). The HHO parameters are tabulated in Table 3.

Table 3. HHO parameters

Parameter	Value
Size of the Hawks	50
Iterations	200
convergence probability r	0.5
r1, r2, r3, r4	0 - 1

The gain values obtained for Voltage controller are K_{pv} is 1.5104, K_{iv} is 3.2812, Similarly the gain values obtained for Current controller are K_{pc} is 0.5916, K_{ic} is 3.5896. By using these gain values the following are the performance parameters obtained and tabulated in Table 4.

Table 4. Performance parameters

Performance Parameter	STC	VTC
PV_{vmax}	433.8 V	401.5 V
PV_{imax}	8.05 A	6.624 A
V_{RMS}	239 V	238.9 V
I_{RMS}	14.47 A	10.31 A
PV_{op}	3492.09 W	2659.536 W
A_{gp}	3458.33 W	2463.059 W
η	99.03%	92.61%
Inv_{loss}	0.966756%	7.387642%

The THD using HHO controller is 2.31% as shown in Figure 4.

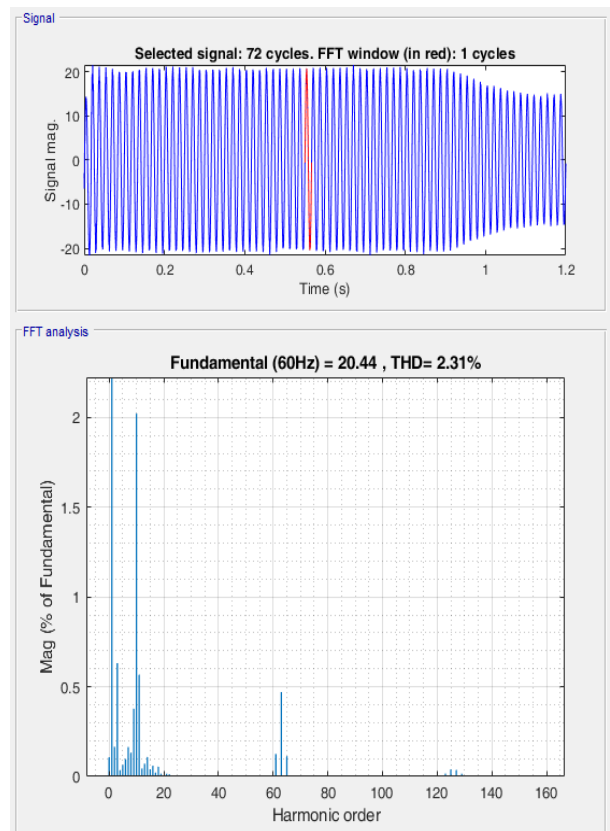


Figure 4. THD Analysis using HHO controller

4.3 Proposed PSO-HHO based Optimal Controller

In this case the voltage and current controller gain values are tuned using PSO-HHO algorithm under Standard Test Condition (Solar Irradiance is 1000 w/m^2 and Ambient Temperature is 25°C) and Variable Test Condition (At time period 0s, 0.9s Solar Irradiance is 1000 w/m^2 , 800 w/m^2 and Ambient Temperature is 25°C , 35°C respectively). The PSO-HHO parameters are tabulated in Table 5.

Table 5. PSO-HHO parameters

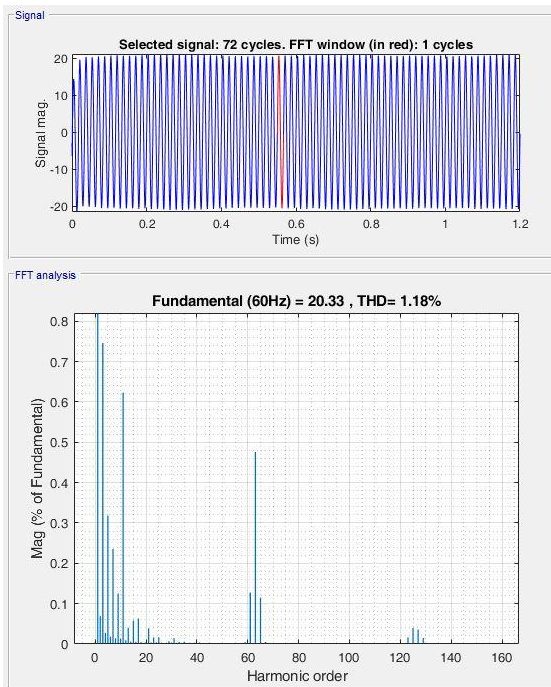
Parameter	Value
Population (swarm) Size	50
Iterations	200
Constant C_1	0.5
Constant C_2	1.25
Weight W	1
Velocity V	10
Size of the Hawks	50
Iterations	200
convergence probability r	0.5
r_1, r_2, r_3, r_4	0 – 1

The gain values obtained for Voltage controller are K_{pv} is 1.1126, K_{iv} is 3.9712, Similarly the gain values obtained for Current controller are K_{pc} is 0.2916, K_{ic} is 4.1782. By using these gain values the following are the performance parameters obtained and tabulated in Table 6.

Table 6. Performance Parameters

Performance Parameter	STC	VTC
PV_{vmax}	433.8 V	401.5 V
PV_{imax}	8.05 A	6.624 A
V_{RMS}	239 V	238.9 V
I_{RMS}	14.56 A	10.41 A
PV_{op}	3492.09 W	2659.536 W
A_{gp}	3479.84 W	2486.949 W
η	99.65%	92.61%
Inv_{loss}	0.350793%	6.9397%

The THD using PSO-HHO controller is 1.18 % as shown in Figure 5.

**Figure 5.** THD Analysis using PSO-HHO controller

5. CONCLUSIONS

In this paper hybrid PSO-HHO based optimal control strategy for power quality improvement is presented. Detailed literature on autonomous microgrids is reviewed. A test case of 3.5 kW PV based autonomous micro grid system is considered and implemented in MATLAB/Simulink. The proposed hybrid PSO-HHO based optimal control strategy is compared with PSO and HHO based optimal control strategies. The performance parameters such as PV maximum voltage (PV_{vmax}), PV maximum current (PV_{imax}), Voltage RMS (V_{RMS}), Current RMS (I_{RMS}), PV output power (PV_{op}), Autonomous grid power (A_{gp}), THD, Efficiency, Inverter Losses (Inv_{loss}) are evaluated in all the cases. The proposed hybrid PSO-HHO based optimal control strategy exhibited the mark improved performance.

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