Enhancing load frequency control of multi-area multi-sources power system with renewable units and including nonlinearities

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Article Info ABSTRACT Article history: The foremost aims of the Load Frequency Control (LFC) is to maintain

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The foremost aims of the Load Frequency Control (LFC) is to maintain the frequency at nominal value and minimize the unscheduled tie line power flow between different control areas. The penetration of renewable energy sources into the grid is a recent challenge to the power system operators due to their different modelling rather than conventional units. In this paper, enhancing load frequency control of multi-area multi-sources power system with nonlinearities including renewable units is proposed using a new application of proportional-integral-derivative controller with proportional controller in the inner feedback loop, which is called as PID-P controller. To investigate the performance of the proposed controller, a thermal with reheater, hydro, wind and diesel power generation units with physical constraints such as governor dead band, generation rate constraint, time delay and boiler dynamics are considered. The proposed controller parameters are optimized using different heuristic optimization techniques such: Linearized Biogeography-Based Optimization technique, Biogeography-Based Optimization technique and Genetic Algorithm. The ability of the system to handle the large variation in load conditions, time delay, participation factors, and system parameters has been verified comprehensively.

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1. INTRODUCTION

LFC is established to act during small and slow changes in real power and frequency. In a controllable area, LFC monitors the system frequency and tie-line power flows, computes the total change in the required generation (referred to area control error ACE) and changes the set point of the generation units within the area to save the average time of the ACE at a small value. Therefore, ACE, which reflects the integration of power net-interchange and frequency deviation, is considered as the controlled output of LFC, as both tie-line power and frequency errors will be enforced to zero when the ACE is driven to zero by the action of LFC [1].

Generally, numerous studies [2-9] have been carried out to improve the performance of LFC schemes; starting from classical control systems to modern control theories. It was deduced that most of the conventional controllers perform adequately at an operating point at which the controllers are designed but their performance may be dramatically changed when there is a large change in the operating point or system parameters [10]. Thus, hybrid control structure can be regarded as one of the most promising solutions to solve such limitations as deduced in [11-13].

Many researchers have concluded that fuzzy logic controller as mentioned in can improve the closed loop performance of I/PI/PID controllers and handle any changes in operating point or in system parameters by online updating of the controller parameters [14]. In [15], the frequency stability of power systems has been improved by the participation of high-penetration of wind power in grid frequency control, with the account in mind the both area are identical and the nonlinearities has been neglegted. Moreover, it is also observed from different research studies that the performance of the power system does not only depend on the artificial techniques employed but also on the controller structure and objective fitness function.

Recently, with the global trend toward the renewable resources, and with the ascending level of renewable energy units penetration into the grid, new research area is raised to test the performance of the different LFC schemes against different participation factors and system parameters. Therefore, authors believe that there is still much room for developing efficient LFC schemes. Thus, the main contribution of this paper is to validate the superiority of PID-P controller as a new application in the field of load frequency control of multi-area multi-sources power system in presence of both conventional and renewable units with taking into consideration the physical constraints and nonlinearities.

The controller parameters have been optimized using several recent optimization algorithms: Genetic Algorithm (GA), Biogeography-Based Optimization (BBO) and Linearized Biogeography-Based Optimization technique (LBBO) techniques while the integral time multiplied absolute error (ITAE) is the objective function. To examine the roubstness of the proposed controller, a thermal with reheater, hydro, wind and diesel power generation units with physical constraints such as governor dead band (GDB), generation rate constraint (GRC), time delay and boiler dynamics are considered. System modeling is developed in MATLAB/SIMULINK environment.

2. RESEARCH METHOD

As a matter of fact, PID controller is widely used due to its simplicity and robustness. On the other hand, it is inherently difficult to control the integrating process within it efficiently [16]. In [17], a PID-P controller has been proposed to overcome the structural limitation of PID controller in controlling integrating and unstable process. The structure of PID-P controller is illustrated in [10]. For such structure, an inner feedback loop with P controller is used to convert the unstable open loop or integrating process to open loop stable process, and then the PID controller can control the overall open loop stable process.

To validate the capabilities of the optimized PID-P controller, two unequal areas with conventional and renewable units including nonlinearities are considered as shown in Figure 1. Area-1 consists of reheat thermal, hydro and wind power plants while area-2 consists of reheat thermal, hydro and diesel power plants. In the following, all symbols and parameters of such tested power system are defined, while the assigned values for system parameters are given in Appendix.

i	Area notation and takes 1 or 2.	U_{TH}	Control output of thermal unit.
B_i	Frequency bias constant.	U_{HY}	Control output of hydro unit.
R _i	Governor speed regulation parameter of area i (Hz/p.u MW).	$\boldsymbol{U}_{\boldsymbol{W}}$	Control output of wind unit.
T _{gi}	Speed governor time constant (sec).	$\boldsymbol{U}_{\boldsymbol{D}}$	Control output of diesel unit.
$\Delta \tilde{F}_i$	Frequency deviation (Hz).	T_{12}	Synchronizing coefficient.
T_{psi}	Power system time constant (sec).	K_r	Steam turbine reheat constant.
K _{psi}	Power system gain.	T_r	Steam turbine reheat time constant (sec).
ΔP_{Di}	Load demand change (p.u).	T_W	Normal starting time of water in penstock (sec).
ACE _i	Area control error.	T _{RS}	Hydro turbine speed governor reset time (sec).
T _{ti}	Turbine time constant (sec).	T _{RH}	Hydro turbine speed governor transient droop time constant (sec).
$\Delta \boldsymbol{P}_{tie}$	Change in tie line power flow (p.u).	T _{GH}	Hydro turbine speed governor main servo time constant (sec).



Figure 1. Transfer function model of multi-area multi-source power system with nonlinearities

The constraints that affect the power system performance such as generation rate constraint (GRC), governor dead band (GDB) and time delay are also included. Besides, boiler dynamics configuration is considered in thermal plants to generate steam under pressure where changes in the steam flow and deviations in pressure are sensed and the turbine control valves and boiler control introduce the resultant action. Furthermore, reheat turbine is included in this study as an effective nonlinearity. The block diagram of boiler dynamics configurations is illustrated in Figure 2 [18]. The assigned values for boiler dynamics parameters are shown in Appendix.



Figure 2. Transfer function model of boiler dynamics

It is worth mentioning that most of the published research studies didn't take into consideration the impact of all physical constraints and nonlinearities mentioned before. For example, in [19, 20] the effect of delay time in the system performance has been neglected, while in [21], the physical constraints and nonlinearities have been completely ignored. In [22], only reheat turbine as nonlinearity has been included. In [23], only GRC as a physical constraint has been considered while in [12], the effect of GRC and GDB has been investigated. In [24], the effect of reheat turbine, GRC and delay time has been studied without consideration of other nonlinearities and physical constraints. It is worthy to say that combining of all aforementioned physical constraints and nonlinearities may be considered a new area of research bearing in mind renewable energy resources.

It is noteworthy that the participation factors for different plants are assumed as in [18]. So, factors of 0.575 and 0.3 are assigned to thermal and hydro plants respectively while a factor of 0.125 is considered for both wind and diesel units. In the present investigation, a dead band nonlinearity of 0.05% is considered for the thermal plant and 0.02% for the hydro plant. A GRC of 3% per minute is considered for thermal units while considering 270% per minute for the hydro unit to raising generation and 360% per minute to lowering generation [18]. As well, to measure the reliability, efficiency, and robustness of the optimized PID-P controller implemented in the LFC scheme of the proposed power system, five test procedures are applied.

3. PERFORMANCE EVALUATION

3.1. First Test Procedure: 1% Step Load Increase in Area-1

To investigate the dynamic performance of the selected controller, a step load increase of 1% is applied in area-1. The controller parameters are optimized using GA, BBO and LBBO as optimization techniques and (ITAE) as an objective function as discussed before. The obtained controller parameters $(K_{P1}, K_i, K_d, K_{P2})$ for the three optimization techniques are shown in Table 1. The system dynamic responses for the optimized PID-P controller for the two areas are shown in Figure 3. It is observed that the LBBO tuned PID-P controller has the least settling time while the BBO tuned PID-P controller has the least overshoot where the absolute value of the peak is considered as an overshoot in this study regardless of its direction (overshoot or undershoot).

Table 1. Optimized parameters of PID-P controllers											
	Controller Parameters of Optimized PID-P for Area-1										
		Thermal unit Hydro unit						Wind unit			
	GA	BBO	LBBO	GA	BBO	LBBO	GA	BBO	LBBO		
K_{P1}	6.6055	0.0393	8.7836	1.7881	3.6204	6.5792	4.8085	25.2475	7.9714		
K _i	2.2142	4.7151	2.7111	1.7206	21.1854	0.5958	8.9051	7.3818	14.5213		
K_d	3.7526	19.7084	0.452	2.9945	17.7429	2.1061	2.457	8.0561	3.1253		
K_{P2}	1.4203	0.632	9.5214	2.2657	25.7295	6.3599	0.4899	9.8763	1.8951		
	Controller Parameters of Optimized PID-P for Area-2										
K_{P1}	1.4828	1.242	6.7454	1.8259	0.2568	13.254	6.1326	16.585	1.8852		
K_i	2.2934	0.3294	13.9548	4.1141	7.5174	1.4632	1.885	19.6848	0		
K_d	4.9281	14.3159	4.5611	1.9045	23.55	1.3941	0.27098	22.5798	0.17		
K_{P2}	1.6191	27.9625	4.5	1.1218	0.4567	0.669	2.9666	12.1444	2.0851		



Figure 3. Test system performance for 1% step load increase in area-1, (a) Change in frequency of area-1, (b) Change in frequency of area-2, (c) Change in tie line power

In addition, the achieved results are compared with some recently published studies in [18, 19] for the same power system as tabulated in Table 2. Such studies have tested some controllers tuned using Teaching Learning Based Optimization algorithm (TLBO) and Differential Evolution (DE). It is clear that the proposed optimized PID-P controller accomplishes better dynamic response with lesser settling time as compared to some other controllers.

Controllors	Settlin	g time (2% band	l)(sec)	Pe	Peak overshoot (p.u)		
Controllers	ΔF_1	ΔF_2	ΔP_{tie}	ΔF_1	ΔF_2	ΔP_{tie}	
DE tuned PID [18]	19.68	21.93	25.89	-	-	-	
TLBO tuned PID [17]	18.22	18.88	16.28	-	-	-	
TLBO tuned IDD [17]	17.95	18.72	13.01	-	-	-	
TLBO tuned PIDD [17]	16.14	16.79	12.77	-	-	-	
GA tuned PID-P	5.58	8.09	9.84	0.0065	0.0031	0.0008	
BBO tuned PID-P	5.04	7.04	9.08	0.0022	0.0006	0.0001	
LBBO tuned PID-P	4.54	5.17	9.7	0.0055	0.003	0.0006	

Table 2. Comparative study for applying 1% step load increase in area-1

3.2. Second Test Procedure: 30% Step Load Increase in Both Areas

A very large step load increase of 30% in both areas is applied to confirm the superiority of PID-P controller to wide change in operating conditions. Figure 4 depicts the performance dynamics of PID-P controllers without re-tuning the controllers' parameters. Table 3 provides a rich comparative study for the optimized PID-P controller using the three implemented optimization techniques. Based on the achieved results of Table 3, it is clear that the tested system has stable performance wherever the location and size of the disturbance change. Also, it can be deduced that the LBBO optimized PID-P controller has the best settling time while BBO optimized PID-P controller has the best overshoot.

3.3. Third Test Procedure: Sensitivity Analysis

The sensitivity analysis is carried out to investigate the ability of the controller to handle wide changes in operating conditions and system parameters without retuning the controller parameters. Taking one at a time, the operating load conditions, GRC, T_{RH} , T_{GH} , T_{RS} , T_T and R vary with $\pm 25\%$ from their nominal values. It is observed that, the system is stable in all cases and the effect of the variation in operating loading conditions and system time constants on the system performance can be neglected. For GA tuned PID-P controller, the maximum increasing in settling time is 0.92 sec for 25\% increasing in GRC while for BBO tuned PID-P is 1.3 sec for 25\% decreasing in GRC. For LBBO tuned PID-P controller, the corresponding maximum increasing in settling time is 2.59 sec for 25\% decreasing in droop characteristic R.

3.4. Fourth Test Procedure: Changing Participation Factors' Values

The performance of PID-P controller to wide change in participation factors without the need to re-tune the controller parameters is also investigated. To update the participation factors to the new values, two conditions are observed. The first one is that the participation factors must not be identical in the two areas and the second one is that the unit with the biggest participation factor must not be the same in the two areas. The updated participation factors for thermal, hydro and wind units in area-1 are changed to 0.3, 0.6, and 0.1 respectively while for thermal, hydro, diesel units in area-2 are assumed 0.7, 0.1, and 0.2 respectively. Then the dynamic performance of the proposed controller under such participation factors variation is tested as shown in Figure 5. It is obvious that the system has a stable performance with no need to re-optimize controller's parameters.

0.0056 0.0239



Figure 4. Test system performance for 30% step load increase in both areas, (a) Change in frequency of area-1, (b) Change in frequency of area-2, (c) Change in tie line power

Table 3. Comparative performance for applying 30% step load increase in both areas								
Controllors	S	ettling time (see	:)	Pe	Peak overshoot (p.u)			
Controllers	ΔF_1	ΔF_2	ΔP_{tie}	ΔF_1	ΔF_2	ΔP_{tie}		
GA tuned proposed PID-P	8.34	14	20.97	0.2	0.111	0.0191		
BBO tuned proposed PID-P	9.7	16.18	20.84	0.0673	0.0273	0.0056		
LBBO tuned proposed PID-P	9.74	8.45	13.88	0.1722	0.2295	0.0239		

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Figure 5. Test system performance for updated participation factors, (a) Change in frequency of area-1, (b) Change in frequency of area-2, (c) Change in tie line power

3.5. Fifth Test Procedure: Time Delay

Due to the growing complexity of power systems, communication delay may be a real challenge for LFC analysis as the time delay can degrade the system's performance and even cause system instability [25]. Meanwhile, a time delay of 0.5 sec is considered in area-1 [25] as it is more suitable for modern communication systems. The updated obtained GA & LBBO optimized PID-P controller parameters are shown in Table 4, while the dynamic performance of the proposed controllers is illustrated in Figure 6. It is also found that the BBO tuned PID-P controller could not keep up the stability of the system in the presence of this delay time. The inability of BBO to maintain the stability of the system in the presence of time delay may be due to the limitation of BBO as an optimization tool.

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	Controller Parameters of Optimized PID-P for Area-1								
	Therm	al unit	Hydr	o unit	Diesel unit				
	GA	LBBO	GA	LBBO	GA	LBBO			
K _{P1}	1.008	0.102	1.5072	0.1	8.6736	0.101			
Ki	1.0316	0.111	23.3141	0.246	16.5147	0.1001			
K_d	12.0384	0.1005	1.2203	0.2995	4.441	0.1007			
K_{P2}	7.9254	0.5085	2.9489	0.2959	10.9337	0.112			
		Controller	Parameters of Op	timized PID-P f	for Area-2				
K_{P1}	8.2759	0.1002	2.9499	1.942	1.2942	0.592			
Ki	1.4325	0.7604	23.1751	0.2565	6.3013	0.138			
K_d	19.7879	1.0293	20.0251	0.2681	13.0733	0.104			
K _{P2}	15.0634	1.1497	1.5023	0.2989	10.7218	0.1288			



Figure 6. Test system performance for 0.5 sec delay time, (a) Change in frequency of area-1, (b) Change in frequency of area-2, (c) Change in tie line power

The comparative analysis in Table 5 shows the ability of both GA tuned PID-P and LBBO tuned PID-P control to maintain the stability of the system in the presence of time delay with acceptable values of settling time and overshoot. It is also clear that the performance of proposed LBBO tuned PID-P control is better as it has lower settling time values rather than GA tuned proposed PID-P.

Table 5. Proposed PID-P performance for applying 0.5 sec delay time

Controllors	Settling time (sec)			Peak overshoot (p.u)		
Controllers	ΔF_1	ΔF_2	ΔP_{tie}	ΔF_1	ΔF_2	ΔP_{tie}
GA tuned proposed PID-P	21.43	24.85	21.38	0.0258	0.012	0.0077
LBBO tuned proposed PID-P	13.91	14.45	9.86	0.0259	0.0192	0.0045

4. CONCLUSION

In this paper, enhancing LFC of multi-area multi-sources power system including both renewable units and conventional units using a new application of PID-P controller is presented. Such LFC improvement takes into consideration the physical constraints and nonlinearities. The PID-P controller is evaluated for a multi-area multi-source including thermal with reheater, hydro, wind and diesel units. It is deduced that the PID-P controller has the same advantages of the PID controller plus the ability to overcome the PID controller structural limitation in the integration process by converting it to an open loop stable process via the internal feedback loop.

Different test procedures, including wide changes in system parameters, load conditions, participation factors and time delay, are applied to examine LFC enhancement using optimized tuned PID-P controllers. It is clear that, the LBBO tuned PID-P controller achieves significant improvement of 71.87%, 69.2% and 24.04% in the settling time for the frequency deviation in area-1, area-2 and tie line power flow respectively in the presence of 0.01 p.u step load increase in area-1 as compared to DE optimized PIDD controller as a recent published controller for such system. As a future work the performance of the selected controller can be investigated in the presence of FACTS controllers such as TCSC (Thyristor Controlled Series Compensation) and UPFC(Unified Power Flow Controller) also it can be integrated to a hybrid control strategy with artificial intelligence based controllers such as fuzzy ,reinforcement and neural network controllers.

APPENDIX

 $\begin{array}{l} R_{11} = B_{2} = 0.425 \ p. \ u \ MW \ /HZ \ ; \ R_{1} = R_{2} = R_{3} = R_{4} = R_{5} = R_{6} = 2.4 \ ^{HZ} \ /p. \ u \ ; \ T_{g1} = T_{g2} = 0.08 \ secT_{t1} = T_{t2} = 0.3 \ sec; \ a_{12} = -1; \ K_{r1} = K_{r2} = 0.333; \ T_{r1} = T_{r2} = 10 \ sec; \ T_{GH1} = T_{GH2} = 48.7 \ sec; \ Kps1 = Kps2 = 120 \ HZ \ /p. \ u \ MW \ ; \ Tps1 = Tps2 = 20 \ sec; \ T_{RS1} = T_{RS2} = 0.513 \ sec; \ T_{RH1} = T_{RH2} = 10 \ sec; \ T_{W1} = 1; \ K_{diesel} = 16.5 \ sec; \ K_{p1} = 1.25; \ K_{p2} = 1.4; \ T_{12} = 0.0866 \ p. \ u \ ; \ T_{p1} = 6; \ T_{p2} = 0.041 \ ; \ K_{1} = 0.85; \ K_{2} = 0.095; \ K_{3} = 0.92; \ K_{IB} = 0.03; \ T_{IB} = 26; \ T_{RB} = 6.9; \ C_{B} = 200; \ T_{D} = 0; \ T_{F} = 10. \end{array}$

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