

## Load frequency control of thermal system under deregulated environment using slime mould algorithm

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### ABSTRACT

This paper emphasizes the significance of proportional-integral-derivative (PID) controller parameters using a slime mould algorithm (SMA) to reduce load frequency control (LFC) issues in a thermal system in an open market scenario. The SMA is used to solve the parameterization of the PID controller, which was formulated as an optimization problem. The performance of the PID controller parameters improves the dynamic characteristics of the system as frequency in each area, and also deviations in tie line power after sudden load violation. In order to study the efficiency of the proposed method, the system was tested with different power transactions for a small load disturbance and the comparative results were presented. The optimal value of the controller parameters derived from SMA based PID controller is estimated using a finite nonlinear optimization using a performance index based method.

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## 1. INTRODUCTION

Each plant needs to monitor load fluctuations and ensure high quality power delivery to its customers throughout the day. Therefore, the same power cannot be supplied constantly, and the amount of power generated changes according to load fluctuations. The main purpose of the control scenario is to generate and supply power in such a stable and economical interconnected system, but keep the frequency and voltage of the power supply within significant limits. Since reactive power changes as the voltage changes, the frequency of the system changes primarily due to load disturbances. The main purposes of the LFC are; i) to keep frequency within acceptable range; ii) maintain a balance between power generation and load; iii) to keep the power deviations within the limit.

The vast grid of electrical systems is connected to many areas by connections. Network analysis of reconstructed networks faces the complexity of analysis due to its scaling. Sudden changes in the effect of the load on the system frequency can lead to uncertain and unstable operation. Therefore, plant working to maintain the load frequency variations is one of the major issues for Electrical Engineers. The problem with LFC is controlling the frequency and power bias between the correlation control elements [1], [2]. A very complex task is to ensure that the entire grid of the electrical system is in equilibrium due to the increasing

energy demand in the current scenario. The load is always different depending on the power system. The main purpose of LFC is to maintain the true energy balance of the electrical system. The frequency of the system is determined by the generator's mechanical input force. The frequency of the system is directly influenced by variations in power. The frequency must be kept within safe limits by the controller. This frequency error is amplified and delivered to the control unit, which then sends it back to the turbine's speed controller and electrical system network, operating according to block and additional reserves after major disturbance [3], [4].

Deregulation of the electricity industry is the restructuring of the rules and profit incentives established by the government to manage and operate the electricity industry. As part of the deregulation, utilities were abolished as a separate entity having power generation companies (GENCO), transport company (TRANSCO), and distribution company (DISCO). In this open market scenario, a central authority called the independent system operator (ISO) governs the spot market participants. In the real-time electricity market, most vertically integrated utility (VIU) ancillary services play various roles in a deregulated environment. The ancillary services should be implemented by ISO in different ways to explain certain problems such as bilateral contracts between controlled areas and policies of deregulation [5]-[10].

Many researchers anticipated various control methods for balancing the LFC problems. A conventional controller used in automatic generation control (AGC) is PID controller due to their simple construction, consistency and ample variety of applications which are explained in [11]-[16]. The non-linearities like governor dead band (GDB) and generation rate constraint (GRC) also affect the performance of the LFC [17]-[20]. Various soft computing techniques proposed for LFC problems [21]-[27].

## 2. MULTI AREA DEREGUATED SYSTEM

Figure 1 shows the block diagram representation of two area system under deregulation environment. Each area consists of two genco's and two discom's.

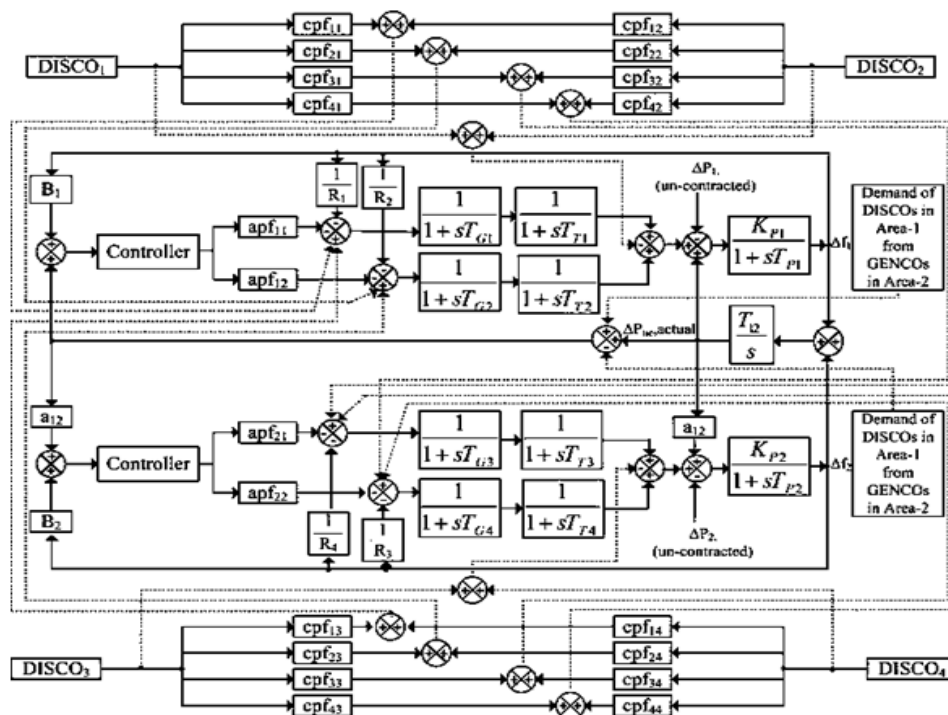


Figure 1. Diagram of two area system under deregulation

### 2.1. Traditional electric power system scenario

The traditional electricity market consists of utilities that own and operate their own electricity. From production to distribution, the public service has full control. Utilities own the infrastructure and power lines and sell them directly to consumers. Utilities must comply with the electricity tariffs set by each state

utility council. This type of market is often called a monopoly due to limited consumer choice. However, its advantages include stable prices and long-term security.

## 2.2. Deregulation power system scenario

The term deregulation is the process of changing the rules and regulations that govern the electricity sector, allowing consumers to choose their electricity supplier. Free electricity market. This allows market participants to invest in power plants and transmission lines, allowing competitors to buy and sell electricity. Genco owners wholesale this electricity to retailers. Retail outlets set prices for consumers. In many cases, this makes profit for consumers by allowing them to compare prices and services from unlike third party providers and offering a special contract structure.

## 2.3. Disco participation matrix

The AGC system consists of two systems with equal area, i.e., thermal and hydro electric units. In each area there are two gencos and two discos. The coefficient of participation in the contract corresponds to the percentage of the total amount that DISCO j has concluded with GENCO i. The total number of entries in the column must equal to unity. Disco participation matrix is given by.

$$DPM = \begin{bmatrix} cpf_{11} & cpf_{12} & cpf_{13} & cpf_{14} \\ cpf_{21} & cpf_{22} & cpf_{23} & cpf_{24} \\ cpf_{31} & cpf_{32} & cpf_{33} & cpf_{34} \\ cpf_{41} & cpf_{42} & cpf_{43} & cpf_{44} \end{bmatrix} \quad (1)$$

## 3. SLIME MOULD ALGORITHM

The proposed algorithm (SMA) is a population-based heuristic algorithm proposed by Li *et al.* in 2020. This algorithm is inspired by the nature of the behavior of mould during oscillation movements. The basic design of this algorithm is shown in Figure 2 which is based on the optimal food path, using both positive and negative feedback systems. The molecule dynamically adjusts the search path to search for food quality. The SMA algorithm follows three main principles: grabble, wrap and approach. Grabble prevents other molecules from colliding during the food fishing process. The grab phenomenon shows the same velocity of viscous forms. The phenomenon of the approach shows that how to move towards the center of food.

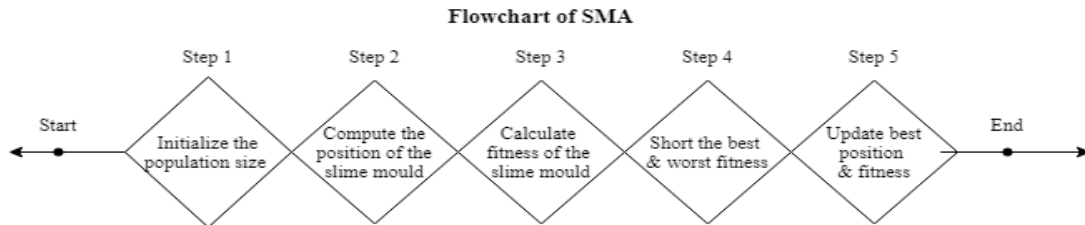


Figure 2. Flowchart of slime mould Algorithm

### 3.1. Step: 1 approach food

The impending behaviour of slime moulds as a mathematical equation to replicate the contraction mode:

$$\overrightarrow{X(t+1)} = \begin{cases} \overrightarrow{X_b(t)} + \vec{v}_b \cdot (\overrightarrow{W} \cdot \vec{X}_A(t) - \overrightarrow{X_B(t)}), r < p \\ \vec{v}_c \cdot \overrightarrow{X(t)}, r \geq p \end{cases} \quad (2)$$

$$p = \tanh|S(i) - DF| \quad (3)$$

$$\vec{v}_b = [-a, a] \quad (4)$$

$$a = \arctan h\left(-\left(\frac{t}{\max_t}\right) + 1\right) \quad (5)$$

The weight of the slime mould is.

$$\overrightarrow{W(smellIndex(i))} = \begin{cases} 1 + r \cdot \log\left(\frac{bF-S(i)}{bF-wF} + 1\right), condition \\ 1 - r \cdot \log\left(\frac{bF-S(i)}{bF-wF} + 1\right), other \end{cases} \quad (6)$$

$$SmellIndex = sort(S) \quad (7)$$

### 3.2. Step: 2 wrap foods

The equation for updating the position of the slime mould is:

$$\vec{X} = \begin{cases} rand.(UB - LB) + LB, rand < z \\ \vec{X}_b(t) + \vec{X}_b(t) \cdot (W \cdot \vec{X}_A(t) - \vec{X}_B(t)), r < p \\ \vec{v}_c \cdot \vec{X}(t), r \geq p \end{cases} \quad (8)$$

where lower bound LB is 0 and upper bound UB is 1.

### 3.3. Step: 3 grabble food

The value of  $\vec{vb}$  is given by the (4) and reaches to zero by increasing the iteration and  $V_c$  also having lower bound -1 and upper bound 1 and gradually comes to zero.

## 4. DESIGN OF CONTROLLERS

The PID controller is a reliable and simple controller that can deliver good control results. The proportional gain ( $K_p$ ), integral gain ( $K_i$ ), and derivative gain ( $K_d$ ) are the three primary parameters that must be determined while designing a PID controller. The integral square error (ISE) criterion is used as the objective function in this work for the paper.

$$J = ISE = \int_0^{t_{sim}} (\Delta f_1)^2 + (\Delta f_2)^2 + (\Delta P_{Tie})^2 \cdot dt \quad (9)$$

For each controller the minimum value will be considered as -2 and maximum value will be considered as 2.

## 5. RESULTS AND DISCUSSION

In this paper, two area deregulated multi-source power systems to determine the efficiency of the proposed PID controller. It also includes the effects of non-linear factors such as GRC and GDB. The main reason for the inclusion of GRC is that sudden changes in power attract steam to the turbine, which leads to condensation of steam due to diabatic expansion or contraction. The return steam produces small droplets of water that corrode the turbine blades in the event of a collision. This is a long-term process that can lead to serious problems. The GRC limit was set at 0.05%. Similarly, GDB is defined as the sum of speed changes without changing the position of the steam valve. The GDB limit is set at 0.06%. Various simulation studies are carried out to study the efficacy of LFC will be performed. The objective function is utilized to reduce LFC problems by using SMA, and then the performance of SMA-based PI, PID controllers is compared to GWO-based PI and PID controllers. The analysis of performance is done with reference to the percentage peak overshoot and settling time. The simulation results are carried out in different power transactions is being as.

### 5.1. Case 1: Pool CO-based transaction

A pool co-based transaction occurs when DISCOs share a load with any of the GENCOs in the same region. The area participation factor is 0.5 for four values that are assumed to be equal. Figure 3 (a) shows the deviation of frequency in area-1, Figure 3 (b) shows the deviation of frequency in area-2 and Figure 3 (c) shows the deviation of tie line power by using various SMA based and GWO based controllers. Table 1 shows that SMA based controller gives better results as compared to GWO based controller under pool co based transaction.

$$APF = \begin{bmatrix} 0.5 \\ 0.5 \\ 0.5 \\ 0.5 \end{bmatrix} \quad Disco = \begin{bmatrix} 0.1 \\ 0.1 \\ 0 \\ 0 \end{bmatrix} \quad p.u \ DPM = \begin{bmatrix} 0.5 & 0.5 & 0 & 0 \\ 0.5 & 0.5 & 0 & 0 \\ 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \end{bmatrix}$$

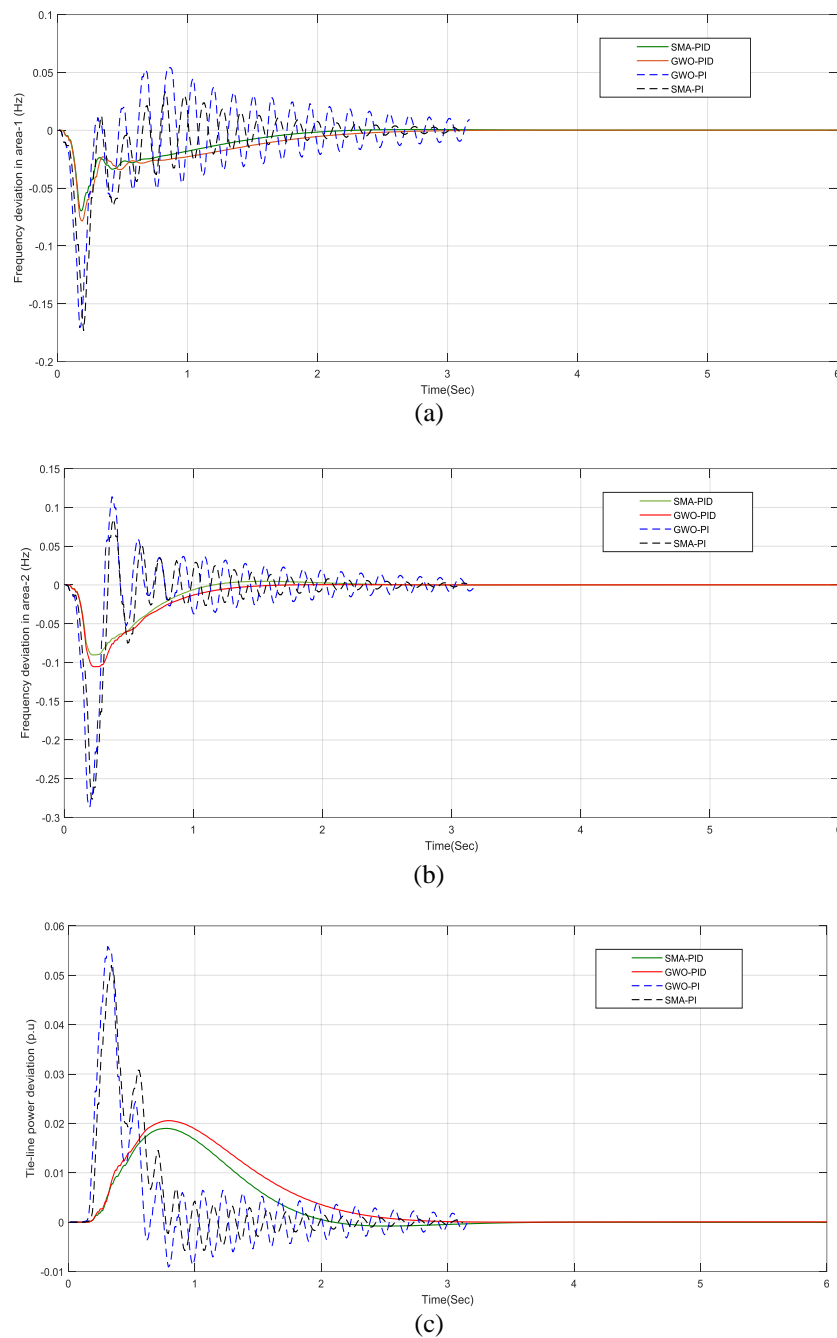


Figure 3. These figures are; (a) deviation of frequency in area-1, (b) deviation of frequency in area-2, (c) deviation of tie-line power under pool-co based transaction for 1% step load disturbance

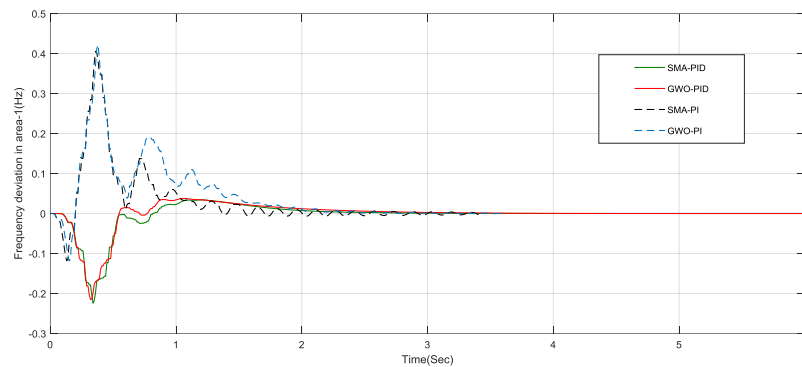
Table 1. Comparison of peak overshoot, undershoot, and settling time using various controllers under pool-CO based transaction

S. No	% Peak overshoot (p.u)			% Peak undershoot (p.u)			Settling time (Sec)		
	$\Delta f_1$	$\Delta f_2$	$\Delta P_{tie}$	$\Delta f_1$	$\Delta f_2$	$\Delta P_{tie}$	$\Delta f_1$	$\Delta f_2$	$\Delta P_{tie}$
GWO-PI	0.05	0.12	0.055	0.18	0.28	0.01	3.5	3.2	3.6
SMA-PI	0.04	0.08	0.053	0.16	0.26	0.009	3	3	3.2
GWO-PID	-	-	0.02	0.08	0.11	-	2.5	1.8	2.8
SMA-PID	-	-	0.018	0.06	0.09	-	1.8	1.1	2

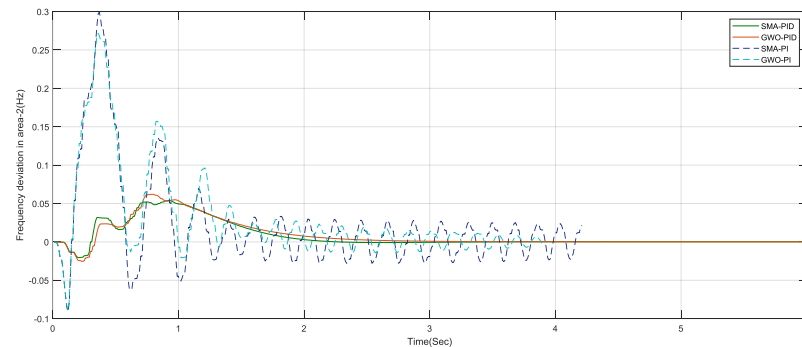
## 5.2. Case 2: Bilateral-based transaction

Bilateral based transactions occur when DISCOs share the load with any of the GENCOs in another location. The area participation factor is 0.75, 0.25, 0.5, and 0.5 for four values that are considered to be uneven. Figure 4 (a) shows the deviation of frequency in area-1, Figure 4 (b) shows the deviation of frequency in area-2 and Figure 4 (c) shows the deviation of tie line power by using various SMA based and GWO based controllers. Table 2 shows that SMA based controller gives better results as compared to GWO based controller under bilateral based transaction.

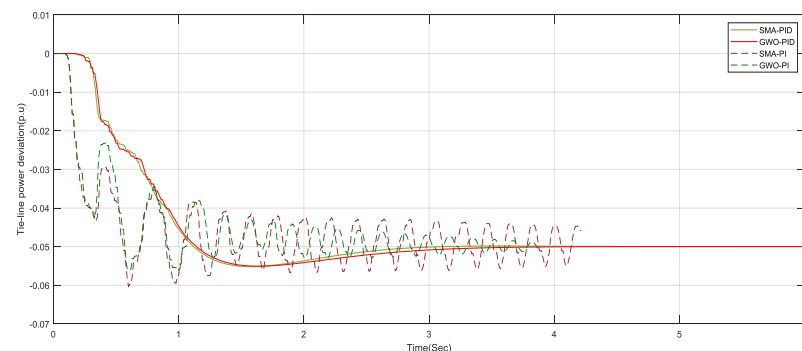
$$APF = \begin{bmatrix} 0.75 \\ 0.25 \\ 0.5 \\ 0.5 \end{bmatrix} \quad Disco = \begin{bmatrix} 0.1 \\ 0.1 \\ 0.1 \\ 0.1 \end{bmatrix} \quad p.u \text{ DPM} = \begin{bmatrix} 0.5 & 0.25 & 0 & 0.3 \\ 0.2 & 0.25 & 0 & 0 \\ 0 & 0.25 & 1 & 0.7 \\ 0.3 & 0.25 & 0 & 0 \end{bmatrix}$$



(a)



(b)



(c)

Figure 4. These figures are; (a) deviation of frequency in area-1, (b) deviation of frequency in area-2, (c) deviation of tie-line power under bilateral based transaction for 1% step load disturbance

Table 2. Comparison of peak overshoot, undershoot, and settling time using various controllers for bilateral based transaction

S. No	% Peak overshoot (p.u)			% Peak undershoot (p.u)			Settling time (Sec)		
	$\Delta f_1$	$\Delta f_2$	$\Delta P_{tie}$	$\Delta f_1$	$\Delta f_2$	$\Delta P_{tie}$	$\Delta f_1$	$\Delta f_2$	$\Delta P_{tie}$
GWO-PI	0.35	0.3	-	0.15	0.09	0.06	4.2	4.2	4.2
SMA-PI	0.33	0.26	-	0.14	0.08	0.057	3.8	3.8	3.9
GWO-PID	0.03	0.06	-	0.18	0.025	0.056	2.5	2.8	3.2
SMA-PID	0.02	0.05	-	0.16	0.02	0.055	2.2	2.1	2.3

### 5.3. Case 3: Contract violation

Contract violation occurs when the disco wants more electricity than the actual value, the contract is disrupted. There is no genco contracting out of this surplus electricity. This uncontracted electricity should be provided by a genco in the same area as the disco. Consider case-2, which requires additional power of 0.1 p.u MW to a disco 1. Figure 5 (a) shows the deviation of frequency in area-1, Figure 5 (b) shows the deviation of frequency in area-2 and Figure 5 (c) shows the deviation of tie line power by using various SMA based and GWO based controllers. Table 3 shows that SMA based controller gives better results as compared to GWO based controller under contract violation based transaction.

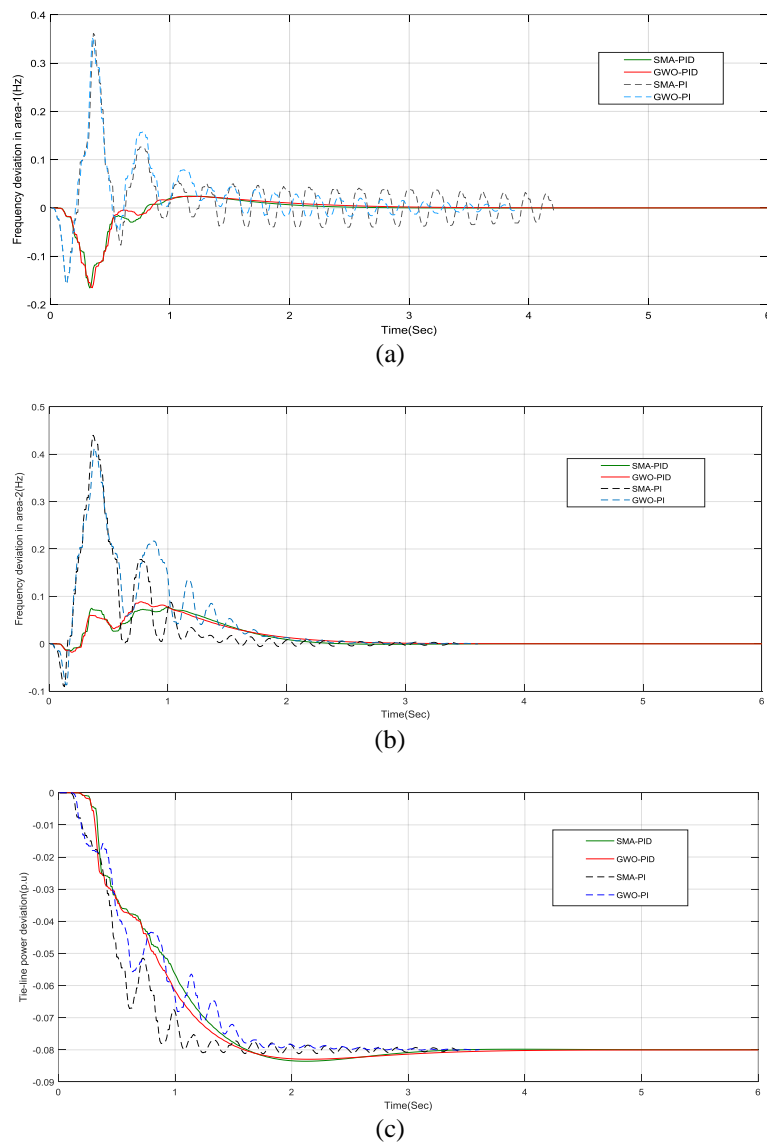


Figure 5. These figures are; (a) deviation of frequency in area-1,5, (b) deviation of frequency in area- 2; 5, (c) deviation of tie-line power under contract violation for 1% step load disturbance

Table 3. Comparison of peak overshoot, undershoot, and settling time using various controllers for contract violation based transacation

S. No	% Peak overshoot (p.u)			% Peak undershoot (p.u)			Settling time (Sec)		
	$\Delta f_1$	$\Delta f_2$	$\Delta P_{tie}$	$\Delta f_1$	$\Delta f_2$	$\Delta P_{tie}$	$\Delta f_1$	$\Delta f_2$	$\Delta P_{tie}$
GWO-PI	0.4	0.42	-	0.1	0.08	0.08	3.8	3.2	3.8
SMA-PI	0.38	0.4	-	0.08	0.07	0.08	3.2	2.8	3.6
GWO-PID	-	0.09	-	0.2	-	0.082	2.2	2.5	3.3
SMA-PID	-	0.07	-	0.2	-	0.082	2	2.3	3.1

## 6. CONCLUSION

This paper examines the performance of a PID controller in deregulated market structure for various transactions and contract violations. In the power system, load demand is a difficult challenge to solve since it requires the design of various optimum controllers. The main task of the controller is to ensure that the frequency is maintained and the voltage magnitude is constant at all times. The DPM approach is implemented. A comparison of the two controllers reveals that the SMA based PI, PID controller outperforms the GWO based PI, PID controller in terms of settling time, overshoot, and undershoot.

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