

A New Method for Estimation of Large Synchronous Generator Parameters by Genetic Algorithm

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Abstract: In this paper possibility of synchronous generator dynamic parameters estimation via On-Line Field Tests using Genetic Algorithm in a 400MVA synchronous generator in BISOTUN power plant in IRAN has been presented and simulated. On-Line (RTDR) time domain data are acquired by generator disturbance simulation. The direct and quadrature-axis dynamic parameters are found by processing the step response of the synchronous machine at rotating state. Genetic algorithm approach is employed to identify the desired parameters. This test procedure increases the required power and the testing time; but presents a good and reliable precision because of the high flux level and rotating condition.

Key words: Synchronous generator . Parameter estimation . On-line test . Genetic algorithm

INTRODUCTION

Generator modeling plays an important role in system planning, operation and post-disturbance analysis. Synchronous generator parameter estimation can be performed by two general methods: Standstill and Rotating Time Domain Response (RTDR) method.

Standstill testing in the time and frequency domains has gained rapid popularity, Owing to the simplicity of its implementation even on very large machines. It is still sometimes criticized for its excessively low levels of test currents, not to mention that the rotational effects of the coupling axes, the centrifugal force effects on damper windings and the magnetic saturation effects can not be observed during standstill [1, 2].

These limitations triggered the emergence of running time-domain response (RTDR) testing, based on small [3] or large signal disturbances around the nominal operating point. The genetic algorithm approach as an estimator is a new approach and in this paper it is used for synchronous machine parameters identification from time-domain response data. The purpose of this work is to present a new approach based on genetic algorithm identification of the synchronous machine parameters from time-domain on-line small-disturbance test, obtained by abruptly changing the reference voltage or torque. For this purpose small and large disturbances are introduced and small disturbances are simulated as a suitable disturbance to determine the dynamic

parameters of the synchronous generators in BISOTUN Thermal Power Plant. This paper consists of the following parts:

In section (II) BISOTUN Power Plant synchronous generator characteristics and its applied model is introduced ; section (III) presents RTDR method, Small and large disturbances and introduces a full algorithm for on-line methods, section (IV) outlines the applied genetic algorithm; in section (V) the results of simulation of small disturbances for BISOTUN Power Plant generator is shown; the full algorithm of on-line method is simulated in section (VI) and finally estimated and simulated results is shown for comparison.

SYNCHRONOUS GENERATOR CHARACTERISTICS AND ITS MODEL

The synchronous generators in BISOTUN Thermal Power Plant are round rotor turbo generators, which has been made by ANSALDO Company. The unit under study characteristic data is as follows:

Stator: 400 [MVA], 320 [MW], 20 [kV], 11547 [A], 50 [Hz], 3000 [rpm], 0.85 [Power Factor (lag)].

The Excitation System is Static and it injects current to the rotor with brushes. Because of non-saliency of the rotor shape and the high rotor speed the (2-2) model structure is considered for this generator [5]. The equivalent circuit model structure is shown in Fig. 1

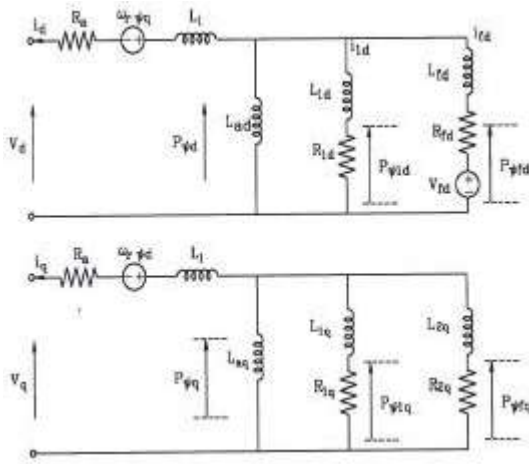


Fig. 1: Equivalent circuit model structure

RTDR METHOD AND ITS ALGORITHM

RTDR method is the method for synchronous machine parameter estimation from machine under disturbance around nominal operating point [1, 2]. The conventional on-line test for machine modeling involves large disturbance responses, such as synchronization, load rejection and line switching tests. Due to the large transient deviations resulting from these tests, the number and the type of the tests can be restricted by system stability concerns and power equipment considerations [3, 4, R.L.6]. On the other hand, recording the actual field operating data under small-scale disturbances doesn't constitute any significant effect on the overall operating status of the generating system. Therefore, it is desirable to construct and adjust the synchronous machine model parameters based on the machine small-disturbance responses. In this study, the test data are categorized as the machine small disturbance responses. The dynamics are generated by 1% and 2% changes in the excitation system reference voltage and input torque. Such testing can be operated under nominal operating conditions without any serious effect on the overall operating status of the system.

With the above explanation, the RTDR algorithm consists of three main steps.

For this method some signals must be acquired from machine under test (or from simulated machine under disturbance, these signals are: $V_a(t)$, $V_b(t)$, $V_c(t)$, $i_a(t)$, $i_b(t)$, $i_c(t)$, $\delta(t)$, $\omega_r(t)$, $\delta(t)$ is the power angle and $\omega_r(t)$ is the rotor speed signal. These two signals relates to each other to each other by equation (1) [5].

$$\delta(t) = \theta_r(t) - \theta_e(t) = \int_0^t (\omega_r(\tau) - \omega_e(\tau)) d\tau + \theta_r(0) - \theta_e(0) \quad (1)$$

The RTDR flowchart has been shown in Fig. 2

By measuring the quantities shown in Fig. 2, the d-and q-axis terminal voltages and currents, V_d ,

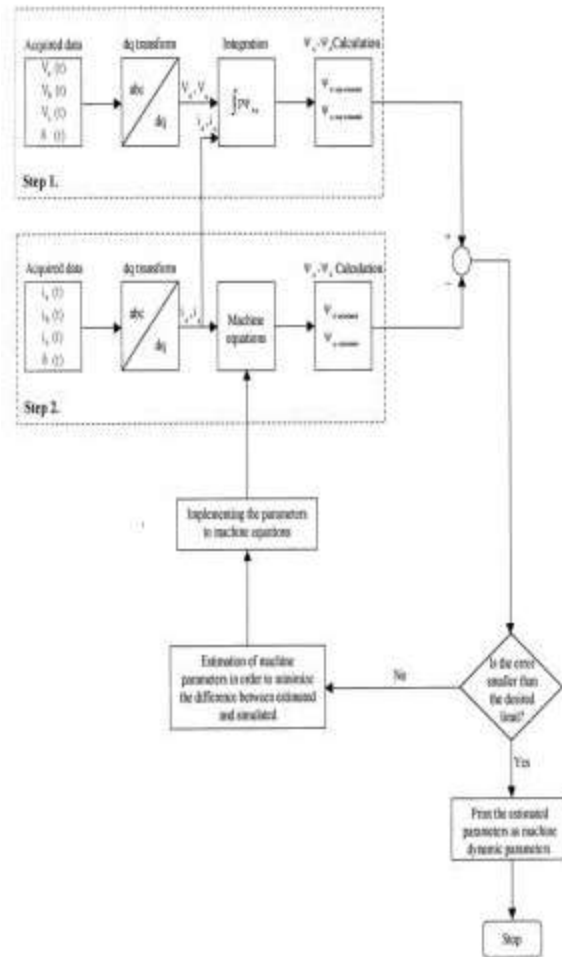


Fig. 2: RTDR method flowchart

V_q , i_d and i_q , can be obtained. Since the machine is connected to a large power system, with balanced conditions, the electrical frequency, ω , varies little from the rated line frequency. Therefore, instead of using the standard Park's transformation matrix, the following equations can be used [3, 6]:

$$\begin{cases} P(t) = I_a V_a b_a - I_c V_{bc} \\ Q(t) = (V_{ab} I_c + V_{bc} I_a + V_{ca} I_b) / \sqrt{3} \\ V_t(t) = \sqrt{\frac{V_{ab}^2 + V_{bc}^2 + V_{ca}^2}{4.5}} \\ I_t(t) = \sqrt{\frac{I_a^2 + I_b^2 + I_c^2}{1.5}} \\ V_d(t) = V_t \sin \delta; V_q(t) = V_t \cos \delta \\ i_d(t) = (P \sin \delta + Q \cos \delta) / (1.5 V_t) \\ i_q(t) = (P \cos \delta - Q \sin \delta) / (1.5 V_t) \end{cases} \quad (2)$$

As it has been shown in Fig. 2, The first main part of RTDR algorithm is to calculate ψ_d and ψ_q by integration from the measured (or simulated) data.

Since the machine is connected through the transformer to the power system, the derivatives of d-axis and q-axis flux linkages are ignored. This assumption is correct since the rate of change of the terminal voltage and current of the machine is negligible under small disturbance conditions. Therefore ψ_d and ψ_q can be calculated from the following equations:

$$\begin{cases} \psi_d = \frac{V_q + R_a i_q}{\omega_r} \\ \psi_q = \frac{-(V_d + R_a i_d)}{\omega_r} \end{cases} \quad (3)$$

The second part of this algorithm is calculating the ψ_d and ψ_q through synchronous machine model. Synchronous Machine Park's model as explained in section (2) is used for this part. i_d and i_q are also used as input signals for this part. By writing synchronous machine equations, ψ_d and ψ_q can be calculated from the following equations:

$$\begin{cases} \dot{\psi}_d = -x_d i_d + x_{ad} (i_{fd} + i_{ld}) \\ \dot{\psi}_q = -x_q i_q + x_{aq} (i_{1q} + i_{2q}) \end{cases} \quad (4)$$

For this purpose, rotor currents must be determined, So rotor currents are written according to rotor fluxes and stator currents. These equations have been written in appendix A; so the rotor fluxes can be calculated by solving the following state equations:

$$\begin{cases} P\psi_d = \omega_0 (V_{fd} - r_{fd} i_{fd}) \\ P\psi_{ld} = \omega_0 (-r_{ld} i_{ld}) \\ P\psi_{lq} = \omega_0 (-r_{lq} i_{lq}) \\ P\psi_{2q} = \omega_0 (-r_{2q} i_{2q}) \end{cases} \quad (5)$$

The above equations are in perunit values and P denotes d/dt .

ψ_d and ψ_q can be calculated by the method. Circuit parameters must be determined for the mentioned calculations. These parameters are estimated from the third main part of this algorithm. These parameters will be updated according to the difference between ψ_d and ψ_q in the steps 1 and 2. In this paper employing Genetic Algorithm does this estimation.

GENETIC ALGORITHM APPROACH AS THE IDENTIFICATION METHOD

To identify the dynamic parameters of the synchronous machine the genetic algorithm approach is implemented. This algorithm begins like any other optimization algorithm by defining the optimization parameters, the cost function and the cost. It ends like other optimization algorithms too, after convergence test. A path through the components of the genetic algorithm is shown as a flowchart in Fig. 3 [7].

For this study dynamic parameters $X_d, X_q, X'_d, X'_q, T'_{do}, T'_{qo}, T''_{do}, T''_{qo}$ are optimization parameters. The sum square error (SSE) and relative sum square error (RSSE) which are defined with equations (6) has been considered as costs.

$$\begin{cases} SSE = \sum_{i=1}^n (F_{actual} - F_{estimated})^2 \\ \%RSSE = \frac{SSE}{\sum_{i=1}^n F_{actual}^2} \times 100 \end{cases} \quad (6)$$

Where F is the flux in d- and q-axes. F_{actual} is the signal which is calculated in the first step of RTDR algorithm and $F_{estimated}$ is the output signal from the second step of RTDR algorithm and it is calculated from the estimated parameters.

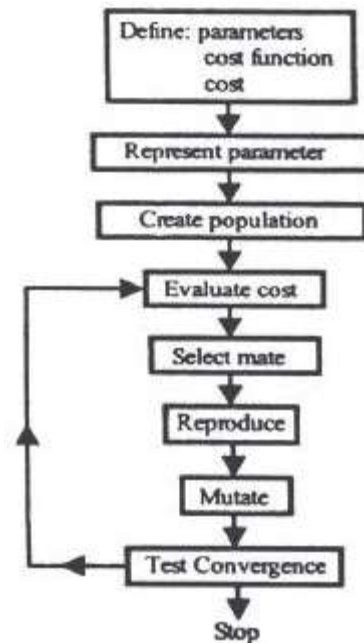


Fig. 3: Flowchart of a continuous genetic algorithm

Genetic algorithm begins by defining an initial population of N_{pop} chromosomes. A matrix represents the population with each row in the matrix being a $1 \times N_{parameterd,q}$ array (chromosomes) of continuous parameter values. Given an initial population of N_{pop} chromosomes, the full matrix of $N_{pop} \times N_{parameterd,q}$ random values is generated by the following equation [7].

$$IPOP_{d,q} = (hi_{d,q} - low_{d,q}) \cdot \text{random} \{N_{pop} \times N_{parameterd,q}\} + low_{d,q} \quad (7)$$

Where: $\text{Random} \{N_{pop} \times N_{parameterd,q}\} =$ a function that generates an $N_{pop} \times N_{parameterd,q}$ matrix of uniform random numbers between zero and one

hi: highest number in the parameter range

Low: lowest number in the parameter range.

This society of chromosomes is not a democracy. Each one's worth is assessed by the cost function. Then by sorting the initial population according to the minimum cost, N_{good} chromosomes which have the minimal costs are selected for mating and others will be go out. Assuming the crossover, mutation and other operators of genetic procedure are applied to the obtained population from previous step. Applying this procedure iteratively to the population improves the cost function; so the mutation probability is decreased exponentially after each iteration. In This study initial population is considered to be 100 chromosomes which are selected among 1000 ones. Probability of crossover (P_c) varies during the program eventually. The remind details will not be described for the sake of brevity. The convergence condition is achieving the SSE lower than 0.0001, i.e. $RSSE \leq 0.001$ which has been implemented in the optimization program.

SIMULATION OF ON-LINE METHOD FOR THE GENERATOR

The shape of an input signal, which is applied to a system for parameter estimation, must excite the different modes of the system (Persistently of exciting condition). White noise or Pseudo Random Binary Sequence (PRBS) are ideal for identification but generating of such signals need to special equipment. Meanwhile operators usually don't permit to apply these signals as input. It is known that step change is the easiest way to excite the dynamic modes of any system. These changes can be executed through excitation system (applying an external signal to voltage reference node in AVR, by unit transformer tap changing or operator increase or decrease command),

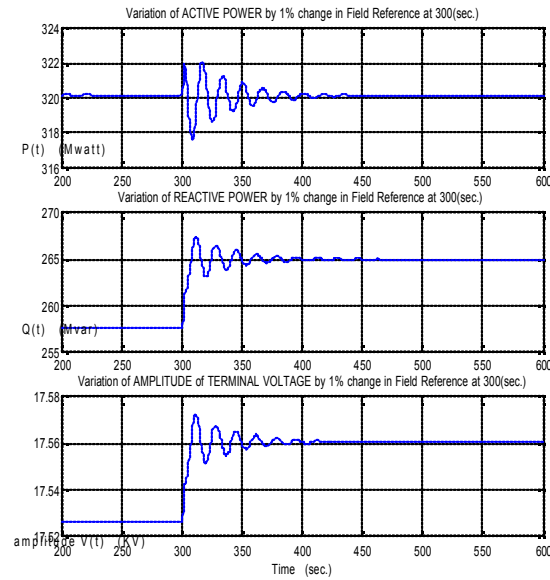


Fig. 4: Variations of machine outputs for 1% change in excitation reference voltage at $t=300$ (sec)

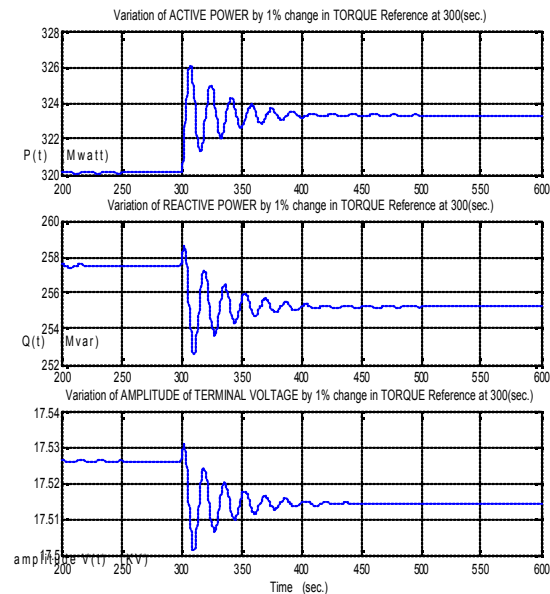


Fig. 5: Variations of machine outputs for 1% change in input torque $t=300$ (sec.)

Governor control system (increase or decrease for load demand) or load rejection. A test procedure which is safe to perform and don't require expensive equipment is step changing in voltage or load reference. This method has been simulated by 1% and 2% changes in the excitation reference voltage and input torque which are considered as input disturbance. To simulate the machine outputs, first the synchronous machine, which is connected to an infinite bus through a reactance, is

simulated. This simulation is done in SIMULINK. Since the rate of change of the terminal voltage and current of the machine is negligible under small disturbances, the derivatives of d- and q-axis flux linkages in machine model are ignored; so the network's model would have no electric transients and a phasor configuration can be assumed for it [8, 9].

The above mentioned disturbance can be simulated in the form of step changes in the operating conditions. These disturbances are implemented to the machine at the steady state operating conditions. Figure 4 and 5 show the changes of machine outputs by the above disturbances which are implemented to the generator at steady-state conditions at $t = 300$ second.

SIMULATION OF RTDR ALGORITHM AND ITS RESULTS

The full RTDR algorithm as explained in the above sections was simulated in MATLAB. To identify the machine parameters it is needed to implement Genetic Algorithm [7] to the input-output measured signals. These signals were obtained through simulations in section (V) via applying different small disturbance. These signals were obtained through simulations via applying different small disturbance. Figure 6 shows the simulated and estimated machine output (Fluxes) in d- and q-axis in various small disturbance conditions. Table 1 shows the simulated and estimated parameters in various disturbance conditions.

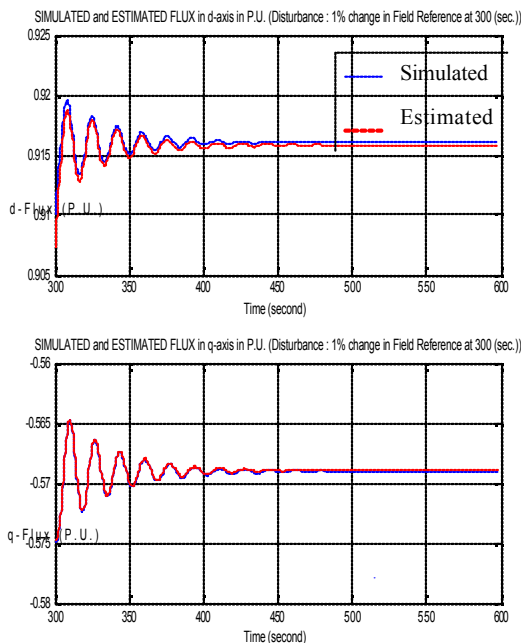


Fig. 6: Simulated and estimated fluxes in 1% change at field reference at $t=300$ (sec)

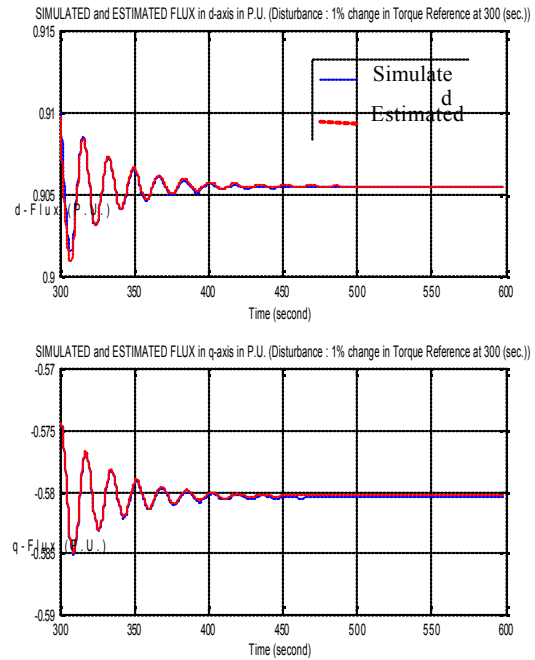


Fig. 7: Simulated and estimated fluxes in 1% change in input torque at $t=300$ (sec)

MODEL VALIDATION

Model Validation is the most important step in any identification procedure. The easiest way to validate a model is to compare the estimated model response to the simulated output. This strategy was selected to compare the output of the estimated model to the simulated (actual). As the figures show all estimated models are good enough. Another criterion to check the limits of the derived parameters are using the equation (8), which investigated for both axes.

$$\begin{cases} X_d \geq X_q > X'_d \geq X'_q > X''_d > X''_q \\ T'_{do} > T'_d > T''_{do} > T''_d \\ T'_{qo} > T'_q > T''_{qo} > T''_q \end{cases} \quad (8)$$

All estimated parameters fulfill the above limitations. Meanwhile Table 2 shows the parameters were found in the documents of the power plant.

Comparison of these values to the corresponding identified values, show the accuracy of the model.

CONCLUSION

In this paper, a dynamic test procedure for identification of machine parameters for BISOTUN Thermal Power Plant was presented. Employing small

Table 1: Simulated and estimated parameters in various disturbance conditions

	Real values	Estimated Parameters from 1% disturbance in field reference	Estimated Parameters from 2% disturbance in field reference	Estimated Parameters from 1% disturbance in input torque	Estimated Parameters from 2% disturbance in input torque
X'_d	1.840	1.840	1.840	1.840	1.840
X''_d	0.076	0.075	0.078	0.075	0.078
T'_{do}	0.790	0.810	0.820	0.797	0.824
T''_{do}	0.264	0.284	0.284	0.240	0.275
X_d	0.344	0.370	0.363	0.373	0.370
X'_q	1.960	1.976	1.940	2.000	2.000
X''_q	0.038	0.043	0.039	0.039	0.044
T'_{qo}	5.780	5.770	5.760	5.760	5.760
T''_{qo}	0.164	0.140	0.130	0.140	0.137
X_q	0.254	0.256	0.250	0.258	0.260

Table 2: Dynamic parameters of the generator in technical documents

R_a	X_l	X_d	T''_{do}	T'_{do}	X''_d	X'_d
0.0033	0.125	1.78	0.038	5.78	0.16	0.23

disturbances to the excitation and governor systems satisfactorily identified the parameters of the model. Genetic Algorithm approach was used to estimate the parameters. The derived model was validated and its responses to the same disturbances were very close to the corresponding outputs of actual machine. Finally a step change is offered to employ to the excitation system (by changing Unit Transformer Tap changer), because of its simplicity and safety to perform.

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