

# State Space Modelling of Induction Generator for Dynamic Stability and THD Analysis Using SPWM Technique

Sakshi Dubey<sup>1</sup>, Dr. Anil Kumar Kurchania<sup>2</sup>

<sup>1</sup>Research scholar, Department of Electrical Engineering, Rabindranath Tagore University, Bhopal (M.P)

<sup>2</sup>Director and Professor Centre for Renewable Energy, RNTU, Bhopal (M.P)

**Abstract:** Earlier approaches to stability analysis induction machinery were based on estimations and ideal expectations with little predictive accuracy. The emergence of computers with a quick-acting memory opens the door to accurate research by expanding the space for complex modelling. The previous procedures are based on the same range criterion or on a changed shape or on a swing equation. The methods now use a day now to explain the state field using the dynamic equations. This paper presents the development of the transient stability State space model, THD analytic, linearisation techniques and models for dynamic instability tests operating point model (with current and flow linkage states). Two case studies have shown the techniques.

**Keywords:** dynamic stability, swing mathematical form, THD, state-space.

## INTRODUCTION

Computer induction is seldom used in isolated mode. In a power plant, they operate in tandem and the power plants are connected by a power system to a grid. The load given by an induction machine is negligible in a wide grid system [1,2]. Thus, by serial impedance, they are collectively viewed as one unit connected to the infinite bus. The induction generator is designed such that the device's axis is very wide and unyielding. The induction generator can be a cylindrical (steam turbine) or salient polarity type (driven by water turbine). The generators and power system components are synchronized with the moving magnetic field produced by the number of layers winding [3]. The classical analysis shows the inductive generator as a source of emf behind impedance (or merely because the resistance effect is too small, the armature reaction effect summarizes the armature leakage effect. We use one single inductive reactant for cylindrical pole machines and two inducing reactants for polar or direct axes as well as the inter polar or square axis [4] for salient polar machines. This effect can be explained by the substitution for fast transient conditions with inductive reactance for sluggish transients of latent reactance. Enhanced empirical techniques have now improvised the effects of transient and sub-transient

importance to give better assessments of transient phenomena [5].

## ILLUSTRATION OF INDUCTION GENERATOR

The variable step model [4, 9, 12] in which an Induction Generator can be described

- i) There are two concentric coils in the scattered damper winding: one along the d axis and one along the q axis.
- ii) A concentrated winding in the d-axis is the field winding.
- iii) For the three stages, the armature is denoted by three coils, each of which is 120°.

In such systems, the inductance adjusts time as well as the analytical equations are nonlinear, since the angles of coupling of moving coils with fixed coils are constantly different. These non-linear equations are hard to solve. For this sort of model, the machine has a fantastic runtime and memory requirement.

A transformation matrix is used to eliminate this issue by Park and Gorev to translate process amounts to axis expanses as seen in the following:

$$\begin{bmatrix} V_d \\ V_q \\ V_o \end{bmatrix} = \sqrt{2/3} \begin{bmatrix} \cos \theta & \cos (\theta - 2\pi/3) & \cos (\theta + 2\pi/3) \\ \sin \theta & \sin (\theta - 2\pi/3) & \sin (\theta + 2\pi/3) \\ 1/\sqrt{2} & 1/\sqrt{2} & 1/\sqrt{2} \end{bmatrix} \begin{bmatrix} V_a \\ V_b \\ V_c \end{bmatrix} \quad (1)$$

where,  $V_d, V_q$  etc. are transformed quantities and  $V_a, V_b$  etc. are phase quantities. The existing factors have a close relationship. The following inverse transformation is done to get phase quantities from the axis quantities:

$$\begin{bmatrix} V_a \\ V_b \\ V_c \end{bmatrix} = \sqrt{2/3} \begin{bmatrix} \cos \theta & \sin \theta & 1/\sqrt{2} \\ \cos (\theta - 2\pi/3) & \sin (\theta - 2\pi/3) & 1/\sqrt{2} \\ \cos (\theta + 2\pi/3) & \sin (\theta + 2\pi/3) & 1/\sqrt{2} \end{bmatrix} \begin{bmatrix} V_d \\ V_q \\ V_o \end{bmatrix} \quad (2)$$

An orthogonal transformation is the park. It reduces a system to one with fixed axis variables with time-varying inductions. Similar and much easier to solve is the resulting model. D, Q is pseudo-stationary in this model, i.e. they are set in space but have the potential to induce emf by the speed action of the rotor. The real and transformed machine's circuit representation is shown in Fig. 1 (a) and (b). As a T-circuit, it illustrates the transformer. In this T—representation, the shunt factor consumes very little current. So we typically neglect and portray the transformer as serial impedance. The impedance of the engine is coupled with this impedance. The reaction and time constants are amended accordingly.

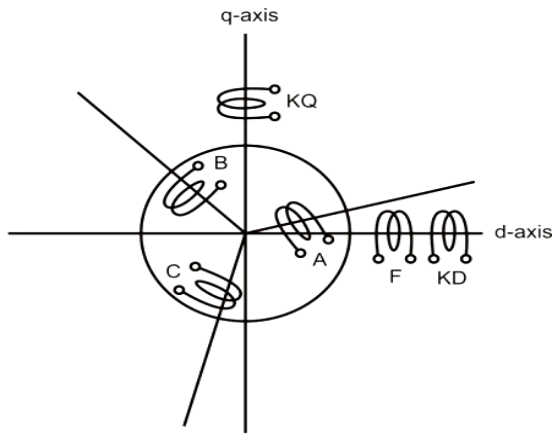


Figure 1(a). Induction Generator Variable Phase Model

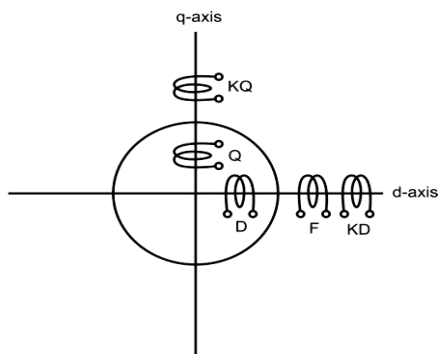


Figure 1(b). Machine converted d-q axes

**QUANTITIES FOUNDATION, P.U. MATRIX WITREN AND TRANS-FORMIES**

It's customary to use p.u in power system research. In terms of the relevant basic quantities, parameters and variables. The nominal voltage/current etc. of a single machine is used as a basis quantity for analysis. We choose the basis for equal flux relation for rotor quantities [10, 13, 18].

The impedance matrix transformed is derived from:

$$[Z'] = [CT] [Z] [C] \tag{3}$$

Where the transformation matrix is [C] and it is transposed by [C]<sup>T</sup>. We get the transformed impedance matrix through algebraic manipulation. This is a (4x4) matrix for a poly phase induction machine and a (5x5) matrix for a poly phase induction machine with one coil per axis representing the damper winding.

There is no inductance in the converted Z-matrix and can be tracked considerably more effectively. For most machine problems, it is a closed solution which forms the basis of the classic concept of the induction machine.

The drawbacks in the generalized model are as follows:

- a. It cannot be used for double-salient devices such as the inductive induction generator.
- b. It should not be extended to unbalanced winding machines such as single-phase induction generators.
- c. External effects like equilibrium, heavy iron propagation of eddy currents and commutation phenomena are crucial to understand independently.

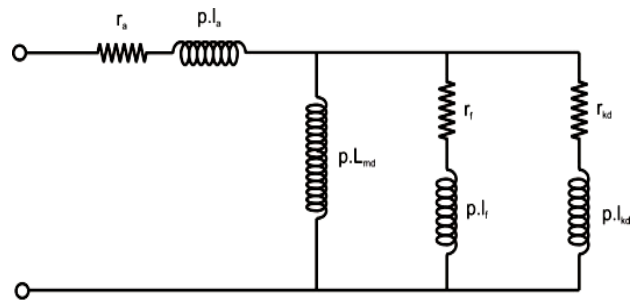


Figure 2(a). equivalent network of d-axis

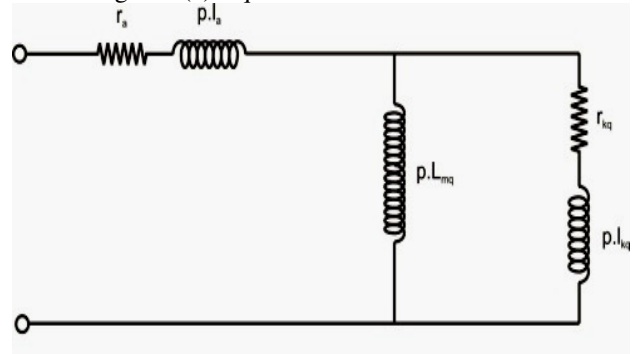


Figure 2(b). equivalent network of q-axis

**COMPOSITION OF EQUIVALENT NETWORK**

In Fig 2(a) for the d-axis and 2(b) for the q-axis, the equivalent circuits for the transformed machine are given. The coil F is the ground coil, KD and KQ are the damper coils, and D and Q are the pseudo-stationary counterparts of the 3-phase armature coils. The nomenclature of the other criteria is below [16, 19]:

- L<sub>md</sub> = Magentising D-axis inductance
- L<sub>mq</sub> = Magentising Q-axis inductance

$l_a$	=	Inductance of the armature leakage
$r_a$	=	Armature resistance
$l_f$	=	The field's leakage inductance
$r_f$	=	The field's resistance
$l_{kd}$	=	Inductance of d-axis damper leakage
$r_{kd}$	=	Resistance of the d-axis damper

In the steady state of the induction motor,  $p$  can be replaced by  $j\omega$ , as in the case of lack of excitation.

#### DEVICE PARAMETERS BY DATA OF THE MANUFACTURER

Manufacturer data is provided to power station operators through which the equivalent circuit for the d and q axes can be calculated using the following equation sequence [20].

$$X_{md} = X_d - x_a; X_{mq} = X_q - x_a \quad (4)$$

$$1/X_f = 1/(X'_d - x_a) - 1/X_{md}; X_f = x_f + X_{md} \quad (5)$$

$$1/X_{kd} = 1/(X''_d - x_a) - 1/x_f - 1/X_{md}; \quad (6)$$

$$X_{kd} = x_{kd} + X_{md}$$

$$1/X_{kq} = 1/(X''_q - x_a) - 1/x_f - 1/X_{mq}; \quad (7)$$

$$X_{kq} = x_{kq} + X_{mq}$$

$$r_f = X_f / (\omega T'_{do}); T'_{do} = T'_d (X_d / X'_d) \quad (8)$$

$$r_{kd} = \left( x_{kd} + \frac{X_{md} X_f}{X_{md} + X_f} \right) / (\omega T''_{do}) \quad (9)$$

$$T''_{do} = T''_d (X'_d / X''_d) \quad (10)$$

$$r_{kq} = X_{kq} / (\omega T''_{qo}); T''_{qo} = T''_q (X'_q / X''_q) \quad (11)$$

These parameters apply to Park, Concordia, and Adkins' classical model. However, some of the data for current devices, such as q-axis magnetisation data or sub-transient reactance data, may not be usable. In any case, by referring to regular tables and textbooks, acceptable values can be inferred for the missing data.

#### EXTENSION OF THE CLASSICAL MODEL

It is possible to expand the classical model to include [4, 22]:

- Mechanical parameters: Movable Z-matrix inertial and damping effects.
- Strong iron effects: by reflecting more than one coil of damper per axis. As suggested by Anderson and Fouad, at least one more q-axis coil can be used, giving rise to transient q-axis reactance and time constants.
- Saturation: by the use of saturated reactance values referring to the O.C.C. quieting limit.
- Harmonics: As demonstrated by Kopylov, by the theory of superposition.

#### INCLUSION OF EFFECTS HITHERTO NEGLECTED

The measurement of electromechanical transients accounts for inertial and damping effects. The turbo-induction generator's inertia is given as the inertia constant  $H$  and the p.u. damping, just as  $D$ . The equation for the torque balance (known as the swing equation) is given [21] as:

$$T_m - T_e = \frac{2H}{\omega} \frac{d^2 \delta}{dt^2} + \frac{D}{\omega} \frac{d \delta}{dt} \quad (12)$$

The consequence of saturation is that, based on the degree of saturation, the value of  $X_{md}$  (also  $X_{mq}$  to a lesser degree) is diminished. For conditions at or close CMR and an unsaturated value under small/capacitive load, a saturated value of inductive reactance (Kingslay's method) is standard practice. If the O.C.C./S.C.C for the computers is available, either graphically or by computer software, the required value for the reactance will be found. The Frolick method or exponential method can be implemented using the curve-fitting technique for more detailed saturation analysis.

In the classical model, the influence of induced eddy currents in the solid iron rotor is not accounted for. The classical model is only suitable for laminated rotors that are seldom seen today. For dynamic performance analysis, the various electromagnetic models which account for the induced eddy currents in the solid iron sections of the rotor and in the retaining rings are not suitable. The solid iron rotor has been found to act as a q-axis damper, and two damper circuit coils for the q-axis are adequate to reflect the effect. This gives rise to the idea of a transient q-axis reaction.

In addition, between the field and the damper, there is a reciprocal coupling which may be expressed by an additional  $X_{fkd}$  parameter. By the system of Takeda and Adkins, the parameter can be experimentally figured out. There is no detail on this parameter in the manufacturer's results. In order to reduce complexity, the effect of harmonics is not accounted.

#### EQUIVALENCE MODEL OF MACHINE ON INFINITE BUS

A multi-machine system can be reduced to a 2-machine system by circuit analysis [16] for disruptions at a given spot. With regard to the grid power, if the rating of the defective machine is relevant, then the two-machine representation must be adopted. But if the rating of the generator is limited relative to the power of the system, then it becomes desirable to equate the 2-machine system via series impedance of one machine linked to an infinite bus. The circuit representation of a single device of a computer is given in Fig.1.







plane. We get the form below by linearizing the non-linear present state space model:

$$V = -Kx - Mx \tag{42}$$

For the induction generator, the state equation that does not include the load equation is given as:

$$\dot{X} = -(M^{-1}K)x - M^{-1}V = Ax + Bu \tag{43}$$

This is the sort of State Space that is required. Here are the terminologies explicitly attached to an infinite bus for the M-matrix and K-matrix components of an induction generator:

M=

L <sub>d</sub>	L <sub>md</sub>	L <sub>md</sub>	0		0	
L <sub>md</sub>	L <sub>F</sub>	L <sub>md</sub>				
L <sub>md</sub>	L <sub>md</sub>	L <sub>D</sub>				
			L <sub>q</sub>	L <sub>mq</sub>	0	
			L <sub>mq</sub>	L <sub>Q</sub>		
0			0		-T <sub>j</sub>	0
					0	1

(44)

K=

R	0	0	$\omega_s I_{q0}$	$\omega_s I_{m0}$	$\lambda_{q0}$	-K <sub>q</sub>
0	I <sub>F</sub>	0	0	0	0	0
0	0	I <sub>D</sub>	0	0	0	0
$-\omega_s L_d$	$-\omega_s L_{md}$	$-\omega_s L_{md}$	R	0	$-\lambda_{q0}$	K <sub>d</sub>
0	0	0	0	I <sub>Q</sub>	0	0
$(\lambda_{q0} - I_{q0})/3$	$-I_{m0}/3$	$-I_{m0}/3$	$(L_{q0} - \lambda_{q0})/3$	$I_{m0}/3$	D	0
0	0	0	0	0	-1	0

(45)

Where, infinite bus constants

$$K_d = -\sqrt{3} V_{\infty} \sin \delta_0 \tag{46a}$$

$$K_q = \sqrt{3} V_{\infty} \cos \delta_0 \tag{46b}$$

**b) State space model of Flux-linkage:**

The following form by algebraic modification by comparable treatment on the non-linear flux-linkage model. [18]

$$TX = CX + D$$

or,  $X = (T^{-1}C) X + T^{-1}D = AX + BU \tag{47}$

This is in the type of State Space that is required. As in the previous case, the terms can be obtained by algebraic manipulations for the components of the A-matrix and B-matrix and are given in ref.

**CASE STUDY**

**Case Study 1 (Current State Space Analysis)**

The methods proposed by Mazumdar, Ghosh, Sanyal, etc. are being followed for the estimation of the results

(17-19]. At present, the turbo generator with capacity of 250 MW, 11 kV, 50 Hz is being considered in the Purulia district of West Bengal (Santalalih TPS). Below are the function parameters, time constants and factors under operating conditions related to the system:

The Inductive Reactance of the d-axis, X<sub>d</sub> = 1.6 p.u.

The Inductive Reactance q-axis, X<sub>q</sub> = 1.53 p.u.

The transient reactance d-axis, X'<sub>d</sub> = 0.122

The subtransient reactance of d-axis, X''<sub>d</sub> = 0.173

The transient time constant of d-axis, T'<sub>d</sub> = 1.021 s

The subtransient time constant of d-axis, T''<sub>d</sub> = 0.031 s

The subtransient time constant of the q-axis, T''<sub>q</sub> = 0.021 s

For a minor disturbance that neglects the effects of exciter and governor power, we conduct dynamic stability analysis of the induction generator. It combines the boundary conditions.

Axis elements of the voltages and currents (in p.u.):

$$V_d = -0.726 \quad V_q = 0.8574$$

$$I_d = -0.9374 \quad I_q = 0.3057$$

$$E = E_{FD} = 2.358 \quad I_{FD} = 3.658$$

$$\text{Infinite bus const, } K = 1.432$$

For defined operating conditions, the state matrix elements using the current state space representation are listed below:

Table I: Parameters of the state matrix

-36.081	0.440	14.131	-3489.0	-2548.4	-2445.9	1752.3
12.516	-4.999	77.722	1210.3	884.02	848.47	-607.86
22.757	4.402	-96.868	2200.6	1607.3	1542.7	-1105.2
3588.8	2648.9	2648.9	-36.052	90.107	1776.2	2386.6
-3504.2	-2586.4	-2586.4	35.202	-123.37	-1734.3	-2330.3
-0.008	-0.203	-0.203	-0.799	-0.442	0.000	0.000
0.000	0.000	0.000	0.000	0.000	1000.0	0.000

The characteristic matrix equation was developed by the Fadeev-Leverrier process. The matrix's characteristic polynomial is given below:

$$x^7 + 0.29737 x^6 + 1.0279 x^5 + 0.22621 x^4 + 1.384532e-02 x^3 + 2.331442e-04 x^2 + 1.026837e-05 x + 3.074246e-08 = 0$$

The actual roots have been defined by the Newton-Raphson technique and developed as shown below:

$$R_1 = -3.264e-03; \quad R_2 = -0.1534;$$

$$R_3 = -8.749e-02$$

$$\text{Adjacent pair (1): } -6.5707e-03 \pm j \ 1.7423e-02$$

$$\text{The related oscillation frequency in Hz.} = 1.698 \quad ; \quad \text{damping ratio} = 4.605$$

$$\text{Adjacent pair (2): } -3.5948e-02 \pm j \ .99826$$

Corresponding oscillation frequency in Hz.=59.9;  
 damping time const.= 7.379e-02  
 The system is stable since there is no positive real root,  
 or no root with a positive real part.

**Case study 2 (Flux Linkage State Space Analysis)**

Another measurement of dynamic stability using a flux-linkage state space model is now being made for a 250 MW induction generator. The stability analysis was carried out using both Routh's own value method and parameters. The parameters marked below are:

Synchronous Reactance of the d-axis,  $X_d = 2.225p.u.$

Synchronous Reactance of the q-axis,  $X_q = 2.11p.u.$

The latent reactance in the d-axis,  $X'_d = 0.305$

The transient reactance of the d axis,  $X''_d = 0.214$

The transient time constant of d-axis,  $T'_d = 1.0 s$

The transient time constant of the d-axis sub,  $T''_d = 0.125 s$

The transient time constant of the q-axis sub,  $T''_q = 0.06 s$

At generator terminals, the boundary limitations are given.

Power rated by the generator = 250 MW;

Voltage rated by the generator = 11 kV

Control of the generator  $P = 0.85p.u.$

Control calculation for the generator (lag) = 0.85

Terminal voltage of the engine  $V_g = 1.0$

The limitless voltage of the bus  $V_{inf} = 0.9307$

W.r.t limitless bus phase angle =  $-7.0030^\circ$

Power angle =  $40.307^\circ$

The voltages and currents are given below with the axis quantities:

$V_d = -0.758$     $V_q = 0.784$     $I_d = -0.9478$

$I_q = 0.4125$     $E = E_{fd} = 3.254$     $I_{fd} = 2.654$

Infinite Continuous Bus,  $K = 1.745$

Table II: Parameters of the state matrix

-16.428	9.4412	6.1628	-878.42	246.28	-730.18	667.16
1.7833	-4.5154	2.6013	0.0000	0.0000	0.0000	0.0000
12.788	11.766	-25.4917	0.0000	0.0000	0.0000	0.0000
1138.4	-166.43	-263.86	1.1717	-3.7078	762.04	823.34
0.0000	0.0000	0.0000	59.078	-63.6638	0.0000	0.0000
0.5988	0.2500	-0.3964	-0.7486	0.4956	0.0000	0.0000
0.0000	0.0000	0.0000	0.0000	0.0000	1000.0	0.0000

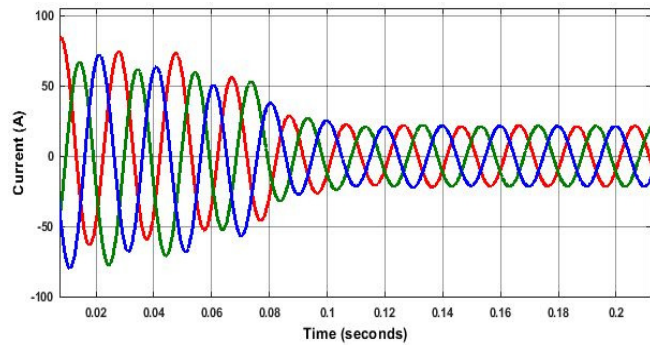


Fig.3 Three phase stator current with SPWM technique

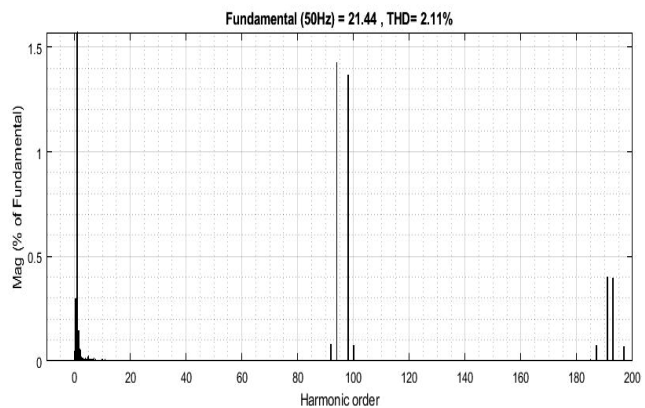


Fig.4 THD analysis of stator current

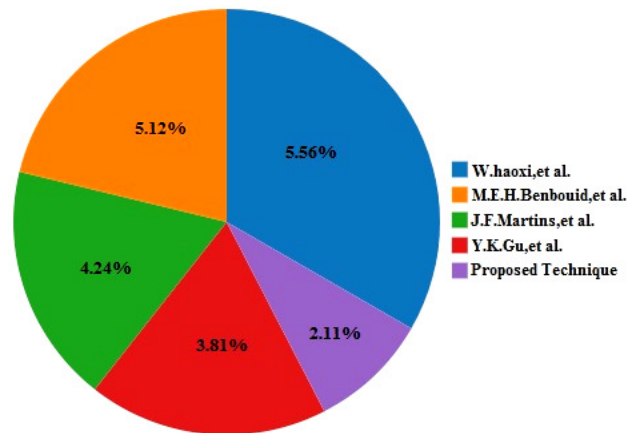


Fig.5 THD comparison with other technique

The Fadeev-Leverrier technique was used to determine the characteristics equation, as given below:

$$x^7 + 0.10893x^6 + 1.0045x^5 + 7.399E-02x^4 + 2.3252E-03x^3 + 6.1547E-05x^2 + 8.4629E-07x + 8.1277E-10 = 0$$

Equilibrium research is performed according to the parameters of Routh. The tabulation of Routh is given below:

Table III: Parameters of Routh's criterion

1.000000000000	1.004536000000	0.002325150000	0.0000008462933
0.1089272000000	0.0739918900000	0.0000615473300	0.0000000008128
0.3252573000000	0.0017601180000	0.0000008388317	
0.0734024400000	0.0000612664100	0.0000000008128	
0.0014886370000	0.0000008352302		
0.0000200824800	0.0000000008128		
0.0000007749825			

Though the elements are presents in the first column are having the same sign and positive in value, hence the system is stable. The primary roots of the system are defined by NR criterion:

$$r_1 = -1.0354e-03 ; r_2 = -1.412e-02 ;$$

$$r_3 = -3.235e-02$$

The oscillating frequency of the system = 1.5 Hz

The damping ratio = 0.9

### CONCLUSION

Mathematical simulation of a system helps to understand the behavior of a system and predict its results. The most difficult part is designing the induction motor in this exercise. The general technique is to use the Park-Gorev transition along d-q axes to reduce the system into a number of coupled coils. For the model, this makes it simple and tractable. It also removes the computer's need for runtime and memory space. A number of synchronous generators swing around equally in different types of agitation. It is assumed that a cohesive culture like that is a collection of swinging machines. The coherent category can be defined by a single big machine with equivalency parameters in order to minimize the dimension of the resulting model. In the block diagram and transfer function method, there are some important limitations, once common. In the State Space system, such limits are missing. However, the State Variable Model was used. There are two kinds of state variables widely used. The existing state variables and the state variables of the flux linkage. The consequences of the mechanical parameters of inertia and damping, the effects of the turbine (and boiler, if any) and, ideally, the secondary effects of saturation, etc., need to be included in the state variable model. It also lowers THD by as much as 2.11%. Eventually, its utility is demonstrated by the complex stability of the suggested solution

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