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# Investigations on the behavioral analysis of unbalanced synchronous generators

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# **ABSTRACT**

This paper describes a new methodology for the modeling and analysis of three-phase synchronous generators operating under an unbalanced regime. For this, an improved state model has been developed in order to determine significant signatures on stator and rotor electromagnetic quantities. This methodology is characterized by some advantages. Firstly, it can be generalized for the modeling of severe defects like open-phase and short circuits. Furthermore, by comparison to classical approaches based on the finite elements and symmetrical components methods, this approach gives a good compromise between precision and simulation time. The obtained results show the effectiveness of this approach for the analysis of unbalanced synchronous generators.

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## 1. INTRODUCTION

Due to their stable performance, synchronous machines are frequently exploited as generators in electrical energy production, especially in high-power systems. These generators are subject to different asymmetries. The most encountered are the stator asymmetries which are mainly due to the short-circuit faults and unbalanced load conditions. The modeling of unbalanced synchronous generators (USG) makes it possible to predict the abnormal function under unbalanced conditions [1]-[5]. To validate this approach, the unbalanced load conditions have been considered.

Modeling and detection of dysfunctions in electrical machines is an important area of research for both industrial and scientific researchers. For this, the well-known approach consists of processing a monitoring signal [6]-[15]. Regarding this approach, the main drawback is to choose the convenient signal that makes it possible to discriminate asymmetries characterized by similar signatures. The second approach uses the analysis of a residual signal [16]-[18]. This approach can generate false alarms due to the sensitivity to model parameters. Recently, the advanced approach has been based on intelligent techniques. The serious drawback of this approach is its complexity for implementation [19]-[22].

Systems monitoring research often requires a precise model. The most used approaches are the finite elements and symmetrical components methods [23], [24]. In this work, a state model has been developed considering neutral voltage. This approach is characterized by some advantages. Firstly, it can be generalized for the modeling of severe defects like open-phase and short circuits. Furthermore, by comparison to classical approaches based on the finite elements and symmetrical components methods, this approach gives a good

compromise between precision and simulation time. The obtained results show the effectiveness of this methodology for the behavioral analysis of USG.

#### 2. USG STATE MODEL

For USG, the stator voltage equation is expressed by (1)-(6) [25].

$$\frac{d[\phi sd]}{dt} = [usd] + [Rsd][isd] \tag{1}$$

With:

$$[usd] = [Td][vn] \tag{2}$$

$$[\Phi sd] = [Td][\Phi s] \tag{3}$$

$$[Rsd] = [Td][Rs] \tag{4}$$

$$[Td] = \begin{bmatrix} +1 & -1 & 0 \\ 0 & 1 & -1 \\ -1 & 0 & +1 \end{bmatrix}$$
 (5)

$$[vn] = [Rl][isd] \tag{6}$$

 $[\Phi s]$ , [isd], [vn] are respectively the vector of the stator flux, stator currents, and load voltages, [Rs], [Rl] are respectively the matrix of the stator and load resistances. The rotor voltage equation is expressed by (7).

$$\frac{d\Phi_r}{dt} = Vr - Rrir \tag{7}$$

To establish the state model of the USG, it's important to express the machine currents in terms of the machine fluxes. For this, we define a vector of two independent currents as illustrated by (8) [25].

$$[iabs] = \begin{bmatrix} ias \\ ibs \end{bmatrix} \tag{8}$$

The stator and rotor fluxes are calculated using (9)-(13),

$$[\Phi abs] = -[Lsd][iabs] - [Lsrd]ir \tag{9}$$

$$\Phi r = -[Lrsd][iabs] - Lr.ir \tag{10}$$

$$[\Phi abs] = [Asd][\Phi s] \tag{11}$$

with (12) and (13).

$$[Asd] = \begin{bmatrix} 1 & -1 & 0 \\ 0 & 1 & -1 \end{bmatrix} \tag{12}$$

$$[Bsd] = \begin{bmatrix} +1 & 0 \\ 0 & +1 \\ -1 & -1 \end{bmatrix} \tag{13}$$

[Lss] is the matrix of the stator inductances; [Lsr] is the matrix of the stator-rotor mutual inductances; ir is the field current; and Lr, Rr are respectively the inductance and resistance of the rotor winding. Therefore, the stator and rotor currents are expressed by (14)-(19).

$$[iabs] = -\left([Lsd] - \frac{1}{Lr}[Lsrd][Lrsd]\right)^{-1} \left([\varphi abs] - [Lsrd] \frac{\varphi r}{Lr}\right)$$
(14)

$$ir = -(Lr - [Lrsd][Lsd]^{-1}[Lsrd])^{-1}(\Phi r - [Lrsd][Lsd]^{-1}[\varphi abs])$$
 (15)

$$[Lsd] = [Asd][Ls][Bsd] \tag{16}$$

$$[Lsrd] = [Asd][Lsr] \tag{17}$$

$$[Lrsd] = [Lrs][Bsd] \tag{18}$$

$$[Lrs] = [Lsr]^T \tag{19}$$

From (1), (8), (14), and (15), the USG state model will be expressed by (20) and (21).

$$\begin{cases}
\frac{d[\Phi sd]}{dt} = -[Rsd][Bsd] \left( [Lsd] - \frac{1}{Lr} [Lsrd][Lrsd] \right)^{-1} \left( [As][\Phi sd] - [Lsrd] \frac{\Phi r}{Lr} \right) + [usd] \\
\frac{d\Phi_r}{dt} = Vr + R_r (Lr - [Lrsd][Lsd]^{-1} [Lsrd])^{-1} (\Phi r - [Lrsd][Lsd]^{-1} [As][\Phi sd]) \\
J\frac{d\Omega}{dt} = Tm - Te - fv\Omega
\end{cases} (20)$$

The electromagnetic torque is expressed by (21).

$$Te = \frac{P}{2} [is]^T \frac{\partial [Lsr]}{\partial \theta} ir \tag{21}$$

 $T_m$  is the input torque; J is the inertia; fv is the viscose friction coefficient. The neutral voltage  $v_{on}$  is calculated using (22) to (23) [25].

$$von = \frac{\sum_{i=a,b,c}(vin-vio)}{3}, i = a,b,c$$
 (22)

Where the stator voltages are calculated by (23) [25].

$$vin = risiis + \frac{\Delta \varphi is}{T_S}, i = a, b, c$$
 (23)

 $T_s$  is the sampling time.

# 3. SIMULATIONS

Using MATLAB, the state model is simulated for a synchronous generator of 1.5 kVA, 4/2.3 A, 220/380 V – 50 Hz. At t = 0, the field current is established with no load conditions (open stator). After that, the balanced load of 110  $\Omega$  is connected to the generator at t = 0.25 s. An unbalanced load of  $r_{al}$  = 220  $\Omega$ ,  $r_{bl}$  =  $r_{cl}$  = 110  $\Omega$  is selected at t = 0.5 s. The stator, currents, and their fast Fourier transform (FFT) are shown by Figures 1(a)-1(d) (see Appendix), respectively. The field current and electromagnetic torque are shown in Figures 1(e)-1(f) (see Appendix), respectively. Figures 1(g) and 1(h) (see Appendix) show the neutral voltage and its spectrum analysis, respectively.

Simulation results show that distortion is produced through the temporary voltages and currents as illustrated by Figures 1(a) and 1(c), respectively. As mentioned in Figures 1(b) and 1(d), the spectrum analysis shows that some harmonics of impaired orders (150 Hz, 250 Hz, ...) are generated over the stator voltages and currents. Due to the magnetic interaction between stator and rotor circuits, the field current is affected as illustrated by Figure 1(e). Figure 1(f) shows that a pulsating torque is created causing undesirable effects such as vibration, noise, and heating of the unbalanced generators. Regarding the neutral voltage, it is about 65 V as shown in Figure 1(g). Figure 1(h) shows that specific harmonics of impaired orders are observed through the spectrum analysis of the neutral voltage.

## 4. EXPERIMENTS

An experimental test has been conducted on a three-phase synchronous generator of 1.5 kVA, 4 / 2.3 A, 220/380 V – 50 Hz. The rotor current is established with open stator. After that, a balanced load of 110  $\Omega$  is connected to the generator. Asymmetrical load of  $r_{al}=220~\Omega,~r_{bl}=r_{cl}=110~\Omega$  is considered. The neutral voltage and its spectrum analysis are illustrated in Figures 2(a) and 2(b) respectively. Figures 2(c) and 2(d) illustrate the spectrum analysis of the stator voltages and currents respectively.

For an unbalanced load, the neutral voltage reaches about 55 V as illustrated by Figure 2(a). Figure 2(b) shows the FFT of the neutral voltage where specific harmonics of impaired orders are generated. These harmonics are similar to the harmonics of the stator voltages and currents as illustrated by Figures 2(c) and 2(d), respectively.

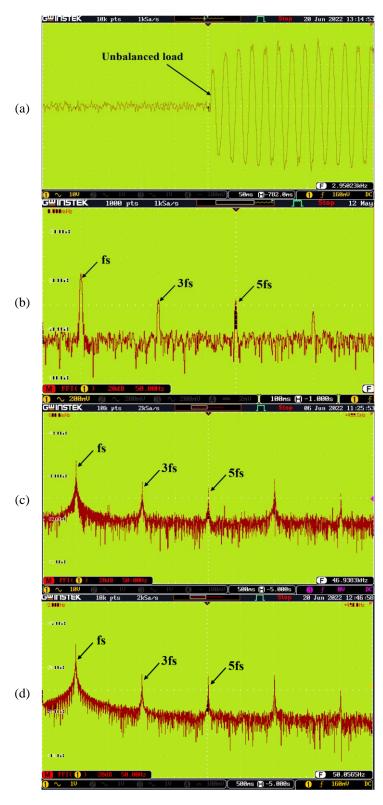


Figure 2. USG experimental results: (a) neutral voltage, (b) FFT of neutral voltage, (c) FFT of stator voltages, and (d) FFT of stator currents

## 5. CONCLUSIONS

A new methodology has been investigated for the behavioral analysis of the USG. To test the validity of this methodology, unbalanced load has been considered. Severe effects are mentioned like vibration, noise, and excessive heating of the USG. For this reason, it's mandatory to avoid all asymmetries before they lead to a progressive destruction of the generators. The FFT of the neutral voltage, stator voltages, and currents have been proposed for the detection of stator asymmetries. This work may be extended to several faults like openphase and short-circuits.

# **APPENDIX**

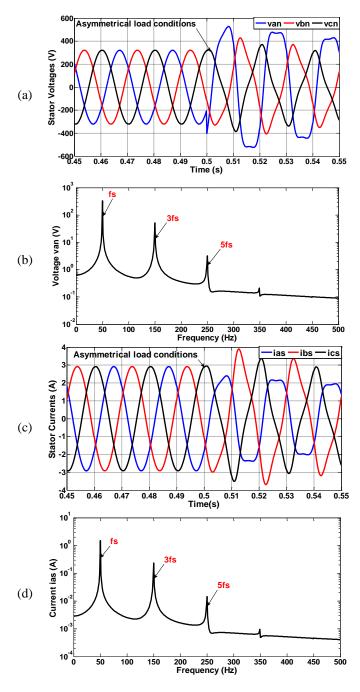


Figure 1. USG simulation results: (a) stator voltages, (b) FFT of stator voltages, (c) stator currents, and (d) FFT of stator currents

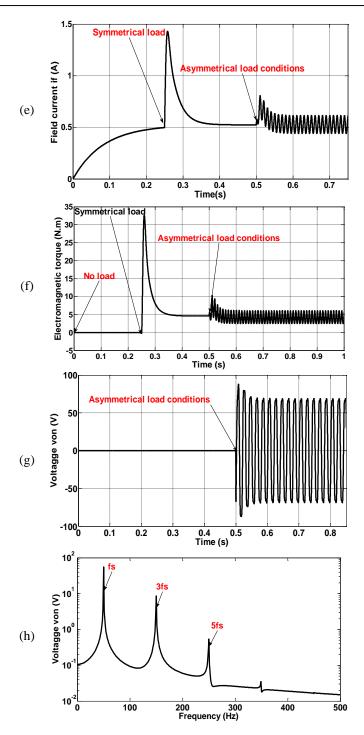


Figure 1. USG simulation results: (e) field current, (f) electromagnetic torque, (g) neutral voltage, and (h) FFT of neutral voltage (continued)

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