## HYBRID METHOD OF OBTAINING DEGREES OF FREEDOM FOR RADIAL AIRGAP LENGTH IN SRM UNDER NORMAL AND FAULTY CONDITIONS BASED ON MAGNETIOSTATIC MODEL

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Abstract—In this paper, a new hybrid method of obtaining the degrees of freedom for redial airgap length in Switched Reluctance Motor operation under normal and faulty conditions based on magnetostatic analysis is presented. At the beginning, this method goes through the magnetic design of the motor utilizing three dimensional (3-D) Finite Element Method (FEM) in order to consider the end effects as well as axial fringing field effects. The motor parameters, such as torque, flux linkage, flux density versus rotor position are precisely obtained. Then, a Multi Lavered Perception Neural Network is designed by considering the nonlinear behavior of the motor parameters obtained under different modes of operation. Using this network and the obtained parameters from FEM, an Objective Function (OF) for torque ripple with the aim of having a minimum mean square error is estimated. In addition, an improved Genetic Algorithm (GA) for the minimization the OF is also presented to determine the motor's operational regions. Finally, the legal intervals for different modes of motor operation are addressed.

### 1. INTRODUCTION

Switched Reluctance Motor (SRM) with its low-cost structure has only steel material for the rotor and stator, with concentrated windings on the stator, which makes an ideal choice for low-cost and high performance applications [1–4].

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Recently optimized design technology focuses more on numerical methods, which has led to optimization of motor sizes as well as minimization of torque ripple [5, 6]. Electromagnetic motor design and optimization have been affected very much by utilizing computer-based methods that use evolutionary computational techniques [7], such as Genetic Algorithm (GA) [8–10], evolutionary programming and also numerical methods like Boundary Element Method (BEM) and Finite Element Method (FEM) implemented by authors in [11, 12].

GAs are stochastic search processes, based on fundamental principles of natural selection and genetic evolution. A method that GA uses for creating an individual vector, biologically called chromosome, which makes it different from the deterministic search processes [14–18].

The main performance of GA is based on composition, mutation, crossover and selection procedures [19–23, 38–43]. The use of this search algorithm was applied to optimizing torque ripple, which has led to finding the interval of airgap in faulty and healthy conditions. This algorithm is used in order to facilitate a parallel search in the parameters space using the genetic operands to obtain a group of coded chromosomes, which shows the system parameters in an optimized manner.

In the proposed hybrid method, for fitting the parameters by a non-linear function with suitable coefficients the Artificial Neural Network (ANN) is employed. ANN is one of the most popular and widely applied methods due to its superior ability of approximating unknown nonlinear function to any degree of desired accuracy. This method has been widely applied to many fields, such as image processing, pattern recognition, signal processing, and weather prediction, particularly in the area of the electromagnetics [24–26, 44– 46].

Behavior analysis of any electrical system requires an accurate modeling of that system [27–31, 47–52]. In order to consider the real model of the motor and its operation in nonlinear states the exact parameters are required. Therefore, in this research, the three dimensional (3D) FEM is used to obtain the precise model of the SR motor.

The authors in the previous works modeled SRG [1,11] and SRM [12,13] in healthy and faulty [2,3] modes utilizing three dimensional FEM. In this paper, the intervals for different modes of motor operation are calculated and presented by a different technique known as hybrid method.

## 2. PROBLEM STATEMENT

In high-power density motors the need for smaller air gap is one of the important requirements. Smaller airgap length will also force the motor into a highly saturated operation, accompanied by high radial forces causing mechanical vibration of stator core and housing in radial direction [32, 33]. Therefore, obtaining the optimum airgap length is essential for achievement of high performance motor.

One of the most common types of fault in electrical machine is the eccentricity fault. This type of fault is considered as abnormal condition and will be modeled in this paper. Occurrence of eccentricity fault leads to decreasing or increasing of the airgap length in different directions. These variations will change the motor parameters. Consequently, the boundary of radial airgap length variation must be calculated to attain smooth control on motor to achieve high performance expected from machine.

On the other side, the maximum and minimum variations of airgap must be obtained to determine the different modes of motor operation. Based on this matter the paper will introduce a new hybrid method in the next section. This method benefits from the advantages obtained by FEM, NN and GA techniques to develop the degrees of freedom for airgap length in SRM under normal and faulty conditions.

# 3. NEW METHOD OF IMPLEMENTATION AND RESULTS

At the beginning of this method, a three dimensional finite element analysis is being used to determine the magnetic field distribution in and around the motor. The MagNet package [34] has been used to analyze the magnetic field in order to determine the static torque at different rotor positions. This method considers the geometry of the motor to solve the magnetic field distribution in and around the motor. Other parameters of the motor such as flux density, flux linkage, coil inductance and static torque can be derived from resulted magnetic fields. The advantages of the 3-D FE method used in this algorithm over the 2-D FE method is the consideration of end effects and also axial fringing fields that lead to more accurate and real modeling of the motor. This has been explained comprehensively in the earlier study in [12].

There are two common methods for solving magnetic field problems. One utilizes magnetic vector potential A, and the other employs electric vector potential T. The partial differential equation for the magnetic vector potential is given by;

$$-\frac{\partial}{\partial x}\left(\gamma\frac{\partial A}{\partial x}\right) - \frac{\partial}{\partial y}\left(\gamma\frac{\partial A}{\partial y}\right) - \frac{\partial}{\partial z}\left(\gamma\frac{\partial A}{\partial z}\right) = J \tag{1}$$

where, A is the magnetic vector potential.

In the variational method (Ritz) the solution to (1) obtained by minimizing the following function;

$$F(A) = \frac{1}{2} \iiint_{\alpha} \left[ \gamma \left( \frac{\partial A}{\partial x} \right)^2 + \gamma \left( \frac{\partial A}{\partial y} \right)^2 + \gamma \left( \frac{\partial A}{\partial z} \right)^2 \right] d\alpha - \iiint_{\alpha} JAd\alpha \quad (2)$$

where  $\alpha$  is the problem region of integration. The field analysis has been performed using a MagNet package which is based on the variational energy minimization technique to solve for the electric vector potential. In this method, electric vector potential known as  $T - \Omega$  formulation in which T is defined by;

$$J = \nabla \times T \tag{3}$$

From Maxwell's equation we have

$$\nabla \times H = J = \nabla \times T \tag{4}$$

Then

$$\nabla \times (H - T) = 0 \tag{5}$$

Since the vector (H - T) can be expressed as the gradient of a scalar, i.e.,

$$H = T - \nabla \Omega \tag{6}$$

where  $\Omega$  is a magnetic scalar potential.

And, since

$$\nabla \times E = -\frac{\partial B}{\partial t} \tag{7}$$

Then,

$$\nabla \times E = \nabla \times \left[ \left( \frac{1}{\sigma} \right) \nabla \times T \right] = -\frac{\partial B}{\partial t} = -\mu_0 \mu_r \left( \frac{\partial}{\partial t} \right) (T - \nabla \Omega)$$
$$= -\mu_0 \mu_r \left( \frac{\partial T}{\partial t} \right) - \nabla \left( \frac{\partial \Omega}{\partial t} \right)$$
(8)

which finally reduces to the following two scalar equations

$$\nabla^2 T - \mu \sigma \left(\frac{\partial T}{\partial t}\right) = -\mu \sigma \nabla \left(\frac{\partial \Omega}{\partial t}\right) \tag{9}$$

And

$$\nabla^2 \Omega = 0 \tag{10}$$

When a three dimensional magnetic field problem is solved by Aand V, the need to solve for all the three components of A arises, whereas using the  $T - \Omega$  method, T can be simplified to produce a solution with only two components of T.

For the present study, it has been assumed that each stator phase is excited with four-node tetrahedral blocks of current. Also, in this analysis, the usual assumptions such as the magnetic field outside an air box in which the motor is placed are considered to be zero.

The unaligned position is defined when the rotor pole is located across from the stator slot in such a way that the reluctance of the motor magnetic structure is at its maximum. This position is considered to be at zero degree in the motor performance plot. The aligned position is defined when the rotor pole is fully opposite to the stator pole, in which the reluctance of the motor magnetic structure is at its minimum supposed to happen at 44 degree. A 6/4 switched reluctance motor is depicted in Fig. 1 and will be analyzed using three dimensional finite element (Fig. 2).





The SR motor dimensions used in this paper are: Stator core outer diameter: 72 mm, Rotor core outer diameter: 40.5 mm, Length of air gap: 0.25 mm, Shaft diameter: 10 mm, Number of turns: 120, Rotor pole arc:  $32^{\circ}$  and Stator pole arc:  $28^{\circ}$ . The motor model (stator and rotor cores) is made of M-27 non-oriented silicon steel laminations with static B-H curve as depicted in Fig. 3.

The rated motor phase current is at 2.5 Ampere and is used for simulation for the initial design parameters. This motor is considered running in counterclockwise direction. The 3D FE method results in magnetic flux density, torque and flux linkage for different rotor positions from unaligned to aligned positions. The next step considers a new condition which has been placed on the length of the airgap according to different rotor eccentricity levels shown in Fig. 4. Now



Figure 2. (a) Finite element mesh for the 6/4 SRM. (b) Zoomed mesh for one coil.





Figure 3. Magnetization curve for M-27 non-oriented silicon steel sheet.

Figure 4. Schematic of motor with changes in airgap length (Dynamic Eccentricity).

again, the different motor parameters for the new condition are obtained. Using these values, the OF will be developed. Using this OF, the region of the motor's operation in the healthy as well as eccentric modes (faulty mode) will be determined.

Dynamic eccentricity is a type of airgap non-uniformity in which airgap is time variant when dynamic eccentricity occurs. Therefore, the distribution of airgap changes when the rotor rotates. The degree

of dynamic eccentricity fault is defined as follow:

$$\varepsilon_D = \left(\frac{O_\omega \times O_r}{g}\right) \times 100\,(\%) \tag{11}$$

where  $\varepsilon_D$  is the percentage of dynamic eccentricity between the stator and rotor axes; g is the radial airgap length in the case of uniform airgap in healthy motor or with no eccentricity.  $O_{\omega}$ ,  $O_r$  and  $O_s$  are the rotor rotation center, rotor symmetry center and stator symmetry center, respectively. Also,  $(O_{\omega} \times O_r)$  is called the dynamic transfer vector.

The static torque developed by the motor is calculated from the ratio of change in the co-energy with respect to the rotor position. Regarding Eq. (5), the static torque versus rotor position for both healthy motor and the motor with various eccentricities utilizing 3-D FEM is obtained and shown in Fig. 5. This will be the first step of implementation of the hybrid method.

Due to higher flux linkages in a faulty motor, the static torque obtained is also higher than healthy motor. In addition, during the motoring operation the unbalanced magnetic pull tends to increase the dynamic eccentricity as well.

The percentage of variation of torque with occurrence of eccentricity is shown in Table 1. It can be observed that reducing the airgap length will increase the variations in torque profile in such way that when 10% eccentricity exists, the magnitude of the motor torque increases up to 4.3%.



Figure 5. Static torque of the motor vs. rotor position for 3-D FEM: healthy motor and motor with various dynamic eccentricities.

10%	20%	30%	40%
Eccentricity	Eccentricity	Eccentricity	Eccentricity
-0.64608	-1.04665	-0.60742	-0.65109
-0.13025	-0.18173	-1.34245	-0.56049
1.30615	1.40194	0.180424	0.032708
4.35884	7.0072	6.557116	6.978498
0.75793	1.93555	4.854805	8.779511
0.51967	1.35769	5.386814	13.28741
-0.51106	0.76182	5.820789	9.454833
0.71208	3.33119	7.427393	6.742136
-2.59001	-1.82419	-0.87997	0.419986
0.3212	-1.24276	0.870109	-0.48171
-1.43321	-2.87013	-8.18836	-5.0447
-1.82347	-2.41758	-3.96404	-3.42164
	$\begin{array}{r} 10\% \\ \hline \text{Eccentricity} \\ \hline -0.64608 \\ -0.13025 \\ 1.30615 \\ 4.35884 \\ 0.75793 \\ 0.51967 \\ -0.51106 \\ 0.71208 \\ -2.59001 \\ 0.3212 \\ -1.43321 \\ -1.82347 \end{array}$	$\begin{array}{r c c c c c c c c c c c c c c c c c c c$	$\begin{array}{c cccc} 10\% & 20\% & 30\% \\ \hline \text{Eccentricity} & \text{Eccentricity} & \text{Eccentricity} \\ \hline -0.64608 & -1.04665 & -0.60742 \\ -0.13025 & -0.18173 & -1.34245 \\ 1.30615 & 1.40194 & 0.180424 \\ 4.35884 & 7.0072 & 6.557116 \\ 0.75793 & 1.93555 & 4.854805 \\ 0.51967 & 1.35769 & 5.386814 \\ -0.51106 & 0.76182 & 5.820789 \\ 0.71208 & 3.33119 & 7.427393 \\ -2.59001 & -1.82419 & -0.87997 \\ 0.3212 & -1.24276 & 0.870109 \\ -1.43321 & -2.87013 & -8.18836 \\ -1.82347 & -2.41758 & -3.96404 \\ \hline \end{array}$

**Table 1.** Percentage of variation of torque for healthy motor vs. motorwith various eccentricities.

**Table 2.** Flux linkage in coilNo. 1 in the first phase inmotor and in healthy mode fromunaligned to aligned positions.

**Table 3.** Flux linkage in coil No. 1 in the first phase in motor and in healthy mode from aligned to unaligned positions.

Degree	Flux Linkage_Coil1	Degree	Flux Linkage_Coil1
	(111 V D)		$(\mathbf{m}\mathbf{w}\mathbf{b})$
0	7.37073472	44	55.45333403
4	7.613212179	48	54.25251449
8	8.271031639	52	50.16700549
12	10.12098261	56	44.25771256
16	16.07182076	60	37 53474268
20	23.30779437	00	01.00111200
24	30.50245643	64	30.53563612
28	37.56267675	68	23.30838645
-0 32	44.30275992	72	16.04502741
36	50.19602623	76	10.10249904
40	54.24661799	80	8.288291556
44	55.45333403	84	7.602377878

Also, in eccentric motor with 20%, 30% and 40% dynamic eccentricities, the torque profile produced 7%, 8.1% and 13.2% higher values, respectively.

Moreover, the uniformity of flux density distribution of the motor in healthy condition from front and lateral views is shown in Figs. 5(a) and (b), respectively. The values of flux linkage in coil No. 1 of the first phase are shown in Table 2 and Table 3 in healthy motor from unaligned position to aligned positions.

The next step in the hybrid method, obtained parameters from Finite Element Method, are imported to a MLP (Multi Layered Perceptron) Neural Network with one hidden layer of perceptron to compute a non-linear function (Eq. (6)) with suitable coefficients. This network consists of two layers as depicted in Fig. 7.

In this level of algorithm, the static torque is defined as a nonlinear function of rotor position, flux linkage and percentage of eccentricity (or the variations of airgap).

$$T = F\left(\theta, \varphi, \varepsilon_D\right) \tag{12}$$

Table 4. Values set and the mean square error average.

Result	Samples	MSE
Training	60%	2.6589e-4
Validating	20%	9.3837e-2
Testing	20%	5.5298e-2



**Figure 6.** Flux density distribution in SR motor in healthy condition. (a) Front view. (b) Lateral view.



Figure 7. Network schematic to estimate the objective function.

where T is the static torque;  $\theta$  is the rotor position;  $\varphi$  is the flux linkage;  $\varepsilon_D$  is the percentage of dynamic eccentricity.

The network is constructed according to some initial parameters as training pattern, with the weights assigned to each of them. The network is trained until a desirable mean square error (MSE) is obtained. For this network, 60% of the samples are employed for training; 20% are used for validation; 20% of the samples are spent for the test of the network. The number of neurons in the hidden layer is set to 20 using 4 input neurons for this network. The results are shown in Table 4.

In the next level of the new method, the neural network sends its function coefficients to Genetic Algorithm in which the objective function (OF) is defined as below:

$$OF = Min (Torque Ripple \%)$$
 (13)

Above equation represents the objective function by minimizing the amount of torque ripple based on the developed function from neural network. Also the torque ripple is defined as follow:

Torque Ripple % = 
$$\frac{T_{\text{max}} - T_{\text{min}}}{T_{\text{max}}} \times 100\%$$
 (14)

where  $T_{\text{max}}$  and  $T_{\text{min}}$  are the maximum and minimum static torque values, respectively. At the beginning of this step, the primary population consists of 100 chromosomes and is imported to objective function. Based on the torque ripple results as an optimized value, the superior points with more fitness are selected to continue the procedure of the algorithm. In the next step, mutation by Gaussian method

is used to avoid trapping in a local minimum. In this method, a chromosome consists of two elements  $(x, \sigma)$ , in which the x vector is defined as a point in search space, and the  $\sigma$  vector is the standard deviation. A new chromosome  $(x', \sigma')$  is produced as below:

$$\begin{cases} \sigma' = \sigma \, e^{N(0,\,\Delta\sigma)} \\ x' = x + N\left(0\,,\,\Delta\sigma'\right) \end{cases}$$
(15)

where,  $N(0, \Delta \sigma')$  is a vector for random Gaussian numbers with Mean value equals zero. The mutation operand changes the one gene from chromosome with 10% mutation rate.

Some chromosomes are selected for scattered type crossover to produce new generation of the chromosomes with new desirable features. The crossover rate is set to 60%. The new produced generation, which consists of flux linkage and airgap, will be sent to the beginning of the algorithm for the next level of the optimization.

Table 5.	Range	of	torque	values	in	different	regions	of	motor
operation.									

	Healthy		Faulty		Destructive		
Rotor	Operation		Operation		Operation		
Position	(0–9%		(9-65%		$(\varepsilon > 65\%$		
	eccentricity)		eccentricity)		eccentricity)		
(Degree)	Min	Max	Min	Max	Min	Max	
0	0.0026	0.0028	0.0028	0.0032	0.0032	> 0.0032	
4	0.0151	0.0153	0.0153	0.0164	0.0164	> 0.0164	
8	0.0372	0.0378	0.0378	0.0395	0.0395	> 0.0395	
12	0.1228	0.1284	0.1284	0.1414	0.1414	> 0.1414	
16	0.2648	0.2668	0.2668	0.2982	0.2982	> 0.2982	
20	0.2646	0.2660	0.2660	0.3098	0.3098	> 0.3098	
24	0.2650	0.2663	0.2663	0.3115	0.3115	> 0.3115	
28	0.2641	0.2660	0.2660	0.2999	0.2999	> 0.2999	
32	0.2557	0.2492	0.2492	0.2898	0.2898	> 0.2898	
36	0.2303	0.2322	0.2322	0.2335	0.2335	> 0.2335	
40	0.1688	0.1753	0.1753	0.1888	0.1888	> 0.1888	
44	0.0000	0.0003	0.0003	0.0004	0.0004	> 0.0004	

This procedure will continue until it reaches the maximum number of the produced generation, which is 2000 in this case.

The results concluded from the algorithm show the minimum and maximum airgap lengths for the motor operation. In other words, the legal intervals of motor operation in the occurrence of eccentricity fault



Figure 8. Hybrid method flowchart.

are calculated. In order to obtain the maximum legal intervals from eccentricity fault, the maximum value of objective function is used. The flowchart of this hybrid method is shown in Fig. 8.

According to the results obtained from the new method, it can be observed that the motor under 0% eccentricity to 9% eccentricity can be named as healthy motor, or [0%-9%] eccentricity interval is defined for healthy operation. The interval between 9% to 65% can be named as the interval of motor's operation in faulty condition. It is necessary to correct the motor's operation using electrical or mechanical controls under faulty condition. The interval higher than 65% can be named as motor's destructive interval in which the motor has no ability to continue to rotate under load and the crash of the rotor, and the stator is very probable. The motor should be repaired or serviced in this condition. The three intervals for motor operation under eccentricity fault from manufacturing companies indicate 0–10% for healthy motor, 10–50% for faulty motor, and more than 50% is considered as the destructive interval of motor operation [35–37].

Table 5 shows the range of operation obtained for healthy, faulty, and destructive intervals and their corresponding torque values for these three regions from unaligned to aligned positions.

## 4. CONCLUSION

A new procedure named hybrid method for computing the degrees of freedom of airgap in SRM under faulty and healthy conditions based on magnetostatic analysis has been proposed and analyzed. It computes the legal intervals for the radial airgap length as well as the regions of the motor's operation under different conditions. In the hybrid algorithm a 6/4 switched reluctance motor utilizing 3-D FEM has been designed and analyzed, then motor's parameters including torque with maximum of 0.28 N.m are achieved. The SR motor is then faced with eccentricity fault ranging from 0% to 70% in 5% steps. The resulted parameters are imported to a MLP neural network to produce the characteristic function as well as an objective function for torque ripple. In this study, 60% of the samples are used for training purposes, 20% for validating and the remaining 20% for testing the estimated function. The parameters of the non-linear equation for torque ripples are given to GA as an objective function, and then the algorithm computes the optimized parameters and also the optimized intervals based on minimization of torque ripple. Reducing the airgap length will result in an increase in torque variations in a way such that it will have an increase of 13.28% in maximum and 4.3% in minimum levels. 0% up to 9% eccentricity is named as the legal interval of the

healthy motor operating condition. In other words, the variations of airgap length are acceptable in this range for normal operation of the motor. The region of the faulty motor is defined while motor operates with 9% up to 65% eccentricity. More than 65% eccentricity fault leads to motor entrance into the destructive operation interval in which the motor is not suitable for the operation anymore.

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