

# Continuous Wavelet Technique for Detection of Broken Bar Faults in Induction Machine

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https://doi.org/10.18280/ts.360207	ABSTRACT
<b>Received:</b> 16 January 2019 <b>Accepted:</b> 27 March 2019	The purpose of this study is diagnosis the fault of induction machine, through detection of broken bars by stator current analysis. Therefor we present a multi-winding model for the

#### Keywords:

continuous wavelet (CWT), induction machine diagnosis, signal processing, faults signatures, indicator values The purpose of this study is diagnosis the fault of induction machine, through detection of broken bars by stator current analysis. Therefor we present a multi-winding model for the simulation of faults as part of the fault detection study, and test the behavior of the machine in the healthy and faulty state. In this paper it is focus the signal processing technique for detecting defects. This technique is based on continuous wavelet transform (CWT) to detect and locate defects, by using the multi-level decomposition for the detection of defects and the location of the broken bars at the rotor. The findings of this research results show the importance of this technique for the analysis of fault signatures in healthy and defective cases.

# **1. INTRODUCTION**

The increasing use of induction machines in electric drive systems plays a major role in the industrial field such as, Safety, reliability, efficiency and performance, the importance of failure detection is often required in order to improve performance and reduce maintenance costs to avoid a sudden stop of the machine. On the other hand, the diagnostic role is the identification and location of defects [1-2]. In this context, the proposed approach is examined on three different cases of study [3]: a motor with broken rotor bars, an unbalanced motor shaft, based on the startup vibration transient analysis. by uses signal processing based on technique continuous wavelet CWT. Whilst others [4-5] to introduce technique (MCSA) motor current signature analysis which utilizes the results of spectral analysis of the stator current for fault detection and the localization of abnormal electrical and mechanical conditions that indicate, a failure of induction motors. Among the diagnoses of cage rotor faults in three-phase asynchronous machines, the parks current vector monitoring technique by [6], for detect the occurrence of cage rotor fractures. The detection of this type of defects can be easily obtained by observing at the vector representation of the current of the motor Park. The detection fault in induction motor is most explored because when this fault the motor keeps working with occurs appear noise and vibration. Therefore Most of the proposed techniques single processing is based on analysis of the stator currents, by using fast Fourier transform (FFT) and wavelet.

Among the works for broken bar detection is the work of [7-8] presents role Wavelet Transform (WT) for analysis the startup transient the current signals of squirrel cage induction motor with broken rotor bars [9]. Who proposes failure predictions in three phase line-operated induction machines through spectral analysis of electric and electromagnetic signals, through frequency signature of some asymmetrical motor faults [10]. Present an algorithm for the online detection of rotor bar breakage in induction motors through the use of wavelet packet decomposition (WPD) and neural networks

used by motor stator current, for extracted features with different frequency resolutions. [11] focuses on the study of an approximation signal resulting from the wavelet decomposition of the start-up stator current using neuro fuzzy logic for find the rotor bar failures.

This work is divided into three main sections, firstly we described several types fault found in machine and presented Multi-winding model for simulate and study behavior of asynchronous machines in case healthy and faults with broken bars. Secondly, it focuses on role technique single processing based on continuous wavelet which is very well adapted to study the characteristics of the fault signals. Finally we will finish by presenting the results of the fault signatures simulation and application of continuous wavelet technique (CWT) in order to detect and identify the type of defects.

# 2. DETECTION OF SEVERAL FAULTS IN INDUCTION MACHINE

#### 2.1 Broken bars

The rotor defect now accounts for about 5 % to 10 % of total rotor failure. This defect induces changes in the stator currents and therefore causes the appearance of characteristic harmonics in the spectrum of this signal. Indeed, during the failure of a bar break, flux harmonics are produced and induce current harmonics in the stator winding at frequencies around the fundamental frequency  $f_s$  for detection broken bar using components spectral the current stator these components spectral given by relation [12]:

$$f_{brb} = f_s \left(1 \pm 2ks\right) f \tag{1}$$

g: Slip.

*f*<sub>s</sub>: Stator power frequency.

k = 1.2.3.....

Figure 1 shows the four adjacent bar breaks used for the simulation study.



Figure 1. Picture show the two bar broken adjacent

#### 2.2 Bearing faults

Detecting bearing he have the rate 40-50 % of induction motors faults This type of defect will produce one of the four characteristic fault frequencies in the machine vibration depending on which bearing surface contains the fault. Most electrical machines use either ball or rolling-element bearing [13-14]. This frequency is illustrated in Figure 2.

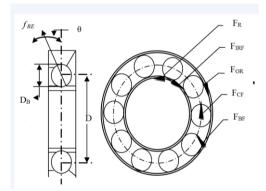


Figure 2. Dimensions and frequencies related to the characteristics bearing faults

#### 2.3 Air gap eccentricity

Air gap between stator and rotor results in eccentricity of induction motor, air gap eccentricity can be divides tow type: the static and dynamic of air-gap eccentricity. where static eccentricity when the position of minimum radial length of the air-gap is fixed in the space, in this case the rotor axis coincides with the shaft axis, but does not coincide with the stator axis. Further for dynamic eccentricity when the position of minimum radial length of the air-gap rotates with the rotor, in this case the shaft axis does not coincide with the rotor, in this case the shaft axis does not coincide with the rotor axis (the rotor does not rotate about its axis) [15-16]. This air gap eccentricity static and dynamic is illustrated in Figure 3:

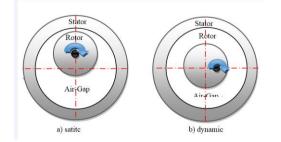


Figure 3. Air gap eccentricity illustrate tow type static and dynamic

#### **3. CONTINUOUS WAVELET TRANSFORM**

The wavelets are constructed from a "mother wavelet"  $\psi \in L^2$  (R) using a translation and expansion parameters continuously vary this time translation operator and a change of scale operator the transform used the functions [17-18]:

$$\Psi_{(a,b)}\left(X\right) = \frac{1}{\sqrt{a}}\psi\left(\frac{X-b}{a}\right) \tag{2}$$

With: a, b  $\epsilon$  R

a: Scale factor

b: Translate or space.

x: He distance is used to expand (compress or extend) the function  $\psi$ .

The wavelet continuous CWT is the technique used in this article for detection the faults.

#### 4. MULTI-WINDING MODELE MATHEMATIQUE OF THE ASYNCHRONOUS MACHINE

The application of extended Park transformation of rotor system so as to transform the system in Nr phases in a system (d,q). The mathematical model of squirrel cage induction motor can be written as:

$$[L]\frac{dI}{dt} = [V] - [R][I]$$
(3)

For Defect model of the rotor to simulate of rotor broken bars, a fault resistance  $R_{RF}$  is added to the corresponding element of the rotor resistance matrix  $R_R$  [19-20]:

$$[R_{RF}]_{N_R x N_R} = [R_R]_{N_R x N_R} - [R_F]_{N_R x N_R}$$
(4)

$$[R_{RF}] = [R_R] + \begin{bmatrix} 0 & \cdots & 0 & 0 & 0 & \cdots & \cdots \\ \vdots & \dots & \vdots & \vdots & \vdots & \vdots & \vdots & \cdots \\ 0 & \cdots & 0 & 0 & 0 & 0 & \cdots \\ 0 & \dots & 0 & R_{bk} & -R_{bk} & 0 & \cdots \\ 0 & \cdots & 0 & -R_{bk} & R_{bk} & 0 & \cdots \\ 0 & \cdots & 0 & 0 & 0 & 0 & \cdots \\ \vdots & \cdots & \vdots & \vdots & \vdots & \vdots & \cdots \end{bmatrix}$$

The new matrix of rotor resistances, after transformations, becomes:

$$[R_{RF}] = \begin{bmatrix} R_{rdd} & R_{rdq} \\ R_{rqd} & R_{rqq} \end{bmatrix}$$

where the four terms of this matrix are:

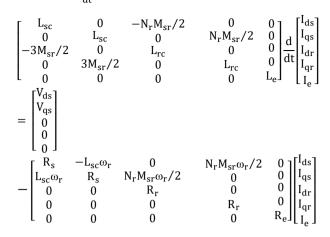
$$R_{rdd} = 2R_b(1 - \cos(a)) + 2\frac{R_e}{N_r} + \frac{2}{N_r}(1 - \cos(a))\sum_k R_{bkf}(1 - \cos(2k - 1)a)$$
(5)

$$R_{rdq} = -\frac{2}{N_r} (1 - \cos(a)) \sum_k R_{bkf} \sin(2k - 1)a \,) \quad (6)$$

$$R_{rqd} = -\frac{2}{N_r} (1 - \cos(a)) \sum_k R_{bkf} \sin(2k - 1)a \,) \quad (7)$$

$$R_{rqq} = 2R_{b}(1 - \cos(a)) + 2\frac{R_{e}}{N_{r}} + \frac{2}{N_{r}}(1 - \cos(a))\sum_{k} R_{bkf}(1 + \cos(2k - 1)a)$$
(8)

Finally. equation model the fault of induction motor can be written as:  $[L] \frac{dI}{dt} = [V] - [R][I]$ 



where:

$$\begin{bmatrix} R \\ R_s & -L_{sc}\omega_r & 0 & N_rM_{sr}\omega_r/2 & 0 \\ L_{sc}\omega_r & R_s & N_rM_{sr}\omega_r/2 & 0 & 0 \\ 0 & 0 & R_r & 0 & 0 \\ 0 & 0 & 0 & R_r & 0 \\ 0 & 0 & 0 & 0 & R_e \end{bmatrix}$$

And

$$[L] = \begin{bmatrix} L_{sc} & 0 & -N_r M_{sr}/2 & 0 & 0\\ 0 & L_{sc} & 0 & N_r M_{sr}/2 & 0\\ -3M_{sr}/2 & 0 & L_{rc} & 0 & 0\\ 0 & -3M_{sr}/2 & 0 & L_{rc} & 0\\ 0 & 0 & 0 & 0 & L_e \end{bmatrix}$$

$$L_{rc} = L_{rp} - M_{rr} + \frac{2L_e}{N_r} + 2L_e(1 - \cos(a))$$
(9)

And:

$$R_r = \frac{2R_e}{N_r} + 2Rb(1 - \cos(a))$$
(10)

The mechanical equations must also consider:

$$\frac{d}{dt}\omega = \frac{1}{j}(C_e - C_r) \tag{11}$$

With:

$$\omega = \frac{d\theta}{dt}$$

The electromagnetic torque with the expression:

$$C_e = \frac{3}{2} p. N_r. M_{sr} \left( I_{ds}. I_{qr} - I_{qs}. I_{dr} \right)$$
(12)

For observe and simulate the multi-winding mode four study the influence of broken bar faults and analyze type of the components which occurs when appear defect in asynchronous machine. Figure 4, 5 and 6, show the evolution of the electromagnetic torque and the speed of rotation and the stator current, at time 0.5 s apply torque of resistor 3.5 (N.m) in case of healthy, the curve speed rises rapidly then reaches a peak and then forms a plateau without wavy, the curve

electromagnetic there was a sudden increase tt =0.5 s, then after that Stabilizes, the curve stator current Stabilizes without wavy. In case of fault machine, the increase of the rotor bar resistance creates the proportional defects with number of broken bars. We also notice the four successive broken bars, the first at time t=1s, the second at time t=2s, and then a third at time t=3s, and fourth time t=4s. In the following Figures we notice the Figure 7 of rotational speed decreases and increase the undulations after the breaking four bar adjacent. Figure 8 of electromagnetic torque increase in the undulations, the Figure 9 are illustrated modulation of the envelope of the stator current after broken bar is proportional the number of break baradjacent.

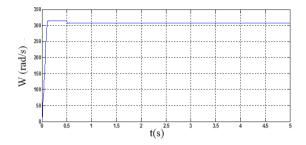


Figure 4. Speed for the healthy machine

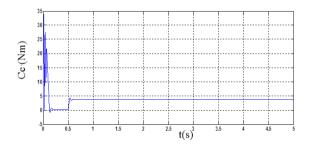


Figure 5. Electromagnetic torque for the healthy machine

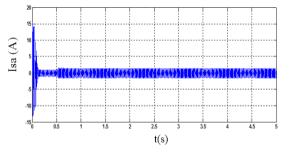


Figure 6. Stator current for the healthy machine

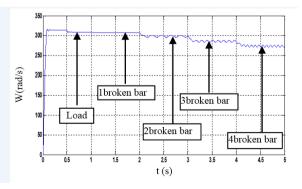


Figure 7. Rotation speed with 4 broken bars

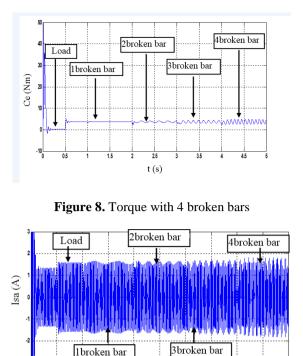


Figure 9. Stator current with 4 broken bars

t (s)

The figures illustrate the application of the continuous wavelet transform of the stator current of a phase (a) using the continuous wavelet transform (CWT), for the scales between 0 and 64 respectively and Meyer wavelet family in the case: healthy and defect (breakage of other adjacent bars at time t=1s, t=2s, t=3s, t=4s show, transformed into continuous wavelet (CWT) shows that wavelet analysis is a measure of similarity between basic functions (wavelets) and the signal itself, the similarity is in the sense of the same frequency content The calculated coefficients of (CWT) refer to the proximity of the signal to the wavelet at the current scale. a, b) in the case of a healthy state, no change in the current signal is stable, but in the case of defects (breaking one bar and two bar, three bar, four adjacent bar, a change in the coefficient can be observed in the figures (10-11-12-13-14), where the wave coefficients the motor fault are stronger than the wavelet coefficients of the healthy motor. These differences indicate that the wavelet transformation is able to detect changes in the signal components between the failed motor and the healthy motor during the start-up period. for High scales corresponds to low frequencies. and the low scales correspond to the high frequencies. As a result, the small peak of the graph corresponds to high frequency components and the broad peak corresponding to low frequency components of the signal (which appear in time before the high frequency components). The table shows the peak of the scales using analysis of the stator current by continuous wavelet (CWT).

Table 1. Shows the peak of the scales by (CWT)

Type	Broken	Broken	Broken	Broken
faults	one bar	tow bar	three bar	four bar
Peak of the scales	23.4	24.2	27.1	31.3

Absolute Values of  $C_{a,b}$  Coefficients for  $a = 1 \ 2 \ 3 \ 4 \ 5 \dots$ 

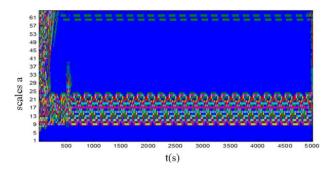


Figure 10. Stator current using Wavelet (CWT) in healthy case

Absolute Values of  $C_{a,b}$  Coefficients for  $a = 1 \ 2 \ 3 \ 4 \ 5 \ ...$ 

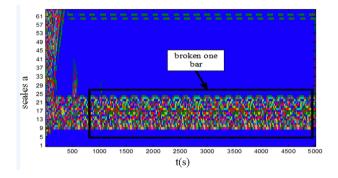


Figure 11. Stator current using Wavelet (CWT) in case broken one bar

Absolute Values of  $C_{a,b}$  Coefficients for  $a = 1 \ 2 \ 3 \ 4 \ 5 \ ...$ 

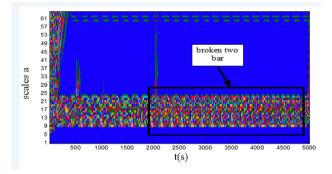


Figure 12. Stator current using Wavelet (CWT) in case broken two bar

Absolute Values of  $C_{a,b}$  Coefficients for  $a = 1 \ 2 \ 3 \ 4 \ 5 \ ...$ 

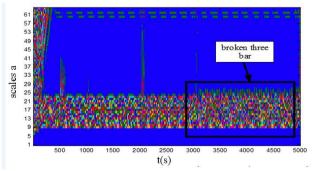


Figure 13. Stator current using Wavelet (CWT) in case broken three bar

Absolute Values of  $C_{a,b}$  Coefficients for  $a = 1 \ 2 \ 3 \ 4 \ 5 \dots$ 

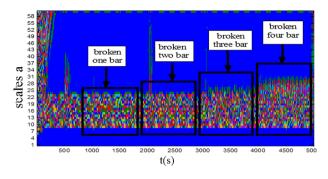


Figure 14. Stator current using Wavelet (CWT) in case broken four bar

# **5. CONCLUSIONS**

The main objective of our work is to detect and diagnose defect in the asynchronous machine through the use of a multiwinding model for simulate the break of bars and determine the behaviour of the machine in the state of healthy and defective. The increasing the breaking bars inevitably lead to deterioration of the performance and effectiveness of the machine. The advantage of the use of the signal processing allows the extraction of the information to identify and locate the defects. Also, to guarantee an operating without stop of the machine based on the use of the technique wavelet continuous transformation. the obtained simulation results show the role of this technique for detection broken bars. Further to this, to improve the fault detection, it can be used by the wavelet kind quality, to get elevated raise from detection and diagnostics effectiveness. This method is certain technology for condition monitoring and fault analysis of motors, and detects these problems at an early period and thus avoid damage and complete failure. The shortened time is guaranteed to identify malfunctions and ensure maintenance of the machine without damaging any part of the machine.

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Table 2. Appendix

Symbol	Definition	Value	
Pn	Output power	1.1	kW
Vs	Stator voltage per phase	220	V
Fs	Stator frequency	50	Hz
р	Poles pair number	1	
Rs	Stator resistance	7.58	$\Omega$
Rr	Rotor resistance	6.3	$\Omega$
Rb	Rotor bar resistance	0.15	$m \Omega$
Re	Resistance of end ring	0.15	$m \Omega$
	segment		
Lb	Rotor bar inductance	0.1	$\mu H$
Le	Inductance of end ring	0.1	$\mu H$
Lsf	Leakage inductance of	0.0265	H
-	stator		
Nr	Number of rotor bars	16	
Ns	Number of turns per stator	160	
	phase		
J	Inertia moment	0.0054	$kg m^2$
е	Air-gap mean diameter	2	mm