

# Sensorless DTC-SVM of Induction Motor by Applying Two Neural Controllers

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**Abstract**—Direct Torque Control (DTC) seems to be particularly interesting being independent of machine rotor parameters among all control methods for induction motor drives (IMD). In spite of its simplicity, DTC permit good torque control in both transient and steady state. The classic DTC drive utilizing a pair of hysteresis comparators. Those DTC drives suffer from the high torque, flux, stator current ripples and variable switching frequency. Using Space Vector Modulation (SVM) depends on the reference torque and flux is the most common solution to this problem. In this Paper two-neural controllers along with the SVM technique applied to the inverter to improve the performance of SVM\_DTC in all round way. The rotor speed is estimated by the model reference adaptive system (MRAS) scheme which is determined from measured terminal voltages and currents. The performance of the proposed system is evaluated through digital simulation using MATLAB – SIMULINK package.

**Keywords**—Induction Motor Drive; Direct Torque Control (DTC); Model Reference Adaptive system (MRAS); Space Vector Modulation (SVM); Neural PI Controller.

## I. INTRODUCTION

The Induction motors have become widely used in the industry due to their simplicity of manufacture and maintenance. Currently, many industrial applications require control of speed, position and torque. Recent advances in power semiconductor and microprocessor technology have made possible the application of advanced control techniques to alternating current (AC) motor drive systems[1].

Nowadays, the induction machine is controlled by using many strategies. One of these strategies is direct torque control (DTC).

The main advantages of DTC are robust and fast torque response, no requirements for coordinate transformation, no requirements for PWM pulse generation and current regulators [2][3]. The major disadvantage of the DTC drive is the steady state ripples in torque and flux[4].

To minimize these problems, this paper introduces a new direct torque and flux control based on space vector modulation (DTC-SVM) for IM drives. It uses closed-loop control for both flux, torque and speed in a similar manner as DTC, but the voltage is produced by an SVM unit. In this way, the DTC transient performance and robustness are preserved and the steady-state torque ripple is reduced. Additionally, the switching frequency is constant and totally under controlled[5].

In this paper, Artificial Neural Networks based on direct torque control is proposed. Here two neural controllers for both flux and torque are proposed along with space vector modulation. The neural controllers allow faster response and SVM technique provides a constant inverter switching frequency so, small torque ripples and current distortion.

## II. PRINCIPLE OF DIRECT TORQUE CONTROL

The basic functional blocks used to implement the DTC scheme in an induction motor are shown in Fig.1.

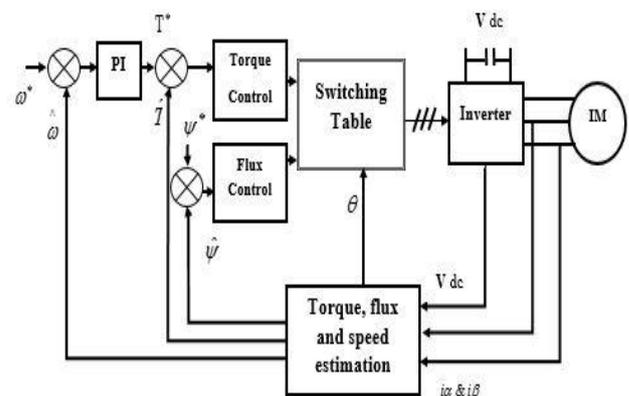


Fig. 1. Schematic of basic sensorless DTC.

### • Torque and flux estimator

The feedback flux and torque are calculated from the machine terminal voltages and currents. The computation block also calculates the sector number in which the flux vector lies [6]. The phase voltage and currents in stationary reference are given as:

$$v_{s\alpha} = v_a \text{ and } v_{s\beta} = \frac{1}{\sqrt{3}}(v_a + 2v_b) \quad (1)$$

$$I_{s\alpha} = I_a \text{ and } I_{s\beta} = \frac{-1}{\sqrt{3}}(I_a + 2I_b) \quad (2)$$

Where

$v_{s\alpha}, v_{s\beta}$  Are  $\alpha$  -axis and  $\beta$  -axis stator voltage components

$v_a, v_b$  Are the phase voltage 'a' 'b'.

$I_{s\alpha}, I_{s\beta}$  Are  $\alpha$  -axis and  $\beta$  -axis stator current components

$I_a, I_b$  Are the phase currents 'a' 'b'.

The components of stator flux are given by:

$$\varphi_{s\beta} = \int (v_{s\alpha} - R_s I_{s\alpha}) dt \quad (3)$$

$$\varphi_{s\alpha} = \int (v_{s\beta} - R_s I_{s\beta}) dt \quad (4)$$

The magnitude of the stator flux can be estimated by:

$$\varphi_s = \sqrt{\varphi_{s\alpha}^2 + \varphi_{s\beta}^2} \quad (5)$$

Where

$\varphi_{s\alpha}, \varphi_{s\beta}$  Are  $\alpha$  - axis and  $\beta$  -axis stator flux linkage components.

$R_s$  Is the stator resistance.

$\varphi_s$  Is the stator flux.

The flux vector zone can be obtained using the stator flux components .By using the flux components, current components and IM number of poles, the electromagnetic torque can be calculated by:

$$T_e = \frac{3p}{2^2} (\varphi_{s\alpha} I_{s\beta} - \varphi_{s\beta} I_{s\alpha}) \quad (6)$$

Where

$T_e$  Is the electromagnetic torque.

$p$  Is the number of pole pairs.

• *Torque and flux controller*

The instantaneous values of flux and torque are calculated from stator variables by using flux and torque estimator. The command stator flux  $\varphi^*$  and torque  $T_e^*$  magnitude are compared with their respective estimated values and the errors are processed by the hysteresis band stator flux controllers and hysteresis band electromagnetic torque controllers The flux loop controller has two levels of digital output according to following equations.

$$H_\varphi = 1 \text{ for } E_\varphi > +HB_\varphi \quad (7)$$

$$H_\varphi = -1 \text{ for } E_\varphi > -HB_\varphi \quad (8)$$

The total hysteresis band width of the flux loop controller is  $2HB_\varphi$ . The actual stator flux is constrained within the hysteresis band and tracks the command flux. The actual stator flux is constrained within this band and it tracks the command flux in zigzag path as shown in Fig.2 [7].

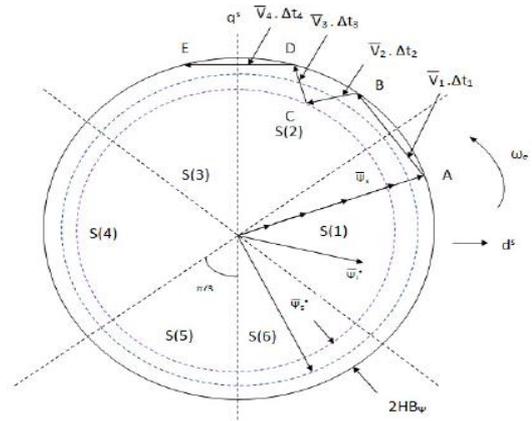


Fig. 2. Inverter Trajectory of stator flux vectors.

The torque control loop has three levels of digital output represented by the following equations:

$$H_T = 1 \text{ for } E_T > +HB_T \quad (9)$$

$$H_T = -1 \text{ for } E_T > -HB_T \quad (10)$$

$$H_T = 0 \text{ for } -HB_T < E_T < +HB_T \quad (11)$$

• *Switching table*

The switching selection block in Fig.1, receives the input signals  $H_\varphi, H_T$  and  $s(k)$  and generate the desired control voltage vector as given in look-up table shown in Table 1.

TABLE I. SWITCHING TABLE OF INVERTER VOLTAGE VECTOR

$H_\varphi$	$H_T$	$s_1$	$s_2$	$s_3$	$s_4$	$s_5$	$s_6$
1	1	$V_2$	$V_3$	$V_4$	$V_5$	$V_6$	$V_1$
	0	$V_0$	$V_7$	$V_0$	$V_7$	$V_0$	$V_7$
	-1	$V_6$	$V_1$	$V_2$	$V_3$	$V_4$	$V_5$
-1	1	$V_3$	$V_4$	$V_5$	$V_6$	$V_1$	$V_2$
	0	$V_7$	$V_0$	$V_7$	$V_0$	$V_7$	$V_0$
	-1	$V_5$	$V_6$	$V_1$	$V_2$	$V_3$	$V_4$

The inverter voltage vectors and a typical  $\varphi_s$  are shown in Fig.3. Neglecting the stator resistance  $R_s$  of the machine, we can write

$$V_s = \frac{d}{dt}(\varphi_s) \text{ or } \Delta\varphi_s = V_s \cdot \Delta t \quad (12)$$



eight space voltage vectors that contain six active voltage vectors and two zero voltage vectors. The axes of hexagon contain six active voltage vectors, and at the origin, there are two zero voltage vectors. All these are the basic space vectors. Shortly the SVM-DTC method selects one of the six nonzero and two zero voltage vectors of the inverter on the basis of the instantaneous errors in torque and stator flux magnitude. These sectors are shown in Fig.6. [5].

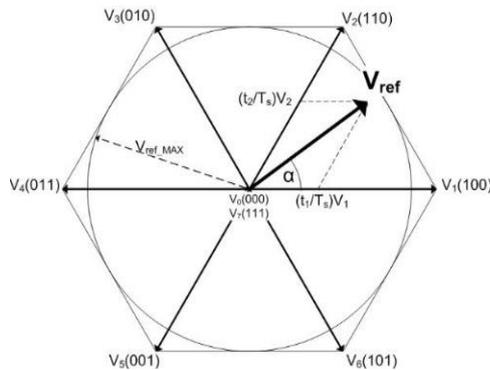


Fig. 6. Switching vectors and sector caption.

Space vector PWM can be implemented by the following steps:

- 1) Transform three phase to two phase quantity and determine  $V_s$  and angle  $\delta$ .
- 2) Determine time duration  $T_1$ ,  $T_2$  and  $T_0$ .
- 3) Calculation of switching time for each switch.

#### IV. DTC-SVM WITH ANN CONTROLLERS

The complete block diagram SVM-DTC induction motor drive with two ANN controllers are shown in fig.7. The PI controllers are being replaced by ANN controller to get better response in stator current, speed, torque and flux.

The algorithm operates with two ANN Controllers for decoupled flux and torque control. Torque error and flux error are taken as input to ANN. A two hidden layer neural network been used in this system. The structure has fifteen neurons in the in the first layer and one neuron in the second layer. Both the controllers produce a stator voltage vector component, which, forms control voltage vector in rectangular form. This is further synthesized by SVM unit and applied to IM through VSI.

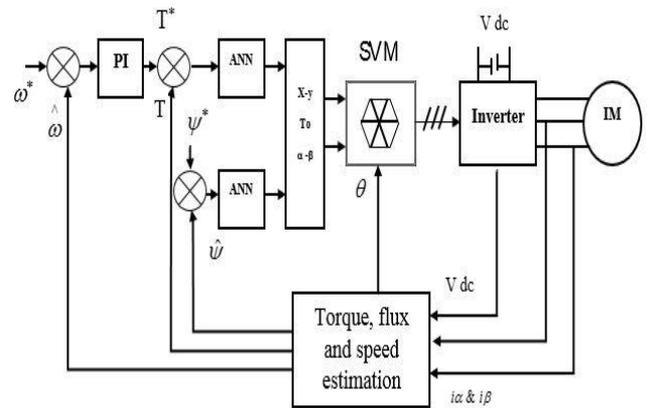


Fig. 7. Block diagram of sensorless SVM-DTC with two ANN controller.

#### V. SIMULATION MODEL OF DTC-SVM.

A direct torque control algorithm of Induction motor drive has been simulated using MATLAB/SIMULINK. The base of stator current is 12.3 A, stator flux linkage is taken as 0.3 Wb, load torque applied is 12.53 Nm and 1705 rpm for the speed. Figure 8 shows Simulink model of sensorless DTC-SVM for induction motor drive

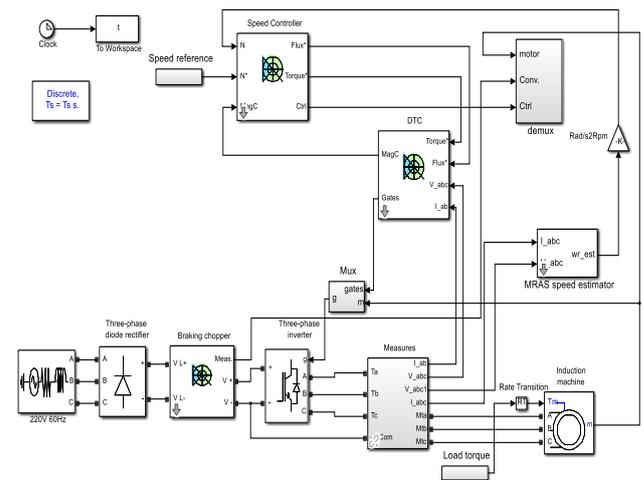


Fig. 8. Simulink model of sensorless DTC-SVM scheme of IM.

#### VI. SIMULATION RESULTS

- 1) Stator current

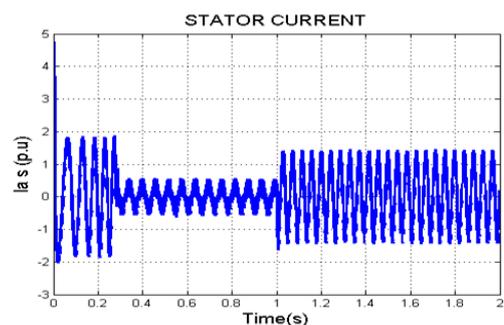


Fig. 9. Stator phase 'a' current vs. time of classic-DTC.

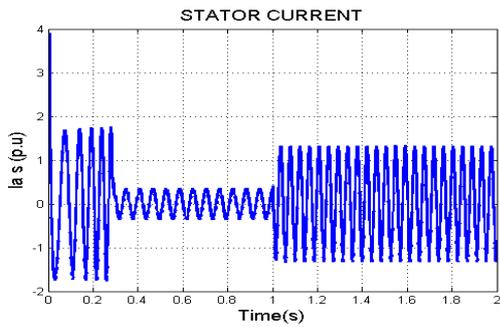


Fig. 10. Stator phase 'a' current vs. time of (DTC-SVM).

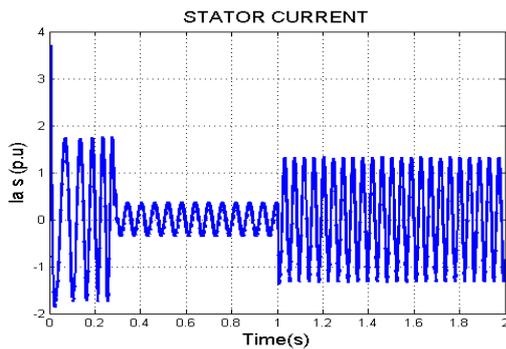


Fig. 11. Stator phase 'a' current vs. time of (DTC-SVM) with ANN controller.

Figure 9 shows Stator current in p.u for classical DTC, which has considerably very high ripple, while Fig. 10 shows Stator current in p.u for DTC-SVM which has a minimum value of ripple. Fig.11 shows Stator current in per unit for DTC-SVM with two ANN controllers. The magnitude of stator current fluctuations at last two cases is nearly the same. But the stator current in the second case tends to sinusoidal wave under faster speed. The difference of the stator current is not obvious in steady state in both cases.

2) Stator flux

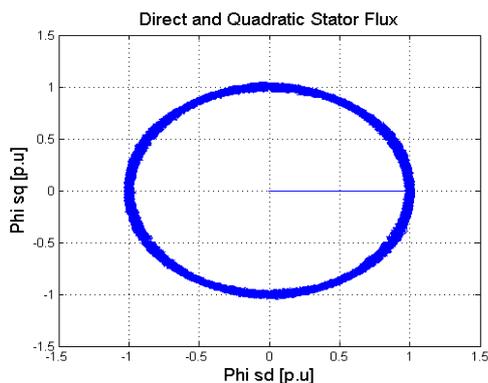


Fig. 12. Stator 'q' and 'd' flux linkages of classic-DTC.

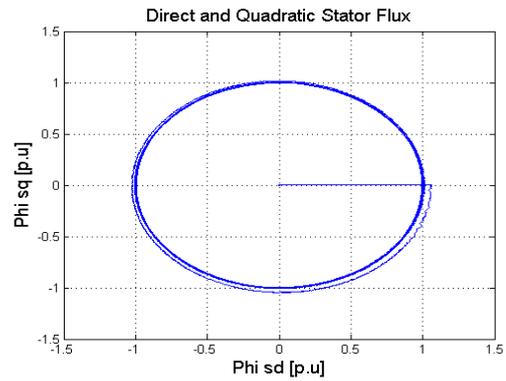


Fig. 13. Stator 'q' and 'd' flux linkages of (DTC-SVM).

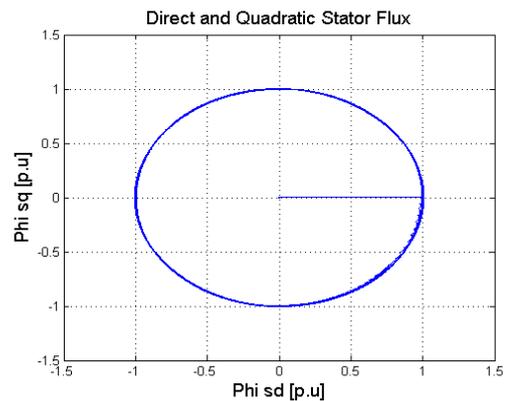


Fig. 14. Stator 'q' and 'd' flux linkages of (DTC-SVM) with ANN controller..

Figure 12 shows Stator flux circle in p.u for classical DTC, which has a large value of ripple around 0.07 p.u, while Fig.13 shows Stator flux circle in p.u for DTC-SVM which has a minimum value of ripple compared to the classic DTC, the value of ripple around 0.012 p.u. Fig.14 shows stator flux circle in p.u for DTC-SVM with two ANN controllers which has better performance than the DTC-SVM schema with PI controllers.

3) Electromagnetic torque

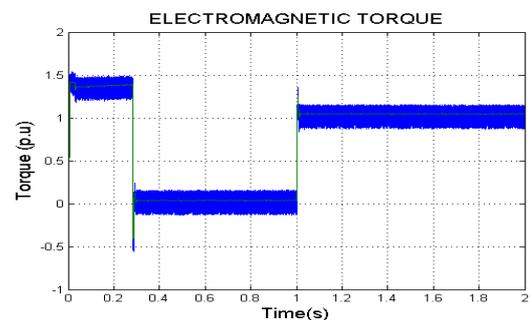


Fig. 15. Electromagnetic torque vs. time of Classic-DTC.

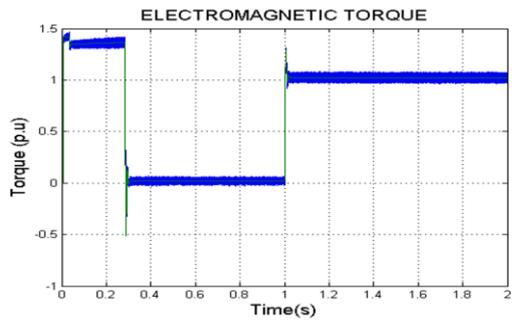


Fig. 16. Electromagnetic torque vs. time of (DTC-SVM).

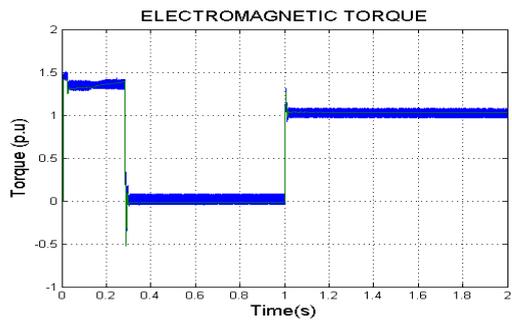


Fig. 17. Electromagnetic torque vs. time of (DTC-SVM) with ANN controller.

Figure 15 shows the electromagnetic torque in p.u for the classical DTC, which has an unaccepted ripple value of torque 0.265 p.u. Fig.16 shows electromagnetic torque in p.u for DTC-SVM. The ripple value of torque was reduced and became 0.1 p.u which is an accepted. Fig.17 shows electromagnetic torque in per unit for DTC-SVM with two ANN controllers, which has faster responses at changing of speed and electromagnetic torque.

#### 4) Comparisons Between DTC-SVM with PI & ANN Controller

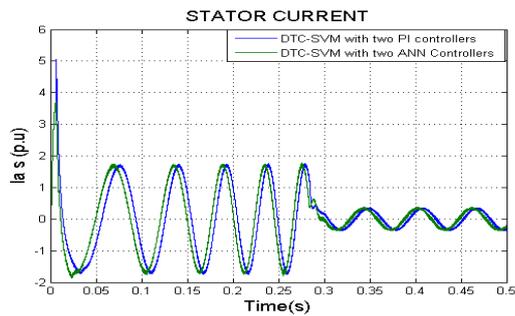


Fig. 18. Stator phase 'a' current vs. time.

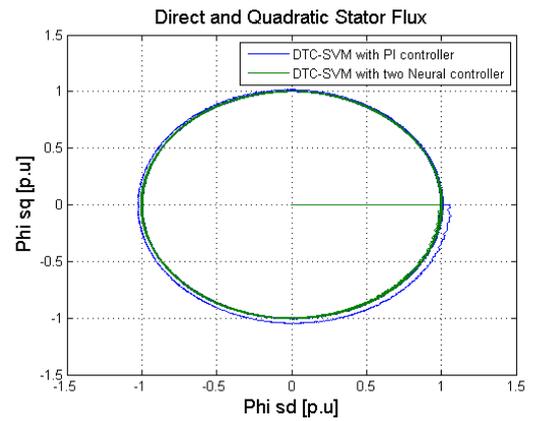


Fig. 19. Stator 'q' and 'd' flux linkages.

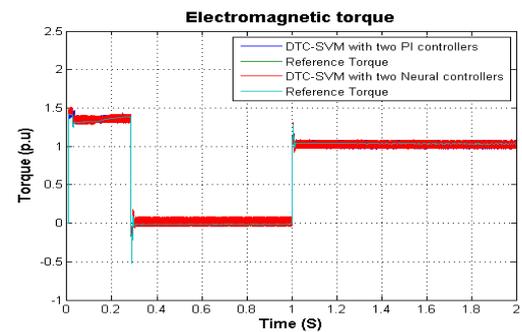


Fig. 20. Electromagnetic torque vs. time.

#### 5) Speed Estimation

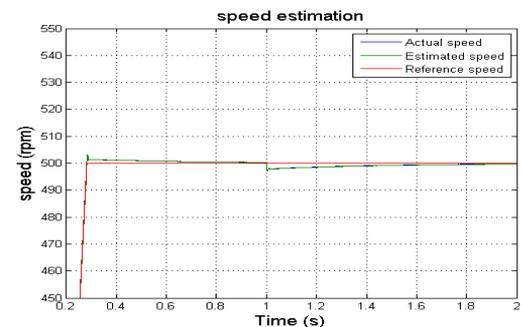


Fig. 21. Operation at various speeds; reference, actual and estimated speed.

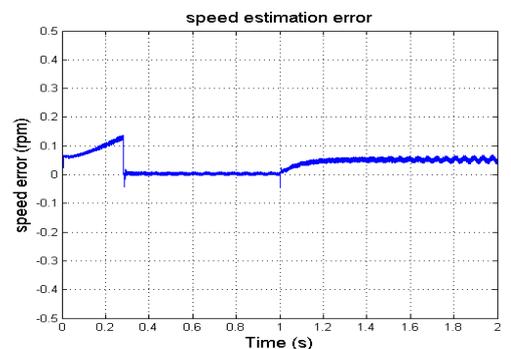


Fig. 22. Operation at speed estimation error.

VII. CONCLUSION .

In this paper a new space vector modulation based direct torque control technique with neural controllers were proposed. The main focus of this paper is to minimize the high ripples of torque, flux and stator current in the conventional DTC. The proposed control technique has been modeled and simulated in the MATLAB/SIMULINK environment. The simulation results proved that the superiority of the proposed control technique by reducing of the torque ripples about 62% and about 82% for the flux ripples. The SVM preserves constant switching frequency and ANN technique achieved fast stator current, flux and electromagnetic torque response in a transient state.

VIII. SPECIFICATION OF INDUCTION MOTOR

TABLE II. SPECIFICATION OF MOTOR

Parameter	Value
Power	2238 VA
Rated voltage	220 V
Pole pairs	2
Frequency	60 HZ
Phase	3
Stator leakage inductance	0.002 H
Rotor leakage inductance	0.002 H
Stator mutual inductance	0.0693 H
Rotor inertia	0.089(Kgm <sup>2</sup> )
Rotor friction	0.005 (Nms)
Stator resistance	0.435 Ω
Rotor resistance	0.516 Ω

IX. REFERENCES

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