Real-time implementation of SVPWM-sensorless vector control of induction motor using an extended Kalman filter

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ABSTRACT

In this research paper, space vector pulse width modulation (SVPWM)-sensorless vector control of an induction motor using an extended Kalman filter is presented. The aim of the proposed sensorless control method is to design, implement, and test a sensorless vector control scheme by simulation and experimental implementation. An extended Kalman filter (EKF) simultaneously estimates the rotor speed, the stator stationary axis components (iₐs, ϕ₀s), and the rotor fluxes (ϕ₁r, ϕ₂r). The measured stator voltages and currents are employed as inputs for a recursive filter. Simulation results under various operating conditions validate the performances and effectiveness of the proposed observer. The experimental system consists of a host computer with two subsystems: console (SC) and master (SM). The SM subsystem converts to real-time C code, and this code is uploaded into OP5600 real time digital simulation (RTDS) for real-time execution. The obtained experimental results prove that the EKF speed observer can replace the speed or position sensor. This has the benefit of reducing the drive system’s size and overall cost as well as high system reliability.

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1. INTRODUCTION

Modern industry frequently uses the squirrel cage induction machine because of its straightforward design, low cost, and robustness. Due to these advantages, this type of AC machine became a popular option for contemporary high-performance electric drives in areas where only DC motors were previously used [1]. However, the induction devices are difficult to control. This is owing to the fact that the stator current, which also contributes to the air-gap flux and is the source of the rotor current in an induction machine, which produces torque, resulting in a connection between the mechanisms that produce flux and torque [2].

Induction machine control for high performance drive applications now adheres to the field oriented control (FOC) or vector control developed by Blaschke [3] and Hasse [4]. Induction motor control based on the field orientation concept provides good performance in variable speed applications [5]–[7], as well as control properties resembling a separately excited dc machine. Although the stator current space vector can be oriented along the mutual flux, stator flux, or rotor flux, doing so alone results in a natural decoupling between the torque and flux-producing components of the stator current space vector. By using a speed estimator in...
place of the speed sensor in sensorless control approach, the costs associated with the speed sensor are eliminated. [8]–[11]. Kalman filter is a prtical choice when model has uncertainties and measurement signal is affected by Gaussian noise [12]–[21]. On the other hand, the fundamental problem with the extended Kalman filter (EKF) is that the estimate performance of the EKF is significantly impacted by the system parameters and the associated covariance matrices Q and R of the measurement noises [13]–[15].

In this paper, a recursive EKF based space vector pulse width modulation (SVPWM)-sensorless vector control of induction motor is presented. The rotor speed and flux of induction motor are estimated by EKF using the discrete time model of induction motor. Simulation and experimental implementation to validate the effectiveness of this method, simulation was carried out in MATLAB/Simulink, while the real-time implementation consist of OP5600 OPAL-RT simulator to generate the control signals (getting pulses) with sampling frequency 20 kHz, the graphical programming interfaces (MATLAB/RT-LAB). This research paper is organized as follows: section 2 presents the design and implementation of EKF speed observer, the development of space vector PWM and the anti-windup PI controller, the section 3 shows real-time platform using RT-LAB packages. The section 4 presents the results of the real-time implementation of EKF observers. At the last, the conclusion is presented in section 5.

2. DESIGN OF KALMAN FILTER OBSERVER FOR SPACE VECTOR PWM
The induction motor's time-discrete state space model can be expressed as follows [13], [22]:

$$\frac{d\mathbf{x}_{k+1}}{dt} = \mathbf{A}(\mathbf{x})\hat{\mathbf{x}}_k + \mathbf{B}u_k$$  \hspace{1cm} (1)

$$\begin{bmatrix} i_s(k+1) \\ i_r(k+1) \\ \phi_\alpha(k+1) \\ \phi_\beta(k+1) \end{bmatrix} = \begin{bmatrix} 1 + a_1 T_e & 0 & a_2 T_e & \omega(k) a_3 T_e \\ 0 & 1 + a_1 T_e & -\omega(k) a_3 T_e & a_2 T_e \\ a_3 T_e & 0 & 1 + a_5 T_e & -\omega(k) T_e \\ 0 & a_4 T_e & \omega(k) T_e & (1 + a_6 T_e) \end{bmatrix} \begin{bmatrix} i_s(k) \\ i_r(k) \\ \phi_\alpha(k) \\ \phi_\beta(k) \end{bmatrix} + 3$$

$$\begin{bmatrix} b T_e & 0 \\ 0 & b T_e \\ 0 & 0 \end{bmatrix} \begin{bmatrix} V_{s\alpha}(k) \\ V_{s\beta}(k) \end{bmatrix}$$  \hspace{1cm} (2)

$$\begin{bmatrix} i_s(k+1) \\ i_r(k+1) \end{bmatrix} = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \end{bmatrix} \begin{bmatrix} i_s(k) \\ i_r(k) \\ \phi_\alpha(k) \\ \phi_\beta(k) \end{bmatrix}$$  \hspace{1cm} (3)

where:

$$a_1 = \frac{1}{\sigma_L}; a_2 = \frac{M}{\sigma_L \tau_L}; a_3 = \frac{M}{\sigma_L \tau_L}; a_4 = \frac{1}{\tau_r}; a_5 = \frac{C_{\alpha\alpha}}{f}; a_6 = \frac{f}{f}; a_7 = \frac{\rho M}{J_L \tau_L}; a_8 = \frac{1}{\sigma_L}$$

The EKF algorithm primarily consists of two main stages: a filtering stage and a prediction stage. During the prediction stage, the subsequent predicted values of the states are derived by applying a mathematical model as well as the past values of estimated states. Prior to the new measurement, the predicted state covariance matrix is also obtained [14]. The system covariance matrix Q and the time-discrete state space model of the induction motor are both employed. The subsequent estimated states $\hat{\mathbf{x}}(k+1)$ are generated from the predicted estimates $\mathbf{x}(k+1)$ by adding a correction term $K_f(y_{k+1} - \hat{y}_{k+1})$ to the expected value during the filtering step, where $e = (y_{k+1} - \hat{y}_{k+1})$, the error term uses the measured stator currents.

$$\frac{d\mathbf{x}_{k+1}}{dt} = \mathbf{A}(\mathbf{x})\hat{\mathbf{x}}_k + \mathbf{B}u_k + K_f(y_{k+1} - \hat{y}_{k+1})$$  \hspace{1cm} (4)

Figure 1 depicts the EKF's structural layout.
Figure 1. Structure of the EKF

Figure 2 shows the principle of SVPWM, in which a half-bridge three-phase inverter’s \( \vec{V}_1, \vec{V}_2, \vec{V}_3, \vec{V}_4, \vec{V}_5 \) and \( \vec{V}_6 \) consists of six sectors with a length of 60° each and six basic voltage space vectors that are nonzero [17]. Space vector PWM is used to create the reference vector \( \vec{V}_s \), which represents three-phase sinusoidal voltage, by switching between the two nearest active vectors and zero vectors [15], [23]. Consider Figure 3, which shows the positions of several accessible space vectors and the reference vector in the first sector, to determine the duration of application for different vectors.

The active space vector application’s times are as:

\[
T_1 = \frac{\sqrt{3}}{2} m T_s \sin (60 - \alpha) \tag{5}
\]

\[
T_2 = \frac{\sqrt{3}}{2} m T_s \sin (\alpha) \tag{6}
\]

\[
T_0 + T_7 = T_s - (T_1 + T_2) \tag{7}
\]

where \( m \) is the modulation index, \( \alpha \) is position of the reference vector or the angle and \( T_0, T_1, T_2 \) are time of application of zero vectors, vector \( \vec{V}_1 \), vector \( \vec{V}_2 \) respectively. The main objective of induction motor vector control is the separate the control of flux and torque, which is accomplished by employing a d-q rotating reference frame synchronised with the rotor flux space vector. the (q) component of rotor flux will be zero when the field orientation law is applied [12], [24].

\[
\begin{cases}
\phi_{dq} = \phi_r \\
\phi_{qf} = 0
\end{cases} \tag{8}
\]
The expression of the electromagnetic torque becomes (9).

\[ T_e = \frac{3}{2} P \frac{l_m \Phi_r}{l_r} i_{qs} \]  

(9)

The current components become (10).

\[
\begin{align*}
    i_{ds}^* &= \frac{\Phi_r^*}{l_m} \\
    i_{qs}^* &= \frac{l_r T_e}{\rho l_m \Phi_r^*}
\end{align*}
\]  

(10)

The angular speed of the rotor flux \( \omega_s \) becomes (11).

\[ \omega_s = \frac{R_r i_{d_s}^*}{l_r i_{d_s}^*} + P\Omega = \omega_{sl} + P\Omega \]  

(11)

The scheme of the field-oriented control and the proposed EKF observer are shown in Figure 4.

![Figure 4](image)

**Figure 4.** Global diagram of sensorless vector control of IM with SVPWM

When there is a significant step change in the speed reference, the PI controller typically ignores the system's physical constraints, which causes the phenomena known as windup to provide subpar results. The saturation of the pure integrator causes the wind-up phenomenon is thus cancelled using an anti-windup approach in this case [18], [25]. The figure 5 shows synoptic scheme of the anti-windup PI controller of the motor speed.

![Figure 5](image)

**Figure 5.** Diagram block of the anti-windup PI controller
3. REAL-TIME PLATFORM USING RT-LAB

Figures 6 shows the photo of the test bench and its synoptic scheme is shown in figure 7. This platform uses OPAL-RT real-time simulator. One Drivelab OPAL-RT Board and one OP5600 OPAL-RT Simulator are now installed at the CAOSEE Laboratory at Bechar University [21], [26], [27]. RT-LAB is employed to build the SM subsystem which is converted into C code by using the Real-Time-Works hop (RTW). The algorithm of the control and observer are validated in Matlab/Simulink of the host computer. And the code is upload by the OP5600 via target network connections and the TCP/IP Protocol [19], [25].

![Figure 6. Photo of the realized test bench](image)

**Figure 6. Photo of the realized test bench**

![Figure 7. Synoptic scheme of the test bench](image)

**Figure 7. Synoptic scheme of the test bench**

4. EXPERIMENTAL RESULTS AND DISCUSSIONS

The sampling time has been set at 400 μs. The different given responses are obtained from digital oscilloscope with 4 channels. Figures 8 and 9 show actual speed and estimated speed run up to 350 rad/sec in the startup (1div=87 rad/sec), the performance of EKF is very high (the real and estimated speed are in superposition) as seen in these figures even with load charge application at 2 sec, the anti-windup PI speed controller reacts very fast in term of load charge rejection, it’s seen also that the estimation error converge to zero in steady state.

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For the different situations, transient speed tracking at starting and at steady state, the EKF speed observer performances are quite acceptable. In addition, the direct current (1div=A) is stabilized at its reference value, while the quadratic current (1div=A) is an image of the electromagnetic torque evolution. These results in Figure 10, Figure 11, afforded a good decoupled vector control between torque and rotor flux.

The zoom of measured and the observed currents of the motor in the reference frame (α, β) are presented in Figure 12, it can be seen that the observed current is superposed on the measured one with sinusoidal waveforms. Figure 13 shows the flux axes (real and estimated) components (1div=Wb), the waveforms are identical to each other with reduced ripple due to space vector pulse width modulation (SVPWM). Figure 14 illustrated the rotor flux angle of the estimated one.

It is shown in Figure 15 for various step changes in the reference, EKF speed observer sensorless control under high (400 rad/sec)/medium (250 rad/sec) speed applications respectively. The reference speed gradually increased and decreased (350, 250, 400, 250, 350 rad/sec) during 19 sec. In these tests the estimated speed is used as feedback signal for closed-loop sensorless control while reference variation, the estimation error between the estimated and measured speeds shown in Figure 16, this error equals to zero in steady state.

In this final test, the induction motor is run at no load, it’s accelerated from 0 to 350 rad/sec at 0.8 sec, then the load is applied at 2 sec and unloaded at 4 sec, after that the speed is reversed at 6 sec, then also reversed again at 9 sec as shown in Figure 17, it’s obvious that the proposed EKF observer presents good performances in the term of sense reversing and zero speed crossing. The use of anti-windup PI controller improve the system performances, it’s clear that the speed follows rapidly the set reference without significant overshoot and static error. Figure 18, presents the estimation error between the two speeds approximately neglected. On the whole the experimental results were very positive, the proposed SVPWM-sensorless vector control of IM can achieve good performances for (direct, variable, and reverse) sense operations.
Figure 12. Zoom of observed and the measured currents

Figure 13. Zoom of estimated and real rotor fluxes

Figure 14. Position of estimated rotor flux

Figure 15. Speed variation test

Figure 16. Estimation error for speed variation test

Figure 17. Estimated rotor speed with double speed sense reversing test
5. CONCLUSION

Simulation and experimental validation of the SVPWM-Sensorless vector control of induction motor using an extended Kalman has been presented in this paper. Generally it is known that the mechanical sensors are costly, fragile and degrade the system reliability particularly in hostile environments, therefore sensorless control operating without speed sensor has the advantages of reduced hardware complexity, lower cost and high system reliability. In the design of the EKF speed observer we use the discrete model of induction motor and the covariance matrix of prediction error has been calculated for the deterministic equation, the rotor speed and rotor fluxes have been estimated. The simulation studies carried out in MATLAB/Simulink, have confirmed the efficacy of this approach, the real-time implementation was done on the OP5600 real time digital simulation (RTDS), using rapid control prototyping system, and the experimental waveforms show that the estimated speed matches the real speed closely in all mode of operation. In the addition anti-windup PI speed controller is introduced in our technique to have fast response and overshoot suppression. It’s concluded from the results presented in this research paper that the proposed algorithm based EKF speed observer performs well for operating regimes.

REFERENCES


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