













PI controller.

Figures 10 and 11 shows the output current and voltage from the boost, these quantities ensure the power supply to the vehicle after the conversion of the DC bus through the inverter to supply the induction motor controlled by the ANNDTC.

Figures 12, illustrate stator current of IM, oscillations appear at each period corresponding to changes in vehicle speeds. The Figure 13 shows the stator flux, at the beginning of the operation the amplitude of the flux vector increases.

Then, the amplitude remains constant and equal to its reference value with a low ripple, thus revealing a correct regulation of the flux decoupled from that of the torque during the transient regimes.

The control strategy with the ANN let the dc bus voltage and the current always maintained constant with high performance compared with the PI controller.

From these results, it can be said that the training system meets the shifting requirements at different levels.

## 5. CONCLUSIONS

This work presented a detailed dynamic model of an EV that is associated with a DTC control use the ANN strategy for an induction motor drive.

The design method for Direct Torque Control of induction motor using Artificial Neural Network Controller replacing the PI regulator block have been successfully developed and implanted in MATLAB-Simulink environment. The performance of the speed motor electromagnetic torque behavior of the motor model using Neural Network Controller replacing both PI controller of Conventional DTC of IM have been evaluated and compared to use in electric vehicle drives. The results of simulation show that the proposed ANN for DTC provides better performance than that of conventional DTC technique use the PI regulator. The Proposed regulator based DTC significantly and easily tracks the reference speed and torques thereby improves the efficiency of speed-torque of induction motors with faster responses for fast changing of speed reference and torque as that of Electric Vehicles in any uneven roads conditions. The proposed ANN models are also simple and can be implemented easily with DSP or Dspace platform.

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$F_w$	Road load force, N
$g$	gravity acceleration, $m.s^{-2}$
$G$	Gear speed ratio
$i$	Transmission ratio
$I_{bat}$	Battery Current
IM	Induction Motor
$J$	Total inertia (rotor and load), $kg\ m^2$
$L (Lm)$	Inductance (magnetizing inductance)
$m$	vehicle total mass, kg
$p$	pole-pair number
$P_{bat}$	Battery Power
PI	Proportional Integral Controllers
$P_v$	Vehicle driving power, W
PWM	Pulse-Width Modulation
$r$	tire radius, m
$R$	Resistance, $\Omega$
$ref$	Reference
$ref^*$	Reference index
Rpm	Revolutions per minute
$S1, S2$	Duty Ratio
$SS$	System Storage
$T_B$	Load torque accounting for friction
$T_{em}$	Electric motor torque
$T_L$	Load torque
$T_r$	Rotor time constant ( $T_r = L_r/R_r$ )
$T_s$	Stator time constant ( $T_s = L_s/R_s$ )
$v$	Vehicle speed, m/s
$V (I)$	Voltage (current), V(A)
$V_{bat}$	Battery Voltage
$\alpha$	Road angle slope, rad
$\delta$	Steering angle, rad
$\eta_t$	Transmission efficiency
$\xi$	air density, $kg/m^3$
$\sigma$	Leakage coefficient, $\sigma = 1 - L^2 m/L_s L_r$
$\phi$	Flux of motor, Wb
$\omega_r$	Electric motor mechanical speed, rad/s
$\omega_r^*$	Reference Electric motor mechanical speed, rad/s

## NOMENCLATURE

$\mu$	dynamic viscosity, $kg\ m^{-1}.s^{-1}$
AC	Alternating Current
$A_f$	frontal surface area of the vehicle, $m^2$
ANNC	Artificial Neural Network Control
$C_w$	aerodynamic drag coefficient,
d, q	Synchronous reference frame index
DC	Direct Current
DTC	Direct Torque Control
EVs	Electric Vehicles
$F_{add}$	Aerodynamic drag force
FC	Fuel Cell
$F_{cr}$	Climbing and downgrade resistance force
$F_{ro}$	Rolling resistance force, N
$F_{sf}$	Stokes or viscous friction force, N

## Appendix

**Table 2.** Induction motor parameters

Components	Rating values
Rated power	38 kW
Stator resistance	$R_s=0.01965\ \Omega$
Rotor resistance	$R_r=0.01909\ \Omega$
Stator/rotor inductance	$L_s=L_r=0.0397\ H$
Mutual inductance	$L_m=1.354\ H$
Moment of inertia	$J=0.09526\ Kg.m^2$
Viscous friction	$f=0.05479\ N.m/rad/sec$
Number of pole pairs	$p=2$