

Fig. 1 Flow diagram of the proposed system

The Fuel Cell Stack block provides a generic model that represents hydrogen and air-fueled fuel cell stacks. The graphic below depicts an electrical model of a fuel cell that runs on a fuel flow rate. A basic model and a comprehensive model are the two blocks that make up the stack model. To transition between the two models, choose the level in the mask under Model detail level in the block dialogue box. The simulink model and corresponding circuit for the fuel cell are illustrated in Fig 2 and 3.

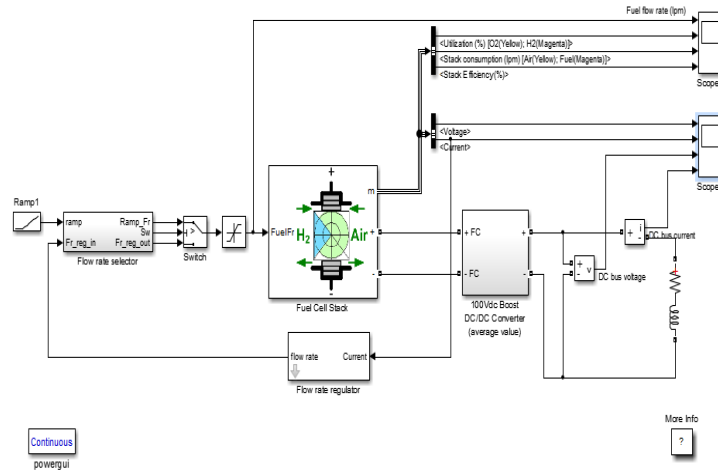


Fig. 2 Modellig of Fuel cell

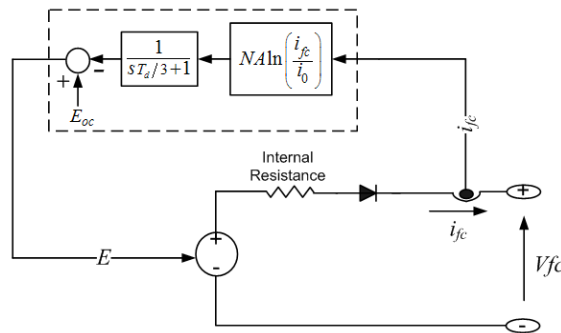


Fig. 3. Fuel cell equivalent circuit

The performance of the single FC cell based on single FC current, voltage and power relationships is given in Fig. 4.

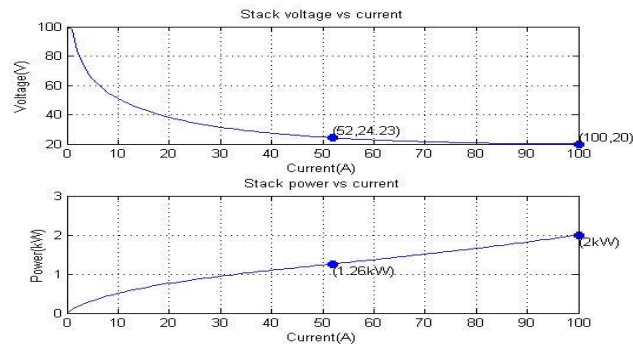


Fig. 4 Performance curve for single FC

The parameter selected for the simulation of the FC are described in the Table 1. The proposed system consider stack of 8 FCs to fulfill the power requirement.

Table 1: fuel cell simulation parameters

Parameter	Specification
Type of cell	Proton Exchange Membrane Fuel Cell (PEMFC)
Number of Cells	8
Nominal Stack efficiency (%)	55%
Voltage range	98- 100v
Working temperature (Celsius)	65 degree
Nominal Air flow rate (lpm)	300
Nominal air supply pressure (bar)	1 bar
Nominal fuel supply pressure (bar)	1.5 bar
H2	99.92%
O2	21 %
H2O	1 %

The battery block provides a generic dynamic model that characterizes rechargeable batteries. The battery specifications are given in table 2.

Table 2. Battery specifications

Parameter	Value
Nominal Discharge Current (d)	1.3 A
Internal Resistance	2 mΩ
Rated Capacity	6.5 Ah
Nominal Voltage (a)	1.18 V
Maximum Capacity (b)	7 Ah (5.38 h * 1.3 A)
Exponential Capacity (e)	1.3 Ah
Nominal Voltage (a)	1.18 V
Capacity @ Nominal Voltage (a)	6.25 Ah
Exponential Voltage (e)	1.28 V
Fully Charged Voltage (c)	1.39 V

Equation 1 and 2 are used for modeling of the lithium-ion battery type considering charging ($i^* < 0$) and discharging ($i^* > 0$) mode.

$$f_1(it, i^*, i) = E_0 - K \frac{Q}{Q - it} i^* - K \frac{Q}{Q - it} it - A \cdot e^{-B \cdot it} \quad (1)$$

$$f_1(it, i^*, i) = E_0 - K \frac{Q}{Q - 0.1Q} i^* - K \frac{Q}{Q - it} it - A \cdot e^{-B \cdot it} \quad (2)$$

The range of various input and output variables considered for energy management of HEV such as SOC, upload, and PFC are given in Table 3-4. Total twenty rules are constructed for the control action generation of fuzzy logic-based energy management of HEV as given in Table 5.

TABLE 3. INPUT VARIABLES FOR FUZZY BASED EMS FOR HEV

Input Variable	Level	Range (%)
SOC	VL	0-40
	L	30-60
	M	50-80
	H	70-100
Pload	N	-1000-0
	VL	0-500
	L	400-1000
	M	900-1500
	H	1400-2000

The membership equations for the battery SOC are described in Equations 3-6. The SOC is split into different variables such as very low (VL), Low (L), medium (M), and high (H) with trapezoidal membership function (TMF).

$$SOC_{VL}(x) = \begin{cases} 1 & 0 \leq x \leq 30 \\ \frac{40 - x}{10} & 30 < x \leq 40 \end{cases} \quad (3)$$

$$SOC_L(x) = \begin{cases} \frac{x-30}{15} & 30 \leq x < 45 \\ \frac{60-x}{10} & 45 \leq x \leq 60 \\ 1 & 60 \leq x \leq 100 \end{cases} \quad (4)$$

$$SOC_M(x) = \begin{cases} \frac{x-50}{10} & 50 \leq x \leq 60 \\ 1 & 60 \leq x \leq 70 \\ \frac{80-x}{10} & 70 \leq x \leq 80 \end{cases} \quad (5)$$

$$SOC_H(x) = \begin{cases} \frac{x-70}{10} & 70 \leq x \leq 80 \\ 1 & 80 \leq x \leq 100 \end{cases} \quad (6)$$

The membership equations for the Load demand (PLoad) are described in Equations 7-11. The upload is divided into different variables such as no-load (N), very low (VL), Low (L), medium (M), and high (H) with trapezoidal TMF.

$$PLoad_N(x) = \begin{cases} 1 & -1000 \leq x \leq 0 \\ \frac{50-x}{50} & 0 \leq x \leq 50 \end{cases} \quad (7)$$

$$PLoad_{VL}(x) = \begin{cases} \frac{x-50}{50} & 0 < x \leq 50 \\ 1 & 50 \leq x \leq 400 \\ \frac{500-x}{100} & 400 \leq x \leq 500 \end{cases} \quad (8)$$

$$PLoad_L(x) = \begin{cases} \frac{x-450}{50} & 450 < x \leq 500 \\ 1 & 500 \leq x \leq 800 \\ \frac{1000-x}{200} & 800 \leq x \leq 1000 \end{cases} \quad (9)$$

$$PLoad_M(x) = \begin{cases} \frac{x-900}{1000} & 900 < x \leq 1000 \\ 1 & 1000 \leq x \leq 1400 \\ \frac{1500-x}{100} & 1400 \leq x \leq 1500 \end{cases} \quad (10)$$

$$PLoad_H(x) = \begin{cases} \frac{x-1400}{100} & 1400 < x \leq 1500 \\ 1 & 1500 \leq x \leq 2000 \end{cases} \quad (11)$$

TABLE 4. OUTPUT VARIABLES FOR FUZZY BASED EMS FOR HEV

Output Variable	Level	Range (W)
PFC	Z	0-100
	L	50-300
	M	250-500
	H	450-650

The membership equations for the FC power control variable (PFC) are described in Equations 12-15. The upload is divided into different variables such as zero (Z), Low (L), medium (M), and high (H) with TMF.

$$PFC_Z(x) = \begin{cases} 1 & 0 \leq x \leq 50 \\ \frac{80-x}{30} & 50 \leq x \leq 80 \end{cases} \quad (12)$$

$$PFC_L(x) = \begin{cases} \frac{x-50}{50} & 50 < x \leq 100 \\ 1 & 100 \leq x \leq 200 \\ \frac{300-x}{50} & 250 \leq x \leq 300 \end{cases} \quad (13)$$

$$PFC_M(x) = \begin{cases} \frac{x-250}{50} & 250 < x \leq 300 \\ 1 & 300 \leq x \leq 450 \\ \frac{500-x}{50} & 450 \leq x \leq 500 \end{cases} \quad (14)$$

$$PFC_H(x) = \begin{cases} \frac{x-400}{100} & 400 < x \leq 500 \\ 1 & 500 \leq x \leq 650 \end{cases} \quad (15)$$

TABLE 5. RULES FOR FUZZY BASED EMS FOR HEV

Fuzzy Rule Base		
Input		Output
SOC	Pload	PFC
VL	N	Z
VL	VL	L
VL	L	M
VL	M	H
VL	H	H
L	N	Z
L	VL	L
L	L	M
L	M	M
L	H	H
M	N	Z
M	VL	Z
M	L	L
M	M	L
M	H	M
H	N	Z
H	VL	Z
H	L	Z
H	M	L
H	H	L

SIMULATION RESULTS AND DISCUSSIONS

The anticipated system is simulated using MATLAB R2018b on the personal computer having a core i5 processor with 2.84 GHz speed and 8GB RAM. The schematic of the anticipated EMS system is illustrated in Fig. 5.

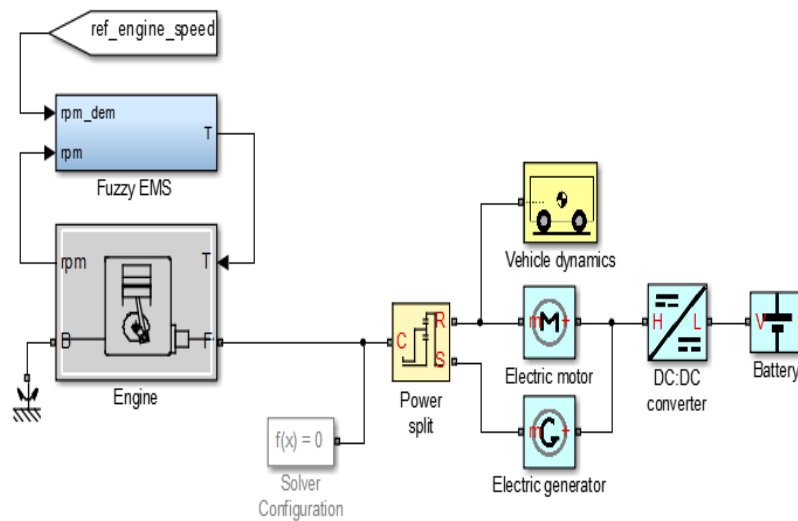
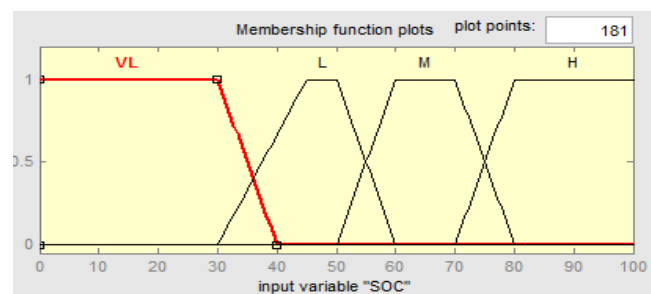


Fig. 5 Simulink schematic of the proposed system

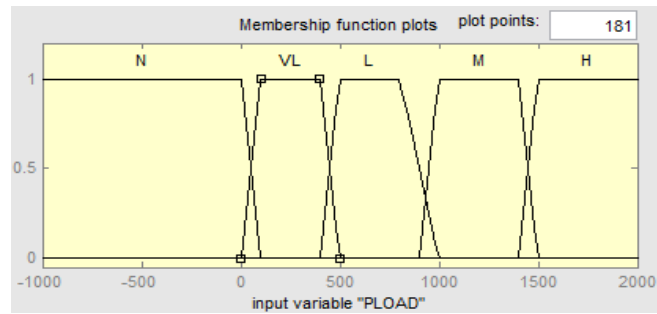
Table 6 gives a detailed description of the various electrical parameters and vehicle dynamics used for the simulation.

Table 6: Electrical parameter and vehicle dynamics specifications

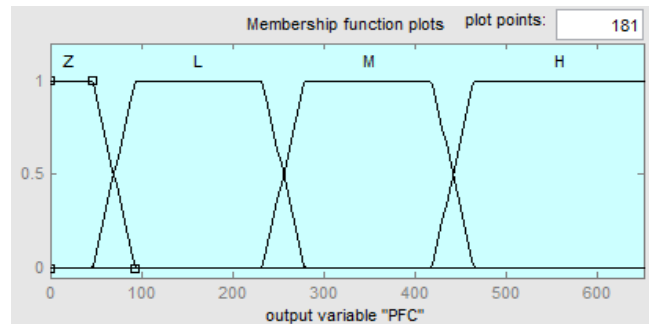
Parameter	Value	Unit
Battery Capacity	20	Ah
Battery Nominal Voltage (Max)	300	V
Converter Output Voltage	500	V
Motor Efficiency	94	%
Maximum Motor Torque	450	Nm
Motor Maximum Power	100	kW
Vehicle mass	1000	Kg
Tire radius	0.25	m
ICE Maximum Power	100	kW



a)



b)



c)

Fig. 3 Visualization of Fuzzy membership functions for input and output variables a) SoC b) PLoad c) PFC

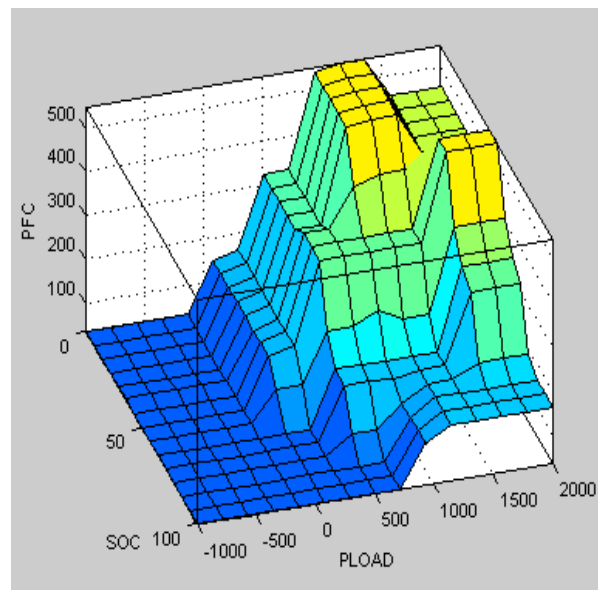


Fig. 6. Surface plot for SOC vs PFC vs PLOAD

The visualization of Fuzzy membership functions for input and output variables and surface plot for SOC vs PFC vs PLOAD is shown in Fig. 5 and 6. The surface plot depicts that when the load is higher and the battery SOC is lower then it shows the need of turning ON of fuel cell. When the load is lower and SOC is higher then it indicates that the fuel cell can be turned OFF.

The consequences of the system is estimated for the different random SOC and PLoad condition that results in 96.00% accuracy. Some of the sample control conditions for distinct input conditions are illustrated in Fig. 7-8.

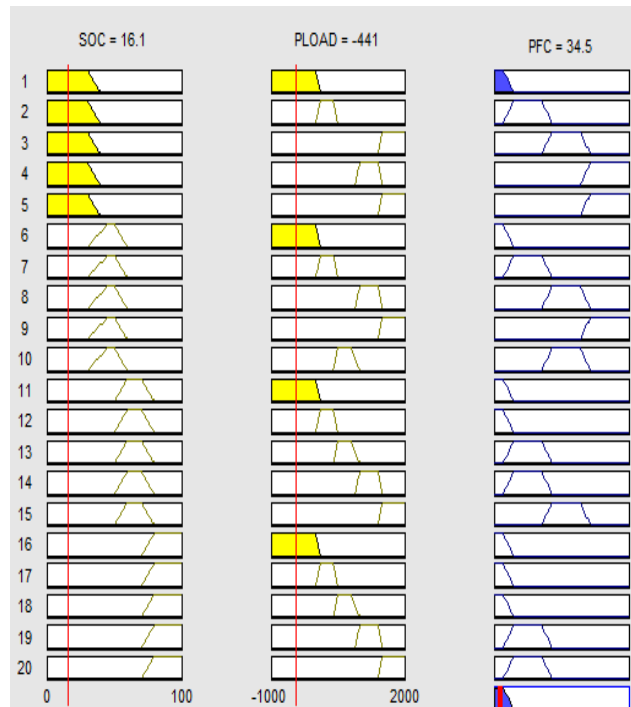


Fig. 7. Fuzzy rule viewer for very low PFC (34.5) for input variables SOC=16.1% and Pload=-441

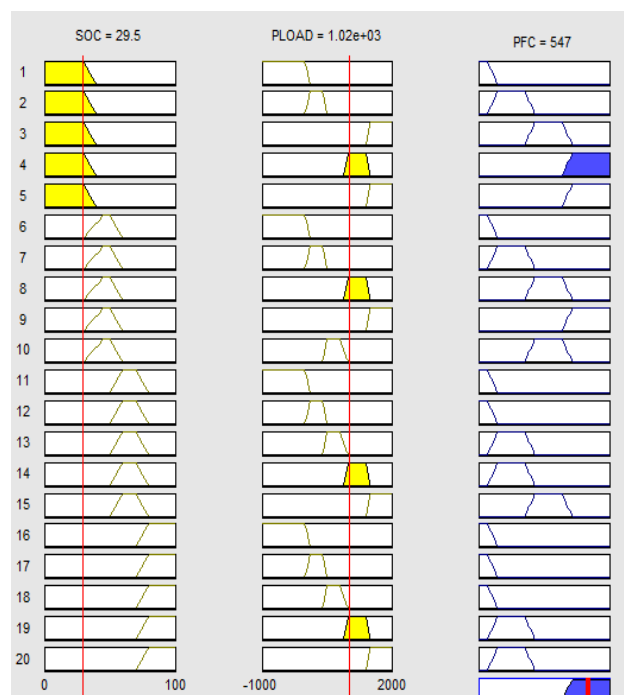


Fig. 8. Fuzzy rule viewer for very high PFC (547) for input variables SOC=29.5%, and Pload=1020

The outcomes of the proposed EMS model is authenticated for the different values of the SOC and Load demand and it is observed that it is able to provide the power to the HEV for longer duration as shown in Fig. 9. The system uses the FC power source in critical conditions only that helps to minimize the fuel cost.

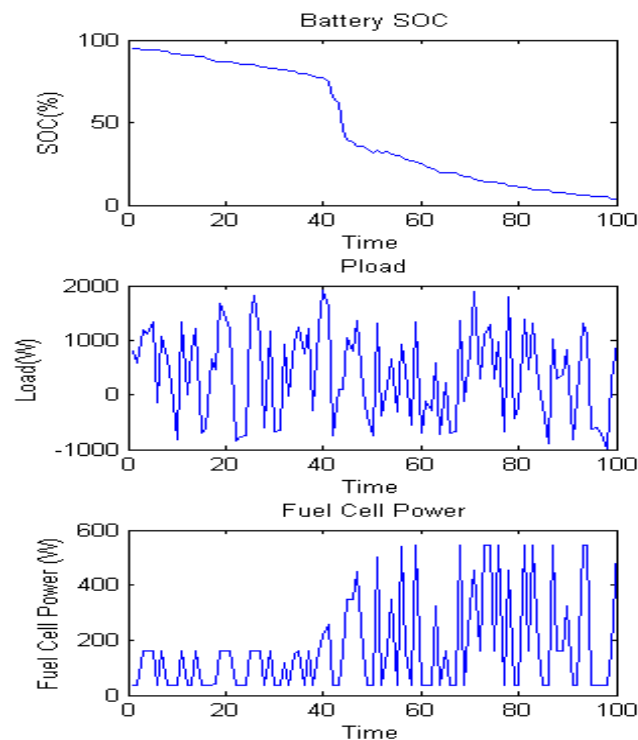


Fig. 9 Proposed EMS control scenario

CONCLUSIONS AND FUTURE SCOPE

Thus, this paper offers a fuzzy logic-based EMS for a hybrid electrical vehicle based on battery SOC, different vehicle dynamics and driving conditions. It provides the precise control of the FC power based on battery SOC and load profile by considering different vehicle conditions such as vehicle dynamics, atmospheric pressure, etc. The fuzzy logic-based EMS provides efficient and automatic control of the power flow in a HEV. The fuzzy logic based EMS provides simple rule base EMS that is simple to implement on the hardware platform and provides lesser computational efforts. It provides multi-objective control of the vehicle speed in various driving conditions. In the future, various renewable energy sources can be used to charge the battery.

References

- [1] Ostadian, R., Ramoul, J., Biswas, A., Emadi, A.: Intelligent EMSs for Electrified Vehicles: Current Status, Challenges, and Emerging Trends. *IEEE Open Journal of Vehicular Technology*, (2020).
- [2] Nazari, S., Borrelli, F., & Stefanopoulou, A. (2020). Electric Vehicles for Smart Buildings: A Survey on Applications, Energy Management Methods, and Battery Degradation. *Proceedings of the IEEE*, 109(6), 1128-1144.
- [3] Tran, D. D., Vafaeipour, M., El Baghdadi, M., Barrero, R., Van Mierlo, J., & Hegazy, O. (2020). Thorough state-of-the-art analysis of electric and hybrid vehicle powertrains: Topologies and integrated energy management strategies. *Renewable and Sustainable Energy Reviews*, 119, 109596.
- [4] Zandi M, Payman A, Martin JP, Pierfederici S, Davat B. Energy management of a fuel cell/supercapacitor/battery power source for electric vehicular applications. *IEEE Trans Veh Technol* 2011;60(2):433–43.
- [5] Zhou D, Al-Durra A, Gao F, Ravey A, Matraji I, Simões MG. Online energy management strategy of fuel cell hybrid electric vehicles based on data fusion approach. *J Power Sources* 2017;366:278–91.
- [6] Hwang JJ, Chang WR. Life-cycle analysis of greenhouse gas emission and energy efficiency of hydrogen fuel cell scooters. *Int J Hydrogen Energy* 2010;35:11947–56.

- [7] Payman A, Pierfederici S, Meibody-Tabar F. Energy control of supercapacitor/fuel cell hybrid power source. *Energy Convers Manage* 2008;49(6):1637–44.
- [8] Kisacikoglu MC, Uzunoglu M, Alam MS. Fuzzy logic control of a fuel cell/battery/ ultracapacitor hybrid vehicular power system. In: *Proc. IEEE vehicle power and propulsion conference*, p. 591–96, 2007.
- [9] Marzougui H, Amari M, Kadri A, Bacha F, Ghouili J. Energy management of fuel cell/battery/ultracapacitor in an electric hybrid vehicle. *Int J Hydrogen Energy* March 2017;42:8857–69.
- [10] Ansarey M, Panahi MS, Ziarati H, Mahjoob M. Optimal energy management in a dual-storage fuel-cell hybrid vehicle using multi-dimensional dynamic programming. *J Power Sources* 2014;250:359–71.
- [11] Amari M, Bacha F, Ghouili J, Elgharbi I. Design and analysis of high-frequency DCDC converters for fuel cell and super-capacitor used in electrical vehicle. *Int J Hydrogen Energy* 2014;39(03):1580–92.
- [12] Wong J, Idris N, Anwari M. Parallel configuration in energy management control for the fuel cell-battery ultracapacitor hybrid vehicles. *IEEE Appl Power Electron Colloquium* 2011.
- [13] Sarioglu IL, Klein OP, Schroder H, Kucukay F. Energy management for fuel-cell hybrid vehicles based on specific fuel consumption due to load shifting. *IEEE Trans Intell Transp Syst* 2012;13(4):1772–81.
- [14] Zhou W, Yang L, Cai Y, Ying T. Dynamic programming for New Energy Vehicles based on their work modes part I: electric vehicles and hybrid electric vehicles. *J Power Sources* 2018;406:151–66.
- [15] Hemi H, Ghouili J, Cheriti A. Real-time energy management for an electric vehicle using a combination of rule-based and ECMS. In: *Electrical Power and Energy Conference (EPEC), 2013 IEEE* (pp. 1–6).
- [16] Odeum F, Roes J, Wülbeck L, Heinzl A. Power management optimization of fuel cell/battery hybrid vehicles with experimental validation. *J Power Sources* 2014;252:333–43.
- [17] Yang, C., Zha, M., Wang, W., Liu, K., Xiang, C.: Efficient energy management strategy for hybrid electric vehicles/plug-in hybrid electric vehicles: review and recent advances under intelligent transportation system. *IET Intelligent Transport Systems* 14(7), 702-711, (2020).
- [18] Ramadan, H. S., Becherif, M., Claude, F.: Energy Management Improvement of Hybrid Electric Vehicles via Combined GPS/Rule-Based Methodology. *IEEE Transactions on Automation Science and Engineering* 14(2), 586-597, (2017).
- [19] Bathaee, S. M.T., Gastaj, A.H., Emami, S.R., et al.: A fuzzy-based supervisory robust control for parallel hybrid electric vehicles. *Vehicle Power & Propulsion IEEE*, Chicago, IL, USA, September 2005, pp. 694–700, (2005).
- [20] Li, S.G., Sharkh, S.M., Walsh, F.C., et al.: Energy and battery management of a plug-in series hybrid electric vehicle using fuzzy logic. *IEEE Trans. Veh. Technol.* 60, 3571–3585, (2011).
- [21] Gujarathi, P.K., Varsha, S., Makarand, L.: Fuzzy logic based energy management strategy for a converted parallel plug-in hybrid electric vehicle. *IEEE 8th Control and System Graduate Research Colloquium, Shah Alam, Malaysia*, pp. 185–190, (2017).
- [22] Akar, F., Tavlasoglu, Y., Vural, B.: An Energy Management Strategy for a Concept Battery/Ultracapacitor Electric Vehicle With Improved Battery Life. *IEEE Transactions on Transportation Electrification* 3(1), 191-200, (2017).

AUTHOR INFORMATION

Gaurav Gadge, Assistant Professor, Department of Electrical Engineering, St. Vincent Pallotti College of Engineering and Technology, Nagpur, India and Research Scholar, Department of Electrical and Electronics Engineering, Sandip University, Nashik

Yogesh Pahariya, Professor, Department of Electrical and Electronics Engineering, Sandip University, Nashik