

Road-friendliness of Fuzzy Hybrid Control Strategy Based on Hardware-in-the-Loop Simulations

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Abstract

Purpose: In order to improve road-friendliness of heavy vehicles, a fuzzy hybrid control strategy consisting of a hybrid control strategy and a fuzzy logic control module is proposed. The performance of the proposed strategy should be effectively evaluated using a hardware-in-the-loop (HIL) simulation model of a semi-active suspension system based on the fuzzy hybrid control strategy prior to real vehicle implementations. **Methods:** A hardware-in-the-loop (HIL) simulation system was synthesized by utilizing a self-developed electronic control unit (ECU), a PCI-1711 multi-functional data acquisition board as well as the previously developed quarter-car simulation model. Road-friendliness of a semi-active suspension system controlled by the proposed control strategy was simulated via the HIL system using Dynamic Load Coefficient (DLC) and Dynamic Load Stress Factor (DLSF) criteria. **Results:** Compared to a passive suspension, a semi-active suspension system based on the fuzzy hybrid control strategy reduced the DLC and DLSF values. **Conclusions:** The proposed control strategy of semi-active suspension systems can be employed to improve road-friendliness of road vehicles.

Keywords: Road-friendliness, Fuzzy Hybrid Control Strategy, Semi-active suspension systems, Hardware-in-the-Loop Simulations

Introduction

Magneto rheological (MR) fluids exhibit large reversible changes in their rheological behavior when subjected to external magnetic fields. This crucial property has triggered tremendous research activities in the development of advanced suspension systems. Semi-active suspensions based on MR fluids consume much less power compared with fully active suspension systems.

For improving ride quality, many control strategies were designed for semi-active suspension systems. Fuzzy control theory was applied by Nicolás et al. (1997) to the design of semi-active suspension systems for improving ride quality. It was found that the proposed controller could achieve similar performances to those obtained

with skyhook-type algorithms, but using a far less expensive sensorization. Field tests of a semi-active suspension system were carried out by Choi et al. (2001), in which four independent skyhook controllers associated with semi-active dampers are employed for better ride quality.

Some regulations for controlling road-friendliness of heavy vehicles have been introduced by several western countries such as United Kingdom, Australia, etc. Moreover, these countries also provide a payload incentive for vehicles equipped with suspension systems having improved road-friendliness. Furthermore, fundamental researches related to road-friendliness of heavy vehicles are supported by the above governments and their automobile companies (OECD, 1998). Due to the limited performance of traditional passive suspensions, researches on road-friendliness of semi-active suspension systems are being continuously conducted to reduce dynamic tire

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force generated by heavy vehicles (Yi and Hedrick, 1989; Yan et al., 2007; Kortüm et al., 2002; Guglielmino et al., 2008). For instance, a full heavy vehicle model with a semi-active suspension system was designed using Simpack software in the EU project called ‘Copernicus of Semi-Active Damping of Truck Suspensions and Its Influence on Drivers and Road Loads (SADTS)’ on vehicle-road interaction to study its road-friendliness (Valášek et al., 1998).

The practical use of semi-active suspension systems is relatively difficult by its inherently hysteretic, time-variant properties. Furthermore, the development of an accurate dynamic vehicle model that includes all relevant factors is almost impossible, because of the complex non-linear dynamics of many important components. All above mentioned nonlinearity and uncertainty resulted in difficult implementation of many model-based control approaches (Caponetto et al., 2003).

The design of model-free control strategy considering the road-friendliness is becoming an important research area of semi-active suspension systems. Therefore, the main objective of this paper is set to develop a model-free fuzzy hybrid control strategy of semi-active suspension systems for improving road-friendliness. Moreover, hardware-in-the-loop (HIL) simulations were conducted in order to evaluate the influence of the time-delay factor on road-friendliness of the proposed control strategy using Dynamic Load Coefficient (DLC) and Dynamic Load Stress Factor (DLSF).

Design of a fuzzy hybrid control strategy

The Fuzzy hybrid control strategy was designed to improve the overall vertical performance of semi-active suspension systems of heavy vehicles. The proposed control strategy consists of a hybrid control strategy, and a fuzzy logic control module for automatically adjusting the ratio between skyhook control and groundhook control (Fig. 1). The frame of the proposed control strategy is based on the hybrid control approach, which can be formulated as follows (Goncalves, 2001).

$$f_{sa} = G[\alpha \delta_{sky} + (1-\alpha) \delta_{gnd}]$$

$$\begin{aligned} \delta_{sky} &= V_1 & \text{if } V_1 V_{12} \geq 0 \\ \delta_{sky} &= 0 & \text{if } V_1 V_{12} < 0 \end{aligned}$$

$$\begin{aligned} \delta_{gnd} &= V_2 & \text{if } -V_2 V_{12} \geq 0 \\ \delta_{gnd} &= 0 & \text{if } -V_2 V_{12} < 0 \end{aligned} \quad (1)$$

Where, δ_{sky} is the skyhook component damping force, δ_{gnd} is the groundhook component damping force, V_1 is the absolute velocity of the sprung mass, V_2 is the absolute velocity of the sprung mass, V_{12} is the relative velocity of the sprung mass with respect to the unsprung mass, α is a relative ratio between skyhook control and groundhook control, G is a constant gain.

A fuzzy logic control module shown in Fig. 2 is the core of the proposed fuzzy hybrid control strategy, and its critical role is to intelligently adjust the relative ratio in a real-time manner in order to improve road-friendliness. It's obvious that the relative ratio α is an important factor. In this study, the automatic determination of the relative ratio α depends on the vertical motions of sprung and unsprung masses. For designing of the fuzzy control logic module, the vertical velocity V_1 of the sprung mass, the vertical velocity V_2 of the unsprung mass, and the relative velocity between sprung mass and unsprung mass V_{12} were chosen as three fuzzy variables. The fuzzy variables V_1 and V_{12} were selected as input variables of the fuzzy control logic module, the following linguistic input variables are selected to describe fuzzy variables V_1 and V_{12} .

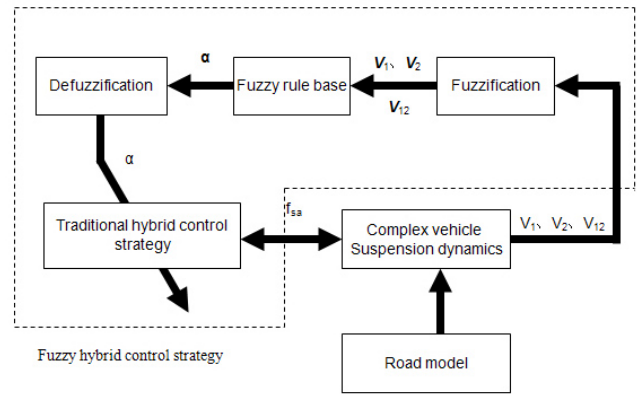


Figure 1. Block diagram of fuzzy hybrid control system.

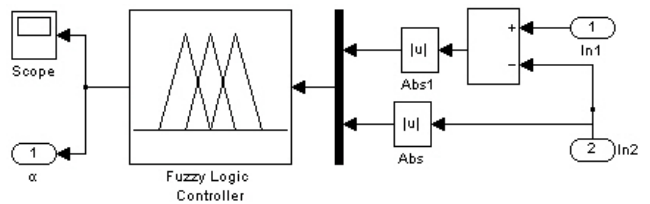


Figure 2. Fuzzy logic control module of the proposed control strategy.

$$V_1 = \{ES, VS, SM, ME, LA, VL, EL\}$$

$$V_{12} = \{ES, VS, SM, ME, LA, VL, EL\}$$

Where, ES = extremely small VS = very small, SM = small, ME = medium, LA = large and VL = very large, EL = extremely large. A linguistic output variable is also defined to describe the relative ratio α as follows.

$$\alpha = \{Z_1, Z_2, Z_3, Z_4, Z_5, Z_6, Z_7, Z_8, Z_9\}$$

Where, Z_i ($i=1, \dots, 9$) are fuzzy variables of α , respectively. The membership functions of V_1 , V_{12} and α are shown in Figs 3~5. Based on expert knowledge, a collection of 49 rules of the following form can be generated.

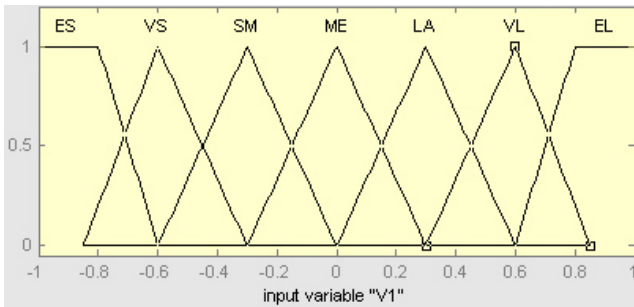


Figure 3. Membership functions of linguistic variable V_1 .

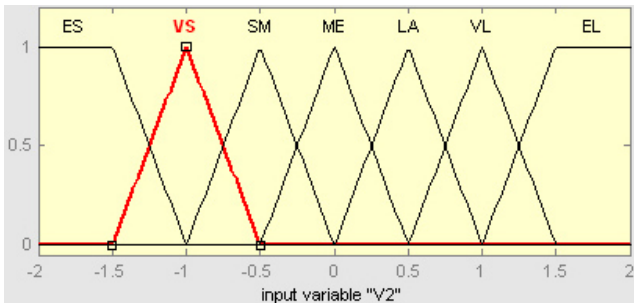


Figure 4. Membership functions of linguistic variable V_2 .

$$R^i = \text{IF } V_1 \text{ IS EL AND } V_{12} \text{ IS ES THEN } \alpha = Z_9$$

$$R^{i+1} = \text{IF } V_1 \text{ IS ES AND } V_{12} \text{ IS EL THEN } \alpha = Z_1$$

$$R^{i+2} = \text{IF } V_1 \text{ IS EL AND } V_{12} \text{ IS EL THEN } \alpha = Z_5$$

The collection of above fuzzy control rules of the proposed hybrid control strategy can be represented as shown in Table 1. The above control rules can also be visualized as Fig. 6. The center-of-gravity method is employed to infer these fuzzy rules.

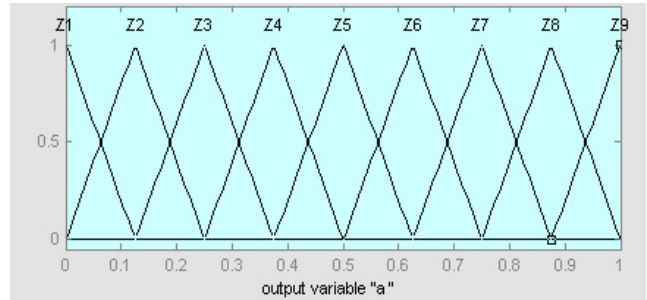


Figure 5. Membership functions of linguistic variable α .

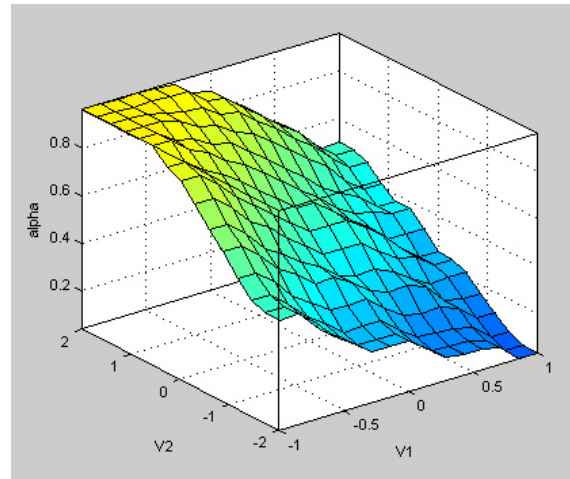


Figure 6. 3D cloud map of fuzzy logic control module including 49 rules.

Table 1. Fuzzy rule base of fuzzy hybrid control strategy

V2 \ V1	ES	VS	SM	ME	LA	VL	EL
ES	Z5	Z6	Z7	Z8	Z9	Z9	Z9
VS	Z4	Z5	Z6	Z7	Z8	Z9	Z9
SM	Z3	Z4	Z5	Z6	Z7	Z8	Z9
ME	Z3	Z4	Z4	Z5	Z6	Z7	Z8
LA	Z2	Z3	Z4	Z5	Z5	Z6	Z7
VL	Z2	Z3	Z3	Z4	Z4	Z5	Z6
EL	Z1	Z2	Z3	Z3	Z4	Z4	Z5

The proposed fuzzy hybrid control strategy was coded using C language in ColdWarrior 4.6, the damping coefficients of skyhook control and groundhook control are all set to $40 \text{ kN} \cdot \text{s/m}$.

Design of an electronic control unit

Electronic control units offer a modular, networked approach to real-time vehicle control and diagnostics. For evaluating the performance of the proposed fuzzy hybrid control strategy using HIL technology, a general electronic control unit based on Freescale S12XDP512 microcontroller (Freescale Co. LTD, USA) was designed using Altium Designer 6.9 software (Fig. 7) in order to investigate the influences of time-delay factors on control performance of the proposed control strategy. The developed electronic control unit mainly consists of two power units, a 16-channel analog-to-digital convertor, a 8-channel digital-to-analog convertor and a 4-channel current driver, etc. The fuzzy hybrid control strategy was compiled and then downloaded into the ECU through a background debug module (BDM).

HIL system for verification of fuzzy hybrid control strategy

Testing electronic control units in real vehicles is a time-consuming, costly process, and comes very late in the automotive development process. To achieve the aimed quality of the newly developed vehicles, electronic control unit's testing has to be conducted as early as possible within the vehicle development process. At pre-

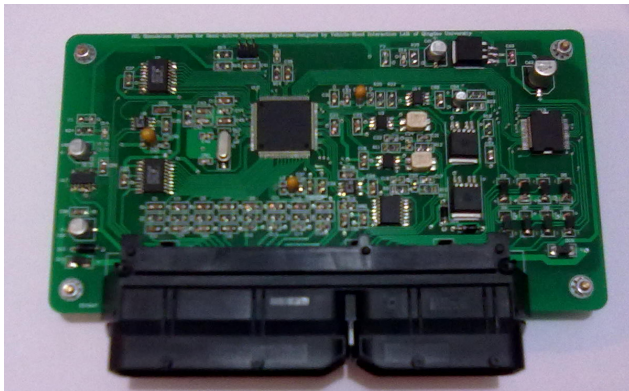


Figure 7. An electronic control unit based on Freescale XDP512 16-bit microcontroller.

sent, the traditional methods are increasingly replaced by laboratory tests using HIL technology. HIL is an advanced technique for conducting system-level evaluation of electronic control units in a comprehensive, cost effective, and repeatable manner. In this study, a cost-effective HIL simulation system was designed at the Laboratory of Vehicle-Road Interaction, College of Mechanical & Electrical Engineering, Qingdao University for verification of the proposed fuzzy hybrid control strategy.

The hardware subsystem of the HIL system was consisted of a PC workstation equipped with a 4-core CPU, a specially-designed general 16-bit ECU, a PCI-1711 multi-functional data acquisition card (ADVANTECH Co. LTD, TAIWAN) and a power supply with an output voltage range of $5 \sim 36 \text{ V}$ (Fig. 8).

The software subsystem of the HIL system mainly includes a quarter car semi-active suspension model designed using MATLAB/Simulink, a road model as well as several I/O ports designed using Real-Time Windows Target Toolbox for interfacing with the developed ECU.

According to Lagrange's equation, the following differential equations of a quarter car model of semi-active suspension systems can be derived,

$$m_s \ddot{x}_s + k_s(x_s - x_u) - f_{sa} = 0 \quad (2)$$

$$m_u \ddot{x}_u + k_s(x_u - x_s) - k_t(x_u - x_r) + f_{sa} = 0 \quad (3)$$

Where m_s , m_u , k_s , k_t , f_{sa} , x_s , x_u , x_r , \dot{x}_s , and \dot{x}_u are sprung mass, unsprung mass, suspension stiffness, tire stiffness, the force generated by a semi-active damper, displacement of the sprung mass, displacement of unsprung mass, road profile, the velocity of sprung mass and the velocity of unsprung mass, respectively (Fig. 9). By defining $\mathbf{x} = [\dot{x}_s \dot{x}_u x_s x_u \dot{x}_r]^T$ as the state vector, the following state equations in matrix form can be obtained.

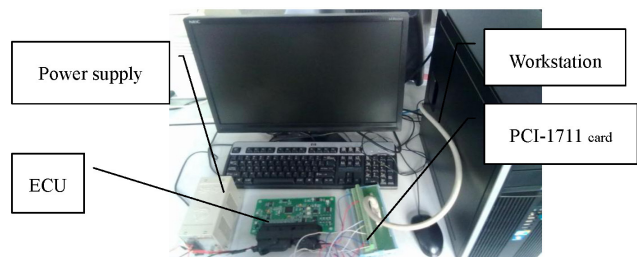


Figure 8. A HIL system for evaluating the proposed control strategy.

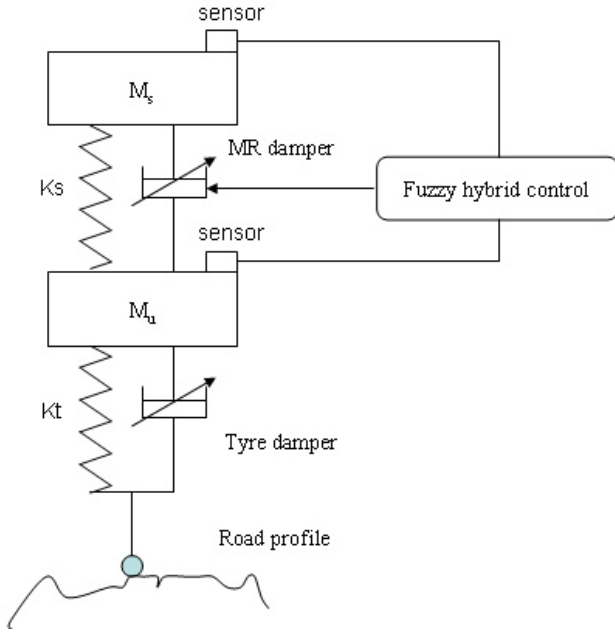


Figure 9. Schematic of a quarter car semi active suspension system.

$$\dot{x} = Ax + Bu \quad (4)$$

$$y = Cx + Du \quad (5)$$

Where: $u = [f_{sa} \ x_r]^T$ is the input vector, and

$$A = \begin{bmatrix} 0 & 0 & \frac{k_s}{m_s} & \frac{k_s}{m_s} & 0 \\ 0 & 0 & \frac{k_s}{m_u} & \frac{-k_s - k_t}{m_u} & \frac{k_t}{m_u} \\ 1 & 0 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & -2\pi f_0 \end{bmatrix}$$

$$B = \begin{bmatrix} \frac{1}{m_s} & 0 \\ -\frac{1}{m_u} & 0 \\ 0 & 0 \\ 0 & 0 \\ 0 & 2\pi\sqrt{G_0 v_0} \end{bmatrix}$$

$$C = \begin{bmatrix} 1 & 0 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 0 & 1 \end{bmatrix} \quad D = \begin{bmatrix} 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 \end{bmatrix}^T$$

Where: x_r is road displacement; G_0 is the road roughness coefficient; v_0 is the vehicle speed, $w(t)$ is a Gaussian

white noise with mean value of 0; f_0 is the low cut-off frequency. The matrices C and D are specially set to unit matrix and null matrix for extracting the state vector.

The main parameters of the quarter car model are set to $m_s=4500$ kg, $m_u=500$ kg, $k_s=0.2$ M·N/s, $k_t=2$ M·N/s. According to the above data, all elements of matrices of A , B , C , D can be calculated, respectively.

The road model used in the developed semi-active suspension system is a filtered Gaussian white noise (Yu and Crolla, 2003).

$$\dot{x}_r(t) = -2\pi f_0 x_r(t) + 2\pi\sqrt{G_0 v_0} w(t) \quad (6)$$

Road-friendliness criterion used in HIL simulation

Two typical criteria chosen to evaluate road-friendliness of a semi-active suspension system governed by the proposed fuzzy hybrid control strategy: Dynamic Load Coefficient (DLC) and Dynamic Load Stress Factor (DLSF).

DLC overcomes the drawbacks of road-friendliness evaluation based on static load, in which the dynamic interaction between vehicle and road is considered (Sweetman, 1983). This criterion is mainly used to evaluate permanent road damage caused by moving vehicles. DLC is defined as follows.

$$DLC = \frac{\text{standard deviation of dynamic load}}{\text{static load}} \quad (7)$$

The DLC value of a suspension system is closely related to road roughness, the speed and the suspension type of a heavy vehicle.

DLSF was first proposed by K.Yi and K. Hedrick, which is another frequently used road-friendliness criterion [4], DLSF can be expressed as follows.

$$DLSF = 1 + 6DLC^2 + 3DLC^4 \quad (8)$$

Where: DLC is the root mean square of dynamic tire force, which can also be calculated using Eq. (7).

HILS methods and main results

After importing the road model, the semi-active suspension system was linked with the ECU including the

Table 2. Comparison of dynamic tire force under different control modes

Items	Road type	Speed, km/h	Passive suspension, kN	Fuzzy hybrid control strategy in HIL, kN
Maximum dynamic tyre force	A	90	90.776	82.394
		110	102.870	94.209
	B	90	206.340	158.680
		110	216.360	191.140
Standard deviation of dynamic tyre force	A	90	25.237	23.250
		110	26.806	25.534
	B	90	51.039	47.638
		110	54.233	51.856

Table 3. Road-friendliness of a semi-active suspension system under different control modes

Road type	Road-friendliness criterion	Speed, km/h	Road-friendliness	
			Passive suspension, kN	Fuzzy hybrid control strategy in HIL
A	DLC	90	0.52	0.47
		110	0.55	0.52
	DLSF	90	2.84	2.47
		110	3.09	2.84
B	DLC	90	1.04	0.97
		110	1.10	1.06
	DLSF	90	10.99	9.30
		110	12.65	11.53

proposed control strategy. The solver option was set to fixed-step ode45 (Runge-Kutta), real-time workshop's system target file to rtwin.tlc, HIL simulation for investigating on the performance semi-active suspension systems under the control of the proposed strategy was carried out at 90 km/h, 110 km/h on A-type and B-type motorways, during which the relative ratio of hybrid control block of the proposed control strategy was intelligently controlled by the proposed fuzzy logic control module. The standard deviations and the maximum values of dynamic tire forces under different control modes are summarized in Table 2 for the following road-friendliness evaluation process. A semi-active suspension system governed by the proposed fuzzy hybrid control strategy suppressed the maximum and the deviation values of the dynamic tire forces when compared with those of a passive suspension system.

Using DLC and DLSF criteria, road-friendliness of a semi-active suspension system and a passive suspension system is shown in Table 3. It is straightforward that a semi-active suspension system under the proposed fuzzy hybrid control strategy improved road-friendliness on both A-type and B-type motorways.

Conclusions

- (1) A fuzzy hybrid control strategy was designed by combining hybrid control strategy and a fuzzy logic control module for improving road-friendliness.
- (2) A hardware-in-the-loop (HIL) simulation system was designed to verify the proposed fuzzy hybrid control strategy.
- (3) Semi-active suspension system under the control of the fuzzy hybrid control strategy can be utilized to improve road friendliness.

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