

Fuzzy-Logic-Based Self-Tuning PI Controller for Speed Control of Indirect Field-Oriented Induction Motor Drive

Mohammad Abdul MANNAN*, Toshiaki MURATA*,

Junji TAMURA* and Takeshi TSUCHIYA**

In this paper, a new self-tuning proportional and integral (PI) controller based on fuzzy logic is proposed to improve the performance of conventional PI speed control of induction motor (IM) taking core loss into account. A new parameterization technique to tune the proportional and integral gains of PI controller is adopted by using a single parameter (h) from the knowledge of pole placement technique. To tune the parameter h depending on the operating points, a simple fuzzy logic system is designed where only one input, one output variables, three membership functions for each input-output variable, and three fuzzy rules are used. Since the poles of PI speed controller are placed in negative real values by using the proposed parameterization technique, the speed controller always works in stable region. Moreover, the overshoot and steady state error problems are also overcome by changing of h based on the proposed fuzzy system under the variations of load torque and parameters. The performance of proposed fuzzy-logic-based self-tuning PI controller has been demonstrated through the simulations. The simulation results confirm that the excellent desired speed is achieved against the variations of load torque and parameters without any overshoot and steady state error by using the proposed system.

Key Words: fuzzy-logic, induction motor, speed control, self-tuning PI controller

1. Introduction

The field-oriented control (FOC) method of IM with conventional PI speed controller has been widely used in the industry applications^{1),2)}. Due to the inherent disadvantages of conventional PI controller, numerous methods have been proposed to replace PI controller schemes, which include the model reference adaptive control³⁾, sliding mode control⁴⁾, optimal regulator control⁵⁾, internal model control⁶⁾, input-output linearizing control⁷⁾, genetic algorithm⁸⁾, fuzzy logic control (FLC)^{9),10)}, fuzzy tuning PI controller¹¹⁾ and neural network¹²⁾. The design of the proposed controllers^{1)~8)} depends on mathematical model. The design of FLC and neural network is independent on mathematical model. To train the weighting factors of neural network and calculation of output variable of fuzzy system, where rule table is large, are time consuming. However, FLC is robust under the variations of load torque and parameters⁹⁾, FLC is not better than PI controller for all operating points¹⁰⁾. The above discussed controller^{1)~4),6)~12)} for IM have been designed by neglecting core loss.

The performance of torque and flux control of IM drive is deteriorated due to the effects of core loss^{5),13)}. So, it is desirable to consider core loss to achieve precise performance of IM. The discrete time PI controller, where PI controller gains have been chosen by trial and error method¹⁴⁾ and applying pole placement technique¹⁵⁾, has been applied to obtain high performance of IM drive in taking core loss into account. But the overshoot problem for step change of speed and under the variation of parameters of IM cannot be overcome by using the proposed PI controller^{14),15)}.

Since, the PI controller is widely used for IM drive^{1),2)}, it is desirable to have an intelligent PI controller which is able to self-tune its control gains to overcome the steady-state error and overshoot problems for step change of desired speed, and variations of load torque and parameters with consideration of core loss.

The classical PI controller gains tuning formulae have been proposed as Ziegler-Nichols¹⁶⁾ and Refined Ziegler-Nichols¹⁷⁾. A natural step forward along the line is to consider self-tuning PID controller, which tunes the PID gains¹⁷⁾. The demerits of above-mentioned PI gains tuning formulae have been clarified and a fuzzy adaptive mechanism has been proposed to overcome those disadvantages in [18]. Therefore, it has been clear that the tuning of PI controller gains based on fuzzy logic is better than the classical tuning formulae. But, the PI controller

* Department of EEE, Kitami Institute of Technology, 165 Koen-cho, Kitami, Hokkaido

** Department of EEE, Hokkaido Institute of Technology, 4-1, 7-15 Maeda, Teine-ku, Sapporo, Hokkaido
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gains are parameterized from the knowledge of Ziegler-Nicholas formula in [18] which is capable to provide the stable and good performance of IM under the variations of load torque and parameters. Different types of PID controller gains tuning method based on fuzzy logic controller have been compared in [19].

Conventionally, two input variables each having five membership functions have been considered in [11, 18, 19] so that the rule table has become large and the calculation of output variable has been a time consuming task. A recursive method has been used in [18] to update gains and two individual rule tables have been used for proportional and integral gains in [11], so that the proposed methods in [11, 18] are time consuming. The stability of the proposed controller in [11, 18, 19] and the overshoot problem for the variations of parameters have not been verified.

In this paper, a new self-tuning PI controller for speed control of IM based on fuzzy-logic has been proposed to take advantages of simplicity and feasibility of conventional PI controller. A new idea, that the gains of PI controller based on pole placement technique are parameterized by a single parameter h , is adopted. According to the proposed parameterization technique, the PI controller is stable under the variations of load torque and parameters because the real parts of poles of PI speed controller dynamic are always negative. And no steady-state error occurs due to the proper selection of PI controller gains. Moreover, a simple FLC system is also designed to tune the parameter h . In the proposed FLC system one input, one output variables, three membership functions for each input-output variable and three fuzzy rules are used. So the proposed FLC is simpler, less time consuming one to calculate output variable than those proposed in [11,18]. And overshoot is not arisen for step change of desired speed and under the variations of load torque and parameters due to the online tuning of PI controller gains.

The performance of proposed fuzzy-logic-based self-tuning PI controller has been verified through simulations. The simulation results confirm that the desired speed is achieved under the variations of load torque and parameters without any overshoot and steady error problems. The proposed controller can provide better performance than a conventional PI controller.

2. Model of Induction Motor Taking Core Loss into Account

Fig. 1 shows the equivalent circuit of an IM taking core

loss into account in the d - q axis synchronously rotating reference frame. It is seen that the core loss resistance is connected in parallel with the magnetizing inductance¹³⁾. According to Fig. 1, the voltage equations are given by

$$v_{1d} = R_1 i_{1d} + d\Phi_{1d}/dt - \omega_e \Phi_{1q} \quad (1)$$

$$v_{1q} = R_1 i_{1q} + d\Phi_{1q}/dt + \omega_e \Phi_{1d}$$

$$0 = R_2 i_{2d} + d\Phi_{2d}/dt - \omega_s \Phi_{2q} \quad (2)$$

$$0 = R_2 i_{2q} + d\Phi_{2q}/dt + \omega_s \Phi_{2d}$$

$$R_c i_{cd} = d\Phi_{md}/dt - \omega_e \Phi_{mq} \quad (3)$$

$$R_c i_{cq} = d\Phi_{mq}/dt + \omega_e \Phi_{md}$$

where, p is differential operator; v_{1d} and v_{1q} are the stator d - and q -axis input voltages; i_{1d} and i_{1q} are the stator d - and q -axis currents; i_{2d} and i_{2q} are the rotor d - and q -axis currents; i_{cd} and i_{cq} are the core loss d - and q -axis currents; Φ_{1d} and Φ_{1q} are the stator d - and q -axis fluxes; Φ_{2d} and Φ_{2q} are the rotor d - and q -axis fluxes; Φ_{md} and Φ_{mq} are the magnetizing d - and q -axis fluxes; R_1 , R_2 and R_c are stator, rotor and core loss resistances; ω_e and ω_s are primary and slip angular frequencies.

The current equations can be written as

$$i_{1d} + i_{2d} = i_{cd} + i_{md}; \quad i_{1q} + i_{2q} = i_{cq} + i_{mq} \quad (4)$$

where, i_{md} and i_{mq} are the magnetizing d - and q -axis currents.

The stator, rotor and magnetizing fluxes equations are given as

$$\Phi_{1d} = L_1 i_{1d} + \Phi_{md}; \quad \Phi_{1q} = L_1 i_{1q} + \Phi_{mq} \quad (5)$$

$$\Phi_{2d} = L_2 i_{2d} + \Phi_{md}; \quad \Phi_{2q} = L_2 i_{2q} + \Phi_{mq} \quad (6)$$

$$\Phi_{md} = L_m i_{md}; \quad \Phi_{mq} = L_m i_{mq} \quad (7)$$

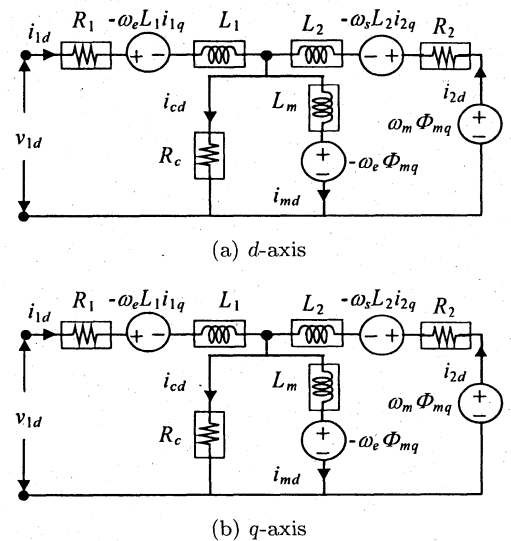
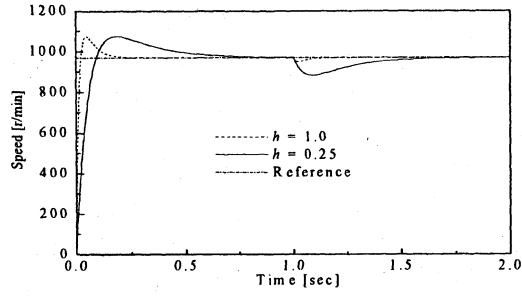
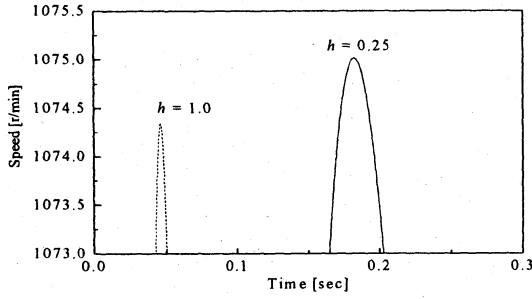


Fig. 1 Induction motor d - q equivalent circuit taking core loss into account



(a) Speed response



(b) Zoomed speed response between 0.0 to 0.3 sec

Fig. 5 Desired speed response using PI controller for different values of parameter h

poles of speed error and change of speed error dynamics are always negative which can provide the stable operation of control system. It is evident from Fig. 5 that the response is become faster and the overshoot is decreased by increasing h , and the deviation of speed for changing of load torque is decreased. Similarly, the response is become slower and the overshoot is increased by decreasing h , and the deviation of speed for changing of load torque is increased. As a result, the desired speed can be achieved by changing online parameter h without overshoot and steady state error.

B. Proposed Fuzzy Logic for tuning PI speed controller gains

According to the realization of desired speed responses Fig. 4 and 5, only one input $\Delta e_\omega(k)$ is chosen for fuzzy logic system, from which the parameter h is obtained as output of fuzzy logic system.

The input variables are normalized with K_{de} as shown in Fig. 6. The membership functions with overlap of triangular shape are used for input and output variables. The membership functions of input and output linguistic variables are shown in Fig. 7. The input linguistic variable is represented by N (Negative), Z (Zero), P (Positive) and the output linguistic variable is represented by S (Small), B (Big). The grade of input membership functions can be obtained as follows:

$$\mu(x) = [w - 2|x - m|]/w \quad (21)$$

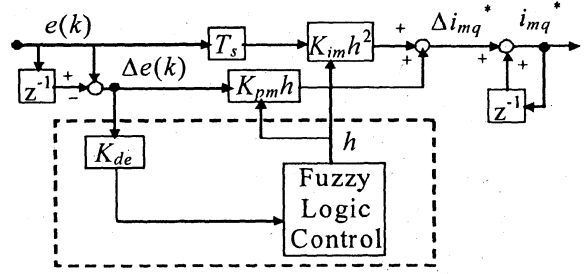


Fig. 6 Structure of fuzzy adaptation mechanism for tuning PI controller gains

where, $\mu(x)$ is the value of grade of membership, w is the width and m is the coordinate of the point at which the grade of membership is 1, x is the value of the input variable.

It is comprehended from Fig. 4 and 5 that the gains of PI controller should be kept small to overcome the overshoot problem, when the change of speed error is large. Since the change of speed error becomes small near to the reference value of speed, the gains of PI controller should be kept large which can provides fast convergence of actual speed to desired speed under the variation of load torque and parameters of IM. Therefore, the mapping of the scaled input variables to the output variable h is represented by fuzzy IF-THEN rules according to Table 3. There would be total three rules to achieve the desired speed trajectory as three membership functions for input are chosen.

According to the rule base in Table 3, the inference engine provides fuzzy value of h . The Mamdani's max-min composition with center of gravity (COG) method is considered as the most popular method on inference and defuzzification¹⁶⁾. Therefore, the COG method is used for defuzzification to obtain h . The output from fuzzy adaptation mechanism is given as

$$h = \sum_{i=1}^N \mu_i C_i / \sum_{i=1}^N \mu_i \quad (22)$$

where, N is total number rules; μ_i is the membership grade for i th rule; C_i is the coordinate corresponding to the maximum value of the respective consequent membership function for i th rule where the possible values of C_i are 0.0 and 1.0. After finding out the parameter h , the gains of PI controller can be calculated by using (20), which is also illustrated in Fig. 6.

In order to verify the performance of the proposed online gains tuning of PI speed controller, computer simulations have been performed. The ratings and parameters of the IM model are listed in Table 1. The scaling factors of fuzzy logic system are chosen as: $K_{de} = 2.1$. The gains

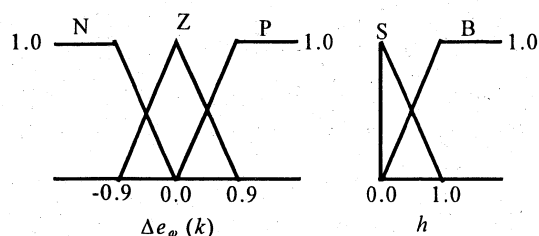


Fig. 7 Fuzzy sets and their corresponding memberships functions

Table 3 Rules table used to update the gains of PI controller

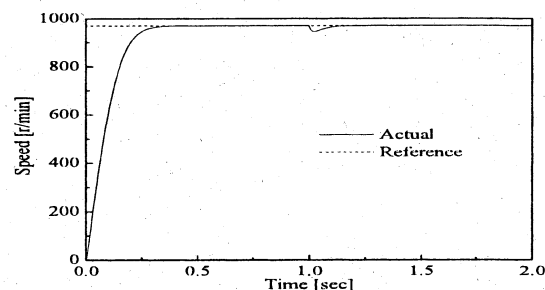
	Δe_{ω}		
	N	Z	P
h	S	B	S

of PI stator current controller, which are used for Fig. 4, and the maximum value of PI speed controller, which are used for Fig. 5, are used in order to obtain good response of the proposed control system.

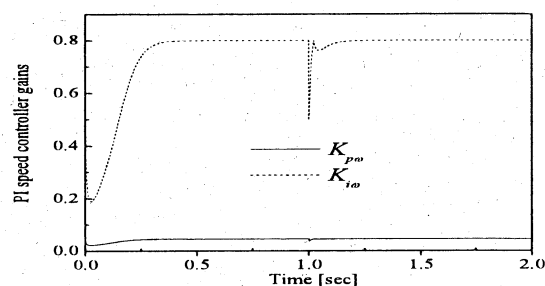
Fig. 8 shows the transient response for step change of speed and load torque of IM taking core loss into account. At $t = 0.0$ sec, the desired speed is changed from 0.0 r/min to rated 970.0 r/min with 50% load torque. At $t = 1.0$ sec, load torque is changed from 50% to 100% by its rated value. It is seen in Fig. 8(a) that the actual speed follows the desired speed without any overshoot and steady state error for step change of desired speed and the actual speed reach to the desired speed after step changing of load torque. The corresponding change of parameter h is shown in Fig. 8(b). The changing value of h helps to overcome the overshoot problem.

Fig. 9 shows also the desired speed response for step change of reference speed. It is comprehended from Fig. 9 that the desired speed is achieved without overshoot and steady error for large and small step change of reference speed.

In order to show the robustness of the proposed control system against the parameters variation (R_2 , J , L_m and R_c), simulation results are presented as shown in **Fig. 10**. It can be seen that the desired speed is achieved without any overshoot and steady state error against the variations of rotor resistance, inertia, magnetizing inductance and core loss resistance by using the proposed control system. Therefore, it can be stated that the desired speed can be achieved without overshoot and steady state error against the variations of parameters by using the proposed control system.



(a) Speed



(b) PI speed controller gains

Fig. 8 Transient response for step change of desired speed and step change of load torque

5. Conclusion

A novel design of a self-tuning PI speed controller based on fuzzy logic is fully explained to achieve the desired speed of indirect FOC of IM taking core loss into account. The achievement of the proposed controller for various operating conditions and parameter variations was investigated by the simulation study. The overshoot and steady state error problems of conventional PI speed controller for IM drive taking core loss into account can be overcome by using the proposed self-tuning PI controller. The proposed controller is very simple for implementation and robust under the variations of load torque and parameters of IM. The robust performance of existing conventional PI speed controller of IM drive, which has been used in industry, can be achieved by using the proposed self-tuning PI speed controller based on fuzzy logic. By placing the proposed fuzzy logic system in parallel to the conventional PI controller, the proposed controller can be implemented in industrial application.

References

- 1) F. Harashima, et al.: Multimicroprocessor-Based Control System for Quick Response Induction Motor Drive, Trans. IEEE Ind. Appl., IA-21, 3, 602/609 (1985)
- 2) B. K. Bose: Motion Control Technology-Present and Future, Trans. IEEE Ind. App., IA-21, 6, 1337/1342 (1985)
- 3) H. Sugimoto, et al.: Secondary Resistance Identification of an Induction Motor Applied Model Reference Adaptive System and its Characteristics, Trans. IEEE Ind. App., IA-23, 2, 296/303 (1987)

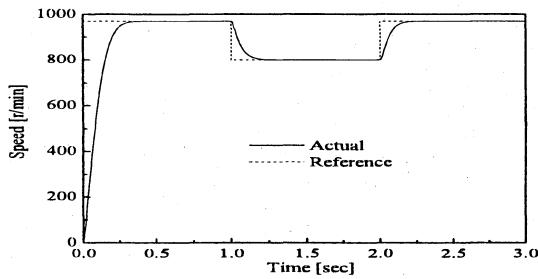


Fig. 9 Transient response for step change of desired speed

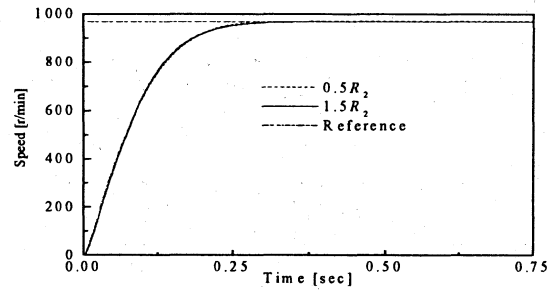
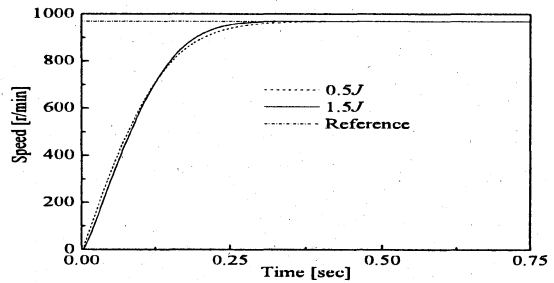
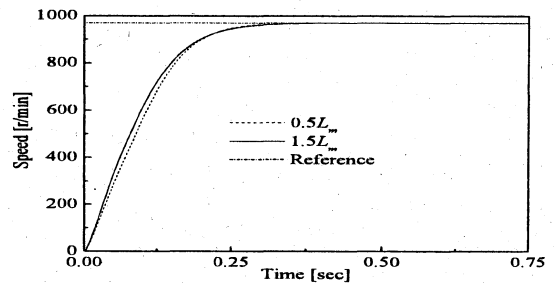
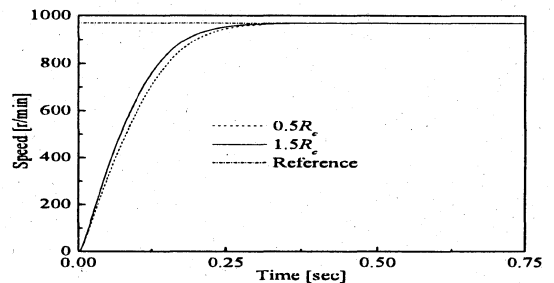
(a) Speed response under the variation of R_2 (b) Speed response under the variation of J (c) Speed response under the variation of L_m (d) Speed response under the variation of R_c

Fig. 10 Desired speed responses against the variations of parameters of IM

- 4) V. I. Utkin: Sliding Model Control Design Principles and Applications to Electric Drives, Trans. IEEE Ind. Elec., **40**-1, 23/36 (1993)
- 5) M. A. Mannan, et al.: Minimal Order Bilinear Observer for High Performance Control of Induction Motor Taking Core Loss into Account, Trans. of the SICE, **40**-8, 815/824 (2004)
- 6) Y. Y. Tzou: DSP-Based Robust Control of an AC Induction Servo Drive for Motion Control, Trans. IEEE Cont. Sys. Tech., **4**-6, 614/626 (1996)
- 7) R. Marino, et al.: Adaptive Input-Output Linearizing Control of Induction Motors, Trans. IEEE Auto. Cont., **38**-2, 208/221 (1993)
- 8) W. G. da Silva, P. P. Acarnly and J. W. Finch: Application of Genetic Algorithms to the Online Tuning of Electrical Drive Speed Controllers, IEEE Ind. Elec., **47**-1, 217/219 (2000)
- 9) M. N. Uddin, et al.: Performances of Fuzzy-Logic-Based Indirect Vector Control for Induction Motor Drive, Trans. IEEE Ind. Appl., **38**-5, 1219/1225 (2002)
- 10) Z. Ibrahim, et al.: Fuzzy Logic Versus PI Speed Control in High-Performance AC Drives: A Comparison, Elec. Power Com. and Sys., **31**-4, 403/422 (2003)
- 11) Ying-Yu Tzou, et al.: Fuzzy Tuning Current-Vector Control of a Three-Phase PWM Inverter for High-Performance AC Drives, Trans. IEEE Ind. Elec., **45**-5, 782/791 (1998)
- 12) G. Wang, et al.: Neural-Network-Based Self-Tuning PI Controllers for Precise Motion Control of PMAC Motors, IEEE Ind. Elec., **48**, 408/415 (2001)
- 13) Emil Levi: Impact of Iron Loss on Behavior of Vector Controlled Induction machines, IEEE Ind. Appl., **31**-6, 1287/1296 (1995)
- 14) M. A. Mannan, et al.: Indirect Field-oriented Control for High Performance Induction Motor Drives Using Space Vector Modulation with Consideration of Core Loss, in Proc. of PESC'03, Acapulco, Mexico, 1449/1454, 15-19 June (2003)
- 15) M. A. Mannan, et al.: Speed and Rotor Flux Control for Space Vector PWM Inverter-Fed Induction Motor Taking Core Loss into Account, in Proc. of the Tech. Meeting on Rotating Machinery, Japan, Paper No. RM-03-131, 107/112, October 9 (2003)
- 16) P. N. Paraskevopoulos: Digital Control Systems, Prentice Hall Europe (1996)
- 17) C. C. Hang, et al.: Refinements of the Ziegler-Nicholas Tuning Formula, IEE Proc.-D, **138**-2, 111/118 (1991)
- 18) S. Z. He, et al.: PID Self-Tuning Control Using A Fuzzy Adaptive Mechanism, in Proc. of the 1993 IEEE Inter. Con. Fuzzy Sys., San Fransisco, 708/713 (1993)
- 19) A. Visioli: Tuning of PID Controllers with Fuzzy Logic, IEE Proc. Control Theory Appl., **148**-1, 1/8 (2001)

Mohammad Abdul MANNAN

He was born in Laxmipur, Bangladesh on January 01, 1975. He received his B.Sc. Eng. Degree from Bangladesh Institute of Technology (BIT)-Rajshahi, Bangladesh and M.Sc. Eng. Degree from Kitami Institute of Technology, Japan, in 1998 and 2003 respectively, all in Electrical and Electronic Engineering. Presently he is working towards his Ph.D. degree at the Kitami Institute of Technology, Japan. His research interests are in the areas of electrical machines, power electronics, power systems, and applications of different controller and observer systems to electrical machines, power electronics, and power systems.

Toshiaki MURATA (Member)

He completed his Electrical Engineering Curriculum of the Teacher Training School from Hokkaido University, Japan. Since 1969, he had been a Research Assistant at the Kitami Institute of Technology, Japan. He received Dr. Eng. degree from Hokkaido University in 1991. Presently he is an associate professor at the Kitami Institute of Technology.

Junji TAMURA

He received his B. Sc. Eng. Degree from Muroran Institute of Technology, Japan, in 1979 and M.Sc. Eng. and Dr. Eng. degrees from Hokkaido University, Japan, in 1981 and 1984 respectively, all in electrical engineering. In 1984, he became a lecturer and in 1986, an associate professor at the Kitami Institute of Technology, Japan. Currently he is a professor at the Kitami Institute of Technology.

Takeshi TSUCHIYA (Member)

He received the B. E. and M. E. degrees in electrical engineering from Hokkaido University, Sapporo, Japan, in 1963 and 1965, respectively. He obtained the degree of Doctor of Engineering from Hokkaido University in 1974. Presently he is a professor at the Hokkaido Institute of Technology.
