# Design of Fuzzy Controller Based on Fuzzy Model for Container Crane System

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#### Abstract

The fuzzy control theory is applied to control a container crane, which is a very complicated system and controled manually by experts. As reference velocities of trolley and hoist of the container crane, we use those decided by experts, and express them by fuzzy model. We control the crane to follow the reference velocities by using fuzzy controllers. The fuzzy controllers are designed on the basis of fuzzy models representing the dynamics of the container crane. We made a model container crane and applied the suggested method to it

### 1. Introduction

Recently, system control theories are applied in many fields. However, systems are getting complicated, and many systems are too complicated to be controlled with conventional control theories. Most such systems are controlled by experts. In this paper, the fuzzy control theory is applied to control a container crane, which is a very complicated system and controlled by experts.

Container cranes, which carry containers between a container ship and a trailer, are very important equipment for the loading and unloading work in a port. When a ship is loaded or unloaded, minimizing the containers carrying time brings about a large cost saving. Container crane carries containers with trolley moving on rails and hoist rope. Because of nonlinear characteristics and complicated restriction conditions, container cranes are controlled not automatically, but manually by experts.

For the control of container cranes, several methods have been proposed. For example, methods supposing uniform length of hoist rope, optimal conrol method with three predefined motions(vertical motion, horizontal motion, diagonal motion), and predictive fuzzy control can be illustrated. However, such methods could not get so good control results as experts get.

In this paper, as reference velocities of trolley and hoist, we use those decided manually by experts, and control the crane to follow the reference velocities by using fuzzy controllers. The fuzzy controllers are designed on the basis of fuzzy models representing the dynamics of the container crane. We made a model container crane and applied the suggested method to it.

#### 2. Fuzzy Control of Container Crane

Container crane carries containers with trolley moving on rails and hoist rope. Thus, to control a container crane system, we must control a hoist motor and a trolley drive motor. Since a large swing of the container load during the carrying is dangerous, the

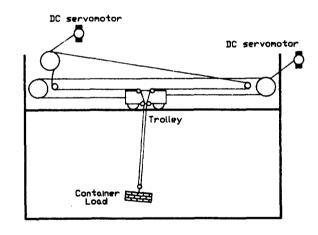


Fig. 1 A container crane system

problem is to carry a container to the desired place as quickly as possible while minimizing the swing of the container. A container crane system is shown in Fig. 1.

Because the dynamic equations of conainer crane system are very complicated nonlinear and restriction conditions are very complicated, it is very difficult to apply conventional control theory to the control of container crane.

However, many experts control manually the container crane very well. In this paper, as reference velocities of trolley and hoist we use those decided manually by experts, and control the crane to follow the reference velocities. The overall block diagram of the container crane conrol system is shown in Fig. 2.

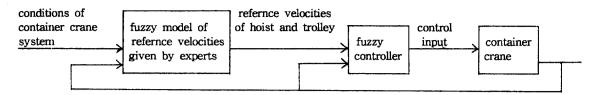


Fig. 2 The overall block diagrm of the container crane control system

The reference velocities of trolley and hoist are expressed as fuzzy models. The fuzzy models of referenc velocities are identified by using the data obtained when an expert operates the container crane manually. In this paper, we use Takagi and Sugeno fuzzy model composed of the following fuzzy implications.

where,  $x_i$  is an input variable,  $A_i^i$  is a fuzzy set,  $c_i^i$  is a parameter. The output y is inferred from the above fuzzy moel as follows.

$$y = (\sum_{i} W^{i} y^{i}) / \sum_{i} W^{i}$$
 (2)

$$W^{i} = \prod_{i} A_{i}^{i}(x_{i}) \tag{3}$$

where,  $A_i^i(x_j)$  is the membership value of  $A_j^i$  at  $x_j$ . The algorithm identifing a fuzzy model by using input-output data had been suggested.

When the fuzzy models of reference velocities are made, the container crane is controlled to follow the reference velocities. At that time, because of the very complicated nonlinear dynamics of the container crane system, we use a fuzzy controller designed on the basis of a fuzzy model representing the dynamics of the container crane. The method designing fuzzy controller is as follows. Let the fuzzy model of dynamics as as follows.

$$L^{i}: \text{If } z_{1} \text{ is } P_{1}^{i}, z_{2} \text{ is } P_{2}^{i}, \cdots, z_{m} \text{ is } P_{m}^{i}$$
  
then  $x^{i}(k+1)=a_{0}^{i}+a_{1}^{i}x(k)+\cdots+a_{n}^{i}x(k-n+1)+b^{i}u(k)$  (4)

where,  $P_i^i$  is a fuzzy set,  $z_j$  is a premise variable, u(k) is an input. The fuzzy model (4) can be identified by using the input-output data obtaind by observing the behavior of the container crane system actuated by random inputs. The consequent of the fuzzy implication (4) can be written in the matrix form.

$$X^{i}(k+1) = A^{i} X(k) + B^{i} u(k) + C^{i}$$
 (5)

where,  $X(k) = (x(k) \cdot \cdot \cdot x(k-n+1))^T$ ,  $B^i = (b^i 0 \cdot \cdot \cdot 0)^T$ ,  $C^i = (a_0^i 0 \cdot \cdot \cdot 0)^T$ , and  $A^i$  is a phase variable canonical form matrix. To design a controller tracking reference inputs, we define a new state variable vector M(k) and input variable v(k).

$$M(k) = \begin{bmatrix} X(k+1) - X(k) \\ x(k) - r \end{bmatrix}$$
 (6)

$$v(k) = u(k+1) - u(k)$$
 (7)

where, r is a reference input. The state equation using M(k) and v(k) is

$$M(k+1) = \begin{bmatrix} A^{i} & 0 \\ D & 1 \end{bmatrix} M(k) + \begin{bmatrix} B^{i} \\ 0 \end{bmatrix} n(k)$$
$$= \mathbf{\Phi}^{i} M(k) + \Gamma^{i} v(k) \tag{8}$$

where,  $D = (1 \ 0 \ \cdot \ \cdot \ 0)^T$ . The fuzzy model (4) can be rewritten as follows.

The fuzzy controller designed by using the above fuzzy model is also composed of the same type of fuzzy implications as follows.

$$C^{i}$$
: If  $z_{1}$  is  $P_{1}^{i}$ ,  $z_{2}$  is  $P_{2}^{i}$ ,  $\cdots$ ,  $z_{n}$  is  $P_{n}^{i}$  then  $v^{i}(k) = G^{i}$   $M(k)$  (10)

where,  $G^i \in \mathbb{R}^{n+1}$  is a state feedback gain. The methods of inferring input v(k) from the fuzzy controller (10) and determining  $G^i$  are shown in the next theorem.

Theorem. Let a desired stable system be,

$$M(k+1) = \Phi^{o} M(k)$$
 (11)

G' satisfy.

$$\boldsymbol{\Phi}^{o} = \boldsymbol{\Phi}^{i} + \boldsymbol{\Gamma}^{i} G^{i} \tag{12}$$

and the input  $v^0(k)$  be inferred from the fuzzy controller (10) as follows,

$$n^{0}(k) = \sum (W^{i} b^{i} n^{i}(k)) / \sum (W^{i} n^{i}(k))$$
 (13)

then the fuzzy system (9) controlled by the above input  $n^0(k)$  becomes the desired system (11).

**Proof.** When  $n^0(k)$  is used as an input, the inferred M(k+1) from the fuzzy model (9) becomes

$$\begin{array}{lll} M(k+1) &=& ( \ \sum \ W^i \ M^i(k) \ ) \ / \ \sum \ W^i \\ &=& ( \ \sum \ W^i \ (\Phi^i \ M(k) \ + \ \Gamma^i \ n^0(k)) \ ) \ / \ \sum \ W^i \\ &=& ( \ \sum \ W^i \ \Phi^i \ M(k) \ + \ \sum \ W^i \ \Gamma^i \ n^0(k) \ ) \ / \ \sum \ W^i \end{array}$$

Since,  $\sum W^i \Gamma^i n^0(k) = \sum W^i \Gamma^i n^i(k)$  by (13),

$$M(k+1) = (\sum W^i \Phi^i M(k) + \sum W^i \Gamma^i n^i(k)) / \sum W^i$$

$$= \sum W^i (\Phi^i + \Gamma^i G^i) M(k) / \sum W^i$$

$$= \Phi^0 M(k)$$

#### 3. Experiment on a Model Container Crane

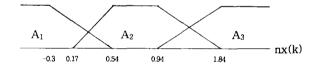
To verify the algorithm suggested above, we made a model conainer crane which has 120cm length and 100cm height. Two 12W DC motors were used for trolley drive and hoist rope, and three encoders were used to sense the position of trolley, the length of rope, and the container swing angle.

#### 3.1 Fuzzy Model of Refernce Velocities

Usually, when an expert operates a container crane, he consider the following facts.

- (1) Carry the container precisely in shortest time.
- (2) Minimize the swing of container during carrying and the end of carring.
- (3) Prevent the container from touching other objects.

Considering the above conditions, we exercised the manual operation of the model container crane until we became experts. Then, two fuzzy models of reference velocities of trolley and hoist were identified by using the data obtained when we operated the model crane. When operating the model crane to obtain the data, we varied the weight of container load  $0.5 \mathrm{Kg} - 1.5 \mathrm{Kg}$  and the carring length  $1.0 \mathrm{m} - 1.1 \mathrm{m}$ . The two identified fuzzy models are shown in Fig. 3. In Fig. 3, 'nx' is the position of trolley when start point is 0 and stop point is 1, 'vt' is the velocity of trolley, 'vh' is the velocity of hoist, 'le' is the length of hoist rope, 'an' is the swing angle of load, and 'we' is the weight of container load.



 $\begin{array}{llll} L^1: & \text{If} & nx(k) \text{ is } & A_1 & \text{then } v_t(k+1) = -0.65 + 1.5 v_t(k) \\ & -0.068 we(k) + 0.007 an(k) - 6.87 nx(k) + 0.02 he(k) \\ L^2: & \text{If} & nx(k) \text{ is } & A_2 & \text{then } v_t(k+1) = 2.27 + 0.6 v_t(k) \\ & -0.024 we(k) - 2.02 nx(k) - 0.002 he(k) \\ L^3: & \text{If} & nx(k) \text{ is } & A_3 & \text{then } v_t(k+1) = 38.6 - 4.06 v_t(k) \\ & +0.43 we(k) - 0.017 an(k) - 41.8 nx(k) + 0.02 he(k) \end{array}$ 

(a) The fuzzy model of trolley refernce velocities.

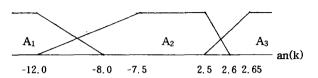


(b) The fuzzy model of hoist refernce velocities.

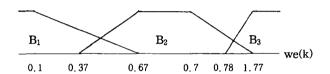
Fig. 3 The fuzzy models of refernce velocities

#### 3.2 Fuzzy Controller

To control the model crane so that the velocities of container follow the refernces, two fuzzy controller were designed for hoist motor and trolley drive motor. To design the fuzzy controllers, two fuzzy models representing the dynamics of trolley drive motor and hoist motor were identified and shown in Fig. 4.



(a) The fuzzy model of trolley drive motor dynamics



(b) The fuzzy model of hoist motor dynamics

Fig. 4. The fuzzy models of the dynamics of motors

We determined the matrix  $\Phi^{\circ}$  so that the eigenvalues are 0.5, 0.3+j0.3, and 0.3-j0.3.

$$\Phi^o = \left( \begin{array}{ccc} 0.1 & -0.045 & -0.245 \\ 1 & 0 & 0 \\ 1 & 0 & 1 \end{array} \right)$$

Then the fuzzy controllers are

$$C^1$$
: If an(k) is  $A_1$   
then  $n_t(k) = (-0.93 \ 0.04 \ -0.245)$  M(k)

$$C^2$$
: If an(k) is  $A_2$   
then  $n_t(k) = (-0.48 -0.055 -0.245)$  M(k)

$$C^3$$
: If an(k) is  $A_3$   
then  $n_t(k) = (-0.3 \quad 0.003 \quad -0.245) M(k)$ 

(a) The fuzzy controller of trolley drive motor

 $C^1$ : If we(k) is  $B_1$ then  $n_h(k) = (-0.9 \quad 0.326 \quad -0.245)$  M(k)

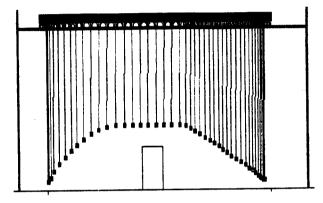
 $C^2$ : If we(k) is  $B_2$  then  $n_h(k) = (-0.32 -0.027 -0.245) M(k)$ 

 $C^3$ : If we(k) is  $B_3$  then  $n_h(k) = (-0.35 -0.19 -0.245) M(k)$ 

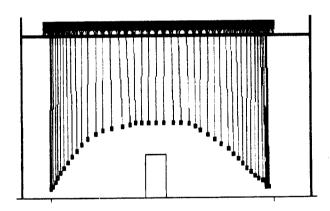
(b) The fuzzy controller of hoist motor

Fig. 4. The fuzzy controllers

## 3.3 Experiment Results Control results are shown in Fig. 5. and Fig. 6.



(a) The locus of container controlled by expert

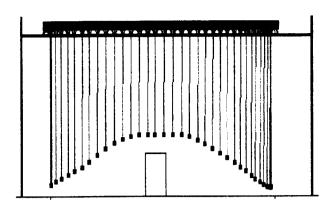


(b) The locus of container controlled by fuzzy controller

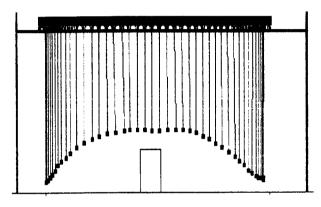
Fig. 5. The controll results when the weight of load is 1Kg and the carring length is 107.5cm

## 4. Conclusions

We have proposed a new method for controlling container cranes. At present, most container cranes are controlled manually by experts. As reference velocities of trolley and hoist of the container crane, we use those decided manually by experts, and express them by fuzzy model. We control the crane to follow the reference velocities by using fuzzy controllers. The fuzzy



(a) The locus of container controlled by expert



(b) The locus of container controlled by fuzzy controller

Fig. 6. The controll results when the weight of load is 0.5Kg and the carring length is 102.5cm

controllers are designed on the basis of fuzzy models representing the dynamics of the container crane. We made a model container crane and applied the suggested method to it. The locus of container load controlled by the fuzzy controller were almost the same as those by expert.

#### Reference

- T. Takagi and M. Sugeno, "Fuzzy identification of systems and its application to modelling and control", IEEE Trans. Systems, Man and Cybernetics, 15, pp.115-132, 1985.
- [2] M. Sugeno and G.T. Kang, "Structure identification of fuzzy model", Fuzzy sets and systems, 28, pp.15-33, 1988.
- [3] Y. Sakawa and Y. Shindo, "Optimal control of container crane", Automatica, 18-3, pp.257-266, 1982.
- [4] S. Yasundo, "Automatic conatainer crane operation based on a predictive fuzzy control", Trans. of the SICE, 22-10, pp1066-1073, 1986. (in Japanese)