# Two-mass DOB Robust to Elastic Coefficient Variation for Collaborative Robot Joint Using Joint Torque Sensor and Encoders

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A collaborative robot is a robot that can work with humans in a shared workspace. Collaborative robots can improve productivity and compensate for the shortage of working population. To make safe contact with a human, backdrivability is necessary. For high backdrivability, a robot with a joint torque sensor or a load-side encoder has been developed. We previously proposed a filtered disturbance observer for a high backdrivable robot joint using motor-side and load-side encoders. In the method, we used the nominal elastic coefficient parameter to calculate joint torque. However, the elastic coefficient of robot joint fluctuates depending on the torsion angle. In other words, a control method which is robust to the elastic coefficient variation is adequate for joint control. In this paper, we apply the filtered DOB method to the two-mass system using encoders and torque sensor. Our proposed method is robust to elastic coefficient variation.

The performance of the proposed method is validated by simulation and experiment.

Keywords: collaborative robot, two-mass, disturbance suppression, load-side encoder, torque sensor, torque control, backdrivability

## 1. Introduction

In recent years, collaborative robots gather attention. A collaborative robot is a robot that can work with humans in a shared workspace. It is expected that they can improve productivity and compensate for the shortage of working population in industry and the field of welfare (1). There is a big difference between a collaborative robot and a conventional robot. A collaborative robot should have the ability to contact safe with a human. To make safe contact with a human, backdrivability is necessary for robot joint. In other words, for a collaborative robot, not only position control but also backdrivability is required to realize a safe contact (2).

A collaborative robot is often equipped with a 6 DOF sensor on end effector to measure contact force. However, in this way, we cannot measure contact force on any part except end effector. We can solve this problem by measuring joint torque, because contact force effect can be estimate from joint torque information. Therefore, it is reasonable to measure and control joint torque, instead of the contact force. To measure joint torque or torsion angle, robots incorporating a torque sensor or a load-side encoder in their each joint have been developed (3) (4) (5). In addition, Torobo Arm

of Tokyo Robotics (6), Panda of Franka Emika (7), Sawyer of Rethink Robotics (8), etc. are beginning to be sold as torque controllable robots.

Not only hardware but also control theory is developed, for realizing a collaborative robot. Torque control method for a multiple joints robot is studied (9). Research on bilat-

Not only hardware but also control theory is developed, for realizing a collaborative robot. Torque control method for a multiple joints robot is studied <sup>(9)</sup>. Research on bilateral control, which requires coordination of position control and force control, is studied <sup>(10)(11)</sup>. We previously proposed the filtered DOB for high backdrivable two-mass system <sup>(12)</sup>. In the method, we applied the filtered DOB to a robot joint with motor-side and load-side encoders. To measure the joint torque, we calculated from torsion angle and the nominal elastic coefficient value. However, the elastic coefficient value often fluctuates depending on torsion angle. Therefore the control method which is robust to the elastic coefficient variation is adequate for robot joint control.

Fig. 1: Experimental machine of a two-mass motor bench

In this paper, we apply the filtered DOB method to the twomass system using encoders and torque sensor. Our proposed method is robust to elastic coefficient variation.

# 2. Experimental Setup and Modeling

Fig. 1 shows the experimental machine of a two-mass motor bench. The experimental machine has not only the motor-

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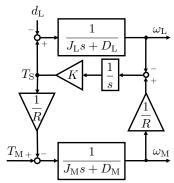


Fig. 2: Block diagram of two-mass system

side encoder but also the load-side one. In addition, it has a joint torque sensor. Therefore, it is possible to implement a control method using information about the load-side angle and joint torque.

In this paper, taking elastic bodies into account, each joint is modeled as a two-mass system which is shown in Fig. 2. The frequency characteristic from the input torque to the motor-side angle is shown in Fig. 3. and one from the input torque to the load-side angle is shown in Fig. 4. The solid black line indicates measured data, the broken blue line indicates the two-mass model.

Table. 1 shows the modeling parameters of the motor bench. Frequency domain signal design method (13) was used for system identification. At the time of measurement.

The equation of motion for the two-mass system is indicated by (1) and (2). The joint torque  $T_S$  caused by the elasticity of the gear. In our proposed method, we consider that the joint torque changes linearly to the angular difference as shown in (3).

$$\left(J_{\rm M}s^2 + D_{\rm M}s\right)\theta_{\rm M} = T_{\rm M} - \frac{1}{R}T_{\rm S} \tag{1}$$

$$(J_{L}s^{2} + D_{L}s)\theta_{L} = T_{S} - d_{L}$$
 (2)

$$T_{\rm S} = K \left( \frac{1}{R} \theta_{\rm M} - \theta_{\rm L} \right) \tag{3}$$

From these equations, the respective transfer functions are obtained as follows.

$$G_{\theta_{\rm M}T_{\rm M}} = \frac{J_{\rm L}s^2 + D_{\rm L}s + K}{D(s)} \tag{4}$$

$$G_{\theta_{\rm L}T_{\rm M}} = \frac{1}{R} \frac{K}{D(s)} \tag{5}$$

$$G_{\theta_{\rm M}d_{\rm L}} = -\frac{1}{R} \frac{K}{D(s)} \tag{6}$$

$$G_{\theta_{\rm L}d_{\rm L}} = -\frac{J_{\rm M}s^2 + D_{\rm M}s + \frac{K}{R^2}}{D(s)}$$
 (7)

$$D(s) = J_{\rm M}J_{\rm L}s^4 + (J_{\rm L}D_{\rm M} + J_{\rm M}D_{\rm L})\,s^3$$

Table 1: Parameters of the motor bench

$J_{\mathrm{M}}$	Motor-side moment of inertia	0.0020 N ms <sup>2</sup> /rad
$J_{ m L}$	Load-side moment of inertia	0.0057 N ms <sup>2</sup> /rad
$D_{\mathrm{M}}$	Motor-side viscosity friction coefficient	0.006 N ms/rad
$D_{\mathrm{L}}$	Load-side viscosity friction coefficient	0.0859 N ms/rad
K	Torsional rigidity coefficient	93.6137 N m/rad
R	Gear ratio	1

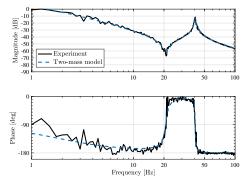


Fig. 3: From the motor input torque  $T_{\rm M}$  to the motor-side angle  $\theta_{\rm M}$ .

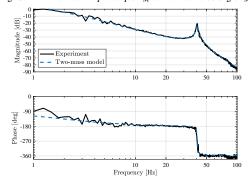


Fig. 4: From the motor input torque  $T_{\rm M}$  to the load-side angle  $\theta_{\rm L}$ .

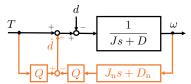


Fig. 5: Block diagram of DOB for one-mass system

$$+\left(KJ_{\mathrm{M}} + \frac{K}{R^{2}}J_{\mathrm{L}} + D_{\mathrm{M}}D_{\mathrm{L}}\right)s^{2}$$
$$+\left(KD_{\mathrm{M}} + \frac{K}{R^{2}}D_{\mathrm{L}}\right)s \tag{8}$$

 $G_{AB}$  indicates the transfer function from B to A.

# 3. Disturbance Observer

**3.1 DOB for one-mass system** Disturbance Observer (DOB) is widely used to eliminate the influence of input disturbance. It is a kind of simplified state observer. Fig. 5 shows a block diagram of DOB for a one-mass system.

T denotes input torque, d denotes input disturbance torque. The equation of motion for a one-mass plant is indicated by (9).

$$(Js + D)\omega = T - d \tag{9}$$

DOB estimates the disturbance torque using this equation. The estimation of the input disturbance by DOB is expressed by (10).

$$\hat{d} = [T - (J_{\mathbf{n}}s + D_{\mathbf{n}})\,\omega]\,Q(s) \tag{10}$$

Q(s) is a parameter of DOB. Generally, a low-pass filter is used as a Q-filter. The gain of Q(s) at low frequencies should be 1 for compensating the influence of stationary disturbance, and gain at high frequency should be almost 0 for reducing the influence of high-frequency noise. In addition to that, (Js + D) Q(s) should be proper.

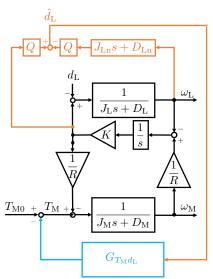


Fig. 6: Block diagram of the system with Filtered DOB

For a one-mass system, the influence of disturbance is eliminated easily with the estimation and the simple feedback system.

**3.2** Problem in DOB for two-mass system For a two-mass system, it is difficult to eliminate the influence of load-side disturbance by simple DOB. The estimation of  $d_L$  is possible with the simple observer. Estimation of the load-side disturbance by DOB is expressed by (11).

$$\hat{d}_{L} = [T_{S} - (J_{Ln}s + D_{Ln}) \omega_{L}] Q(s)$$
 (11)

However, if the estimated load-side disturbance is inputted to the motor side, the influence cannot be compensated. Theoretical problems are described below using analysis by comparison of transfer functions.

When the load-side disturbance  $d_{\rm L}$  is added,  $\theta_{\rm L}$  changes by the amount of  $G_{\theta_{\rm L}d_{\rm L}}d_{\rm L}$ . In order to eliminate this influence,  $d_{\rm L}$  should be estimated firstly. Let  $\hat{d}_{\rm L}$  be an estimated value of  $d_{\rm L}$ . If  $\hat{d}_{\rm L}$  is added to input torque  $T_{\rm M}$ ,  $\theta_{\rm L}$  changes by the amount of  $G_{\theta_{\rm L}T_{\rm M}}\hat{d}_{\rm L}$ .

However,  $G_{\theta_L T_M}$  and  $G_{\theta_L d_L}$  are very different. Therefore,  $G_{\theta_L T_M} \hat{d}_L$  cannot cancel out  $G_{\theta_L d_L} d_L$  effectively,

**3.3 DOB for two-mass system using torsion angle (Conventional method)** Sehoon *et al.* proposed joint torque control method using DOB for Series Elastic Actuator (SEA) (14). SEA is modeled as a two-mass system. Therefore, the DOB can be applied to robot joint using electric motor actuators. Fig. 8 shows the block diagram of the joint torque control method using the DOB. We call it a torsion angle DOB in this paper. Their proposed method also use a feedforward controller, however we focus on only DOB to compare the performance of DOBs. Torsional angle DOB is also disappears the effect on the joint torque from load-side disturbance.

**3.4 DOB filter for joint torque control (proposed method)** We showed that the influence of load-side disturbance to a two-mass system cannot be compensated by a simple DOB theoretically.

However, if we chose a physical output value that the influence of load-side disturbance should be eliminated, there are cases that the influence only on the output values can be

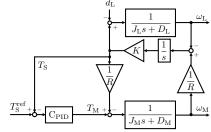


Fig. 7: Block diagram of PID control for Joint torque without DOB (Conventional Method I)

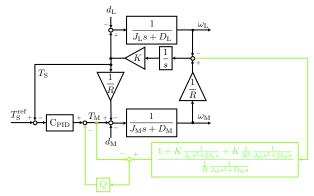


Fig. 8: Block diagram of PID control for Joint torque with Filtered DOB (Conventinal Method 2)

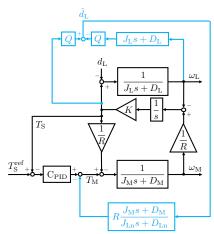


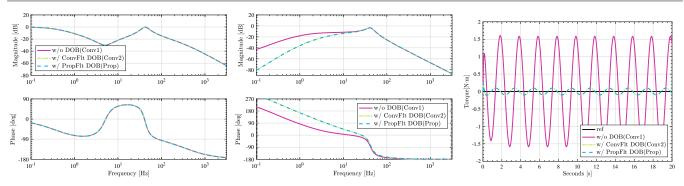
Fig. 9: Block diagram of the system with Filtered DOB (Proposed method)

eliminated with DOB and an appropriate filter.

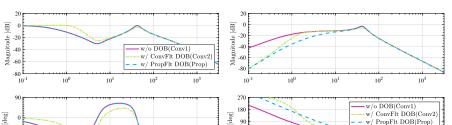
In this paper, we chose the joint torque as an output value, because it is one of the important values for implementing collaborative robots. When the influence of disturbance to the joint torque is eliminated, the joint is not twisted by the disturbance force, therefore the joint gets high backdrivability. Design of the appropriate filter for joint-torque control is expressed below. Fig. 6 shows the system in the form of a block diagram.  $G_{T_ST_M}$  indicates the transfer function from motor-side torque  $T_M$  to joint torque  $T_S$  and  $G_{T_Sd_L}$  indicates one from load-side torque  $d_L$  to joint torque  $T_S$ .  $G_{T_ST_M}$  and  $G_{T_Sd_L}$  are denoted in (12) and (13), respectively.

$$G_{T_{S}T_{M}} = \frac{K}{R}G_{\theta_{M}T_{M}} - KG_{\theta_{L}T_{M}}$$

$$= \frac{K}{R}\frac{J_{L}s^{2} + D_{L}s}{D(s)}$$
(12)



- (a) Frequency response from the joint torque (b) Frequency response from the load-side distorque reference  $T_{\rm S}^{\rm ref}$  to the joint torque  $T_{\rm S}$ turbance  $d_{\rm L}$  to the joint torque  $T_{\rm S}$
- (c) Time response of the joint torque  $T_{\rm S}$



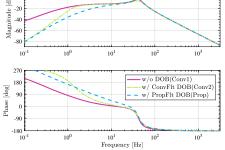
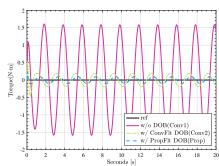


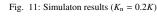
Fig. 10: Simulaton results  $(K_n = K)$ 

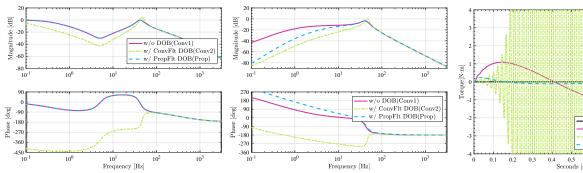


(a) Frequency response from the joint torque (b) Frequency response from the load-side distorque reference  $T_{\rm S}^{\rm ref}$  to the joint torque  $\hat{T}_{\rm S}$ turbance  $d_{\rm L}$  to the joint torque  $T_{\rm S}$ 

Phase

(c) Time response of the joint torque  $T_{\rm S}$ 





- (a) Frequency response from the joint torque (b) Frequency response from the load-side distorque reference  $T_{\rm S}^{\rm ref}$  to the joint torque  $T_{\rm S}$ turbance  $d_{\rm L}$  to the joint torque  $T_{\rm S}$
- (c) Time response of the joint torque  $T_{\rm S}$

w/o DOB(Conv1)

w/ ConvFlt DOB(Conv2)

w/ PropFlt DOB(Prop)

Fig. 12: Simulaton results  $(K_n = 5K)$ 

$$G_{T_{S}d_{L}} = \frac{K}{R}G_{\theta_{M}d_{L}} - KG_{\theta_{L}d_{L}}$$
$$= K\frac{J_{M}s^{2} + D_{M}s}{D(s)}$$
(13)

Joint torque considering multiple inputs on the motor side and the load side is denoted by (14).

$$T_{\rm S} = G_{T_{\rm S}T_{\rm M}}T_{\rm M} + G_{T_{\rm S}d_{\rm L}}d_{\rm L} \tag{14}$$

We defined  $G_{T_{
m M}d_{
m L}}$  as the transfer function of the appropriate filter. When the load-side disturbance is added and  $\hat{d}_{\rm L}$  is added to the input signal through the filter as shown in Fig. 6, the joint torque  $T_S$  is represented by (15).

$$T_{\rm S} = G_{T_{\rm S}T_{\rm M}} \left(T_{\rm M0} - G_{T_{\rm M}d_{\rm L}} \hat{d}_{\rm L}\right) + G_{T_{\rm S}d_{\rm L}} d_{\rm L}$$

$$= G_{T_{S}T_{M}}T_{M0} - G_{T_{S}T_{M}}G_{T_{M}d_{L}}\hat{d}_{L} + G_{T_{S}d_{L}}d_{L}$$
 (15)

 $T_{\rm M0}$  is the original input torque value.

It can be said that disturbance compensation is successful, if the terms of  $d_{\rm L}$  and  $\hat{d}_{\rm L}$  cancel each other. When the disturbance estimation is normally performed,  $d_L = \hat{d}_L$  is established, therefore (16) is obtained from the terms of  $d_L$  and  $\hat{d}_{L}$  in (15).

$$(G_{T_{\rm S}T_{\rm M}}G_{T_{\rm M}d_{\rm L}} + G_{T_{\rm S}d_{\rm L}})d_{\rm L} \simeq 0$$
 (16)

Transfer function of the filter indicated by (17) is obtained by transforming (16)

$$G_{T_{\rm M}d_{\rm L}} = G_{T_{\rm S}T_{\rm M}}^{-1} G_{T_{\rm S}d_{\rm L}}$$

$$= \frac{RD(s)}{K(J_{\rm L}s^2 + D_{\rm L}s)} \frac{K(J_{\rm M}s^2 + D_{\rm M}s)}{D(s)}$$

$$=R\frac{J_{\rm M}s + D_{\rm M}}{J_{\rm L}s + D_{\rm L}}\tag{17}$$

Thus, the filter for compensating the influence on the joint torque from the load-side disturbance was obtained.

When  $\hat{d}_L = d_L Q(s)$  is established considering the influence of the Q-filter, (18) is obtained by calculating the terms of  $d_L$  and  $\hat{d}_L$  in (15).

$$T_{S} = G_{T_{S}T_{M}}T_{M0} + G_{T_{S}d_{L}}d_{L} - G_{T_{S}T_{M}}G_{T_{M}d_{L}}\hat{d}_{L}$$

$$= G_{T_{S}T_{M}}T_{M0} + \frac{K(J_{M}s^{2} + D_{M}s)}{D(s)}d_{L}$$

$$- \frac{K}{R} \frac{J_{L}s^{2} + D_{L}s}{D(s)} R \frac{J_{M}s + D_{M}}{J_{L}s + D_{L}} d_{L}Q(s)$$

$$= G_{T_{S}T_{M}}T_{M0} + \frac{K(J_{M}s^{2} + D_{M}s)}{D(s)} (1 - Q(s)) d_{L}$$
 (18)

It is understood that when Q(s) = 1, the influence on the joint torque from the load-side disturbance completely disappears.

As a result, the transfer function from  $d_L$  to  $\theta_L$  is expressed by (19).

$$G_{\theta_{\rm L}d_{\rm L}} = \frac{1}{J_{\rm L}s^2 + D_{\rm L}s} \tag{19}$$

(19) shows that the influence of elastic body and motor side to the backdrivability disappears, the backdrivability is improved.

## 4. Simulation

Simulations evaluated the performance of each methods.

The conventional method 1 is PID control without DOB as shown in Fig. 7, the conventional method 2 is PID control with joint torque DOB as shown in Fig. 8, and the proposed method is PID control with filtered DOB as shown in Fig. 9. Every PID controllers is same, the time constant of DOB is 0.02 s.

**4.1** *K* is coincide with nominal value  $K_n$  Fig. 10a shows the frequency response from the joint torque reference  $T_{\rm S}^{\rm ref}$  to the joint torque  $T_{\rm S}$ . Since the PID controllers of the three methods have the same gain , the frequency characteristics are also the same.

Fig. 10b shows the frequency response from the load-side disturbance torque  $d_{\rm L}$  to the joint torque  $T_{\rm S}$ . In the proposed method and the conventional method 2, the gain became smaller, the effect of the disturbance is greatly suppressed. When the nominal value coincide the real value, the proposed method and the conventional method 2 has the same performance.

Fig. 10c shows the time response of the joint torque. 1 Hz Sine wave load-side disturbance is added. The conventional method 2 and the proposed method has the same good performance as with the frequency response.

**4.2** K is not coincide with nominal value  $K_n$  Next, we showed the other simulation results. In the simulation, the elastic coefficient value K is not coincide with nominal value.

In Fig. 11, the nominal value of the elastic coefficient  $K_n$  is 0.2 times as large as the true value K. Fig. 11a shows the frequency response from the joint torque reference  $T_{\rm S}^{\rm ref}$  to the joint torque  $T_{\rm S}$ . Fig. 11b shows the frequency response from the load-side disturbance torque  $d_{\rm L}$  to the joint torque  $T_{\rm S}$ .

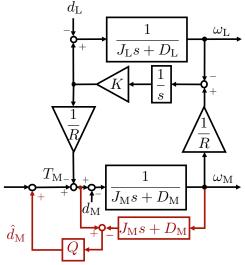


Fig. 13: The block diagram of motor-side disturbance observer

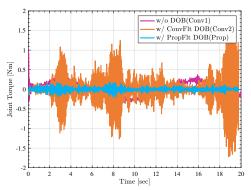


Fig. 14: Time response of joint torque  $(K = 5K_n)$ 

Regarding the conventional method 2, the control bandwidth becomes higher. On the other hand, the disturbance suppression performance is degraded. In the results, the reference following performance of the conventional method is lower than that of the proposed method as shown in Fig. 11c.

In Fig. 12, the nominal value of the elastic coefficient  $K_n$  is 5 times as large as the true value K. Fig. 11a shows the frequency response from the joint torque reference  $T_{\rm S}^{\rm ref}$  to the joint torque  $T_{\rm S}$ . Fig. 11b shows the frequency response from the load-side disturbance torque  $d_{\rm L}$  to the joint torque  $T_{\rm S}$ . Regarding the conventional method 2, the disturbance suppression performance is better. On the other hand, the control bandwidth is declined. In the results, time response is unstable as shown in Fig. 11c.

Basically, the torsion angle DOB and proposed method has higher performance. When the nominal elastic coefficient doesn't coincide with real value, the performance of the torsional angle DOB is changed. On the other hand, proposed method is robust to the elastic coefficient variation. It is because that the torsion angle DOB need parameter K, however our proposed method doesn't use the K.

The elastic coefficient of harmonic drive depend on the torsion angle, so the DOB should robust to the elastic coefficient variation. From this perspective, our proposed method is better than the conventional methods.

# 5. Experiment

In the experiments, the joint torque 0 Nm control was conducted. Unlike simulation, the two-mass plant has friction disturbance. Conventional method 2 DOB suppresses the motor-side disturbance. In this experiment, we want compare the load-side disturbance suppression performance. Therefore, the motor-side disturbance observer is added to the conventional method 1 and the proposed method as shown in Fig. 13.

Fig. 14 shows the exprimental result of the joint torque time response. The load-side disturbance torque is 1 Hz sine wave. The nominal value of the elastic coefficient  $K_n$  is 5 times as large as the true value K. Conventional method 2 become unstable, because the performance of the method is affected the variation of the elastic coefficient value. Proposed method doesn't need the elastic coefficient value for the controller parameters. Therefore we can design the joint torque controller robust to the variation of the elastic coefficient value.

#### 6. Conclusion

Development of a collaborative robot equipped with joint torque sensors or load-side encoders is expanding. To realize a safe contact by using sensor information, the effective control method is needed. In this paper, we proposed the method which makes backdrivability higher by DOB robust to the elastic coefficient variation. By considering the structure of a two-mass system and designing the DOB filter, we greatly improved the backdrivability of two-mass system. The performance is evaluated by simulations and experiments.

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