


RESEARCH ARTICLE

Contact force cancelation in robot impedance control by target impedance modification

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Abstract

A force sensorless impedance controller is proposed in this paper for robot manipulators without using force estimators. From the observation of the impedance control law, the force feedback term can be canceled if the inertia matrix in the target impedance is the same as the robot inertia matrix. However, the inertia matrix in the target impedance is almost always a constant matrix, while the robot inertia matrix is a function of the robot configuration, and hence, they may not be identical in general. A modification of the coefficient matrix for the contact force term in the target impedance is suggested in this paper to enable cancelation of the force feedback term in the impedance control law so that a force sensorless impedance controller without using force estimators can be obtained. The tracking performance in the free space phase and the motion trajectory in the compliant motion phase of the new design are almost the same as those in the traditional impedance control. Modification of the inertia matrix in the target impedance will result in small variations of the contact force which is acceptable in practical applications. For robot manipulators containing uncertainties, an adaptive version of the new controller is also developed in this paper to give satisfactory performance without the need for force sensors. Rigorous mathematical justification in closed-loop stability is given in detail, and computer simulations are performed to verify the efficacy of the proposed design.

1. Introduction

According to the existence of the environment, the robot control can be classified into two categories: the free space motion control and the compliant motion control. The former involves no contact activities with the environment, but the latter may have various interactions. The free space motion control could perform simple point-to-point regulation or desired trajectory tracking control. The compliant motion control, on the other hand, needs to consider the external force from the environment induced during the contact phase. Without a proper design, the contact force may give considerable impact on control performance or even destroy the closed-loop stability. There are two main approaches for the compliant motion control of robot manipulators: hybrid position/force control and impedance control. The hybrid position/force control was suggested by Raibert and Craig [1] which decomposed the operation domain into the motion control subspace and the force control subspace. If the constraint surface is smooth, the motion control subspace is tangent to the surface at the contact point, while the force control subspace is orthogonal to the motion control subspace and is generally normal to the constraint surface. A motion controller can then be designed to drive the robot to follow a desired trajectory in the motion control subspace, and a force controller is constructed to regulate the contact force in the force control subspace [2, 3]. The two controllers can be designed separately which is one of the advantages of the hybrid position/force control. Some switching algorithm needs to be developed to ensure suitable mappings of the control components into the joint space so that the operations in the Cartesian space can give good compliant motion behavior. However, to ensure precise real-time decomposition of the operation space

for a given environment, the implementation of the hybrid position/force controller heavily depends on the knowledge of the environment which is not always available.

The other renowned scheme for the compliant motion control of robot manipulators is the impedance control proposed by Hogan [4]. The impedance controller is designed so that the closed-loop behavior of the robot manipulator follows the dynamics of a given target impedance. The design of the target impedance needs to ensure a good interaction behavior between the robot manipulator and the environment during the compliant motion phase, and the tracking performance in the free space has also to be guaranteed [3]. One of the unique properties of the impedance control is that the controller can cover both the free space tracking phase and the compliant motion phase without switching activities during the transitions [5–7]. Since the system stability is insensitive to the phase transition, the knowledge of the environment is not crucial in the implementation.

The impedance controller needs to feedback not only system states but also the contact force. However, force sensors for robot manipulators are well-known to be expensive and fragile in general. The operation environment of industrial robot manipulators may be under various adverse situations such as dust contamination, mechanical vibration, chemical erosion, and temperature variation that will give various difficulties in the installation, calibration, and maintenance of the force sensors. In addition, the output signals of the force sensor at the robot end-effector form a vector of high-order time functions that contains very complex spectral configuration making the data acquisition and signal processing involved. The force feedback information thus obtained inevitably contains various inaccuracies in both the magnitude and phase that will obviously give impact on control performance. Hence, several force sensorless impedance control algorithms were proposed in the literature and mostly were with force estimators. Murakami *et al.* [8] designed two disturbance observers to each joint to estimate the induced torque information so that advanced manipulations can be realized which include the impedance control. Eom *et al.* [9] proposed a disturbance observer-based force estimator for robot manipulators so that the force sensors can be omitted in the control loop. Alcocer *et al.* [10] integrated a model-based force estimator into the force control loop of a robot manipulator. Tungpataratanawong *et al.* [11] presented an observer-based workspace force sensorless impedance controller for industrial robots under compliant motion manipulation. Erden and Tomiyama [12] suggested an interactive control law for robot manipulators which includes an impedance controller without using force sensors. Damme *et al.* [13] proposed two ways to estimate the interaction force on the end-effector: one is based on the recursive least squares and the other utilizes the momentum-based disturbance observer. Tachi *et al.* [14] suggested a force estimator based on the known robot model to implement an impedance controller without using force sensors. Wahrburg *et al.* [15] gave a force estimator based on Kalman filtering techniques with the generalized momentum in robot manipulator applications involving interactions with the environment. Ragaglia *et al.* [16] proposed a model-based force observer to estimate the interaction force for lightweight robots operating in structured environments. Choi *et al.* [17] proposed a force sensorless impedance controller for rehabilitation robots with an inner disturbance observer and a force estimator. Yuan *et al.* [18] suggested an improved sensorless impedance controller based on a force estimator in gravitational direction for applications such as polishing, milling, and deburring where a precise model of the robot manipulator is assumed. Han *et al.* [19] constructed a momentum observer in the impedance control loop in the dual-arm applications performing coordinated manipulations without using force sensors. Zeng *et al.* [20] suggested to compute the external force/torque based on dynamic model identification techniques to replace the 6-DOF force/torque sensors in the force control applications of robot manipulators. Dong *et al.* [21] designed a force estimator in a bilateral teleoperation system based on online sparse Gaussian process regression which can tolerate parametric uncertainties and unmodeled disturbances in the system. Neural network learning algorithm were proposed [22–24] for estimating the contact force in the admittance control of robot manipulators. Roveda *et al.* [25] proposed an LQR-based optimal control to the force sensorless compliant motion control of robot manipulators with force estimators. It is noted that all papers on the force sensorless compliant motion control reviewed above were based on various force estimators that are complex in their structure, and stability verifications are generally not given or only with weak justifications.

By observation of the traditional impedance controller, the force feedback term can be canceled if the inertia matrix of the system model is the same as the target impedance inertia matrix [7]. However, the system inertia matrix is a function of the robot configuration which is time-varying during the robot operations. On the other hand, the inertia matrix of the target impedance is a matrix with constant elements in general, and hence, the two inertia matrices may not be identical; therefore, it is impossible to cancel the contact force directly from the selection of values of the target impedance inertia matrix [7]. In this paper, we would like to propose a force sensorless impedance controller without using force estimators. The main contribution of this paper is to cancel out the external force in the controller directly by simply modifying the target impedance, and hence, the force estimators are not necessary. Since the eigen-structure in the target impedance is intact, the new target impedance shares the same dynamics as the original one. As a result, the free space tracking performance is unchanged. The end-effector will deviate from the desired trajectory during the compliant motion phase which is the same as the behavior under the traditional impedance control. The contact force, however, will be altered. It could be slightly larger or smaller than the force induced by the traditional impedance control depending on the selection of the inertial matrix in the new target impedance. Since the contact force in the traditional impedance control is not regulated to any desired force trajectory, the slight variation of the contact force in the proposed design gives only minor effect in the implementation. Therefore, the new strategy results in a force sensorless impedance controller without using force estimators which will not destroy closed-loop stability nor will it affect the end-effect trajectories in both the free space and compliant motion phases. In addition, an adaptive version of the new design is proposed in this paper to deal with the case when system parameters are unavailable. Rigorous mathematical justification on the system stability and boundedness of internal signals are given by using the Lyapunov-like stability theory. Computer simulations are also presented to verify the feasibility of the proposed designs.

Section 2 starts with the force cancelation impedance controller design of a SISO mechanical system without using force estimator to simplify the derivations. The results are extended to the robot manipulators in Section 3. Section 4 is the adaptive version of the proposed design. Section 5 gives simulation results. Section 6 concludes the paper.

2. Impedance control of SISO mechanical systems

In this section, we would like to consider the impedance control of a 1-DOF linear mechanical system for simplicity. Let m , b , and k be the mass, damping, and stiffness of the system, respectively, and the equation of motion can be represented as

$$m\ddot{x} + b\dot{x} + kx = u - f_{\text{ext}} \tag{1}$$

where $x \in \mathfrak{R}$ is the position, $u \in \mathfrak{R}$ is the control input and $f_{\text{ext}} \in \mathfrak{R}$ is the external force from the environment. A target impedance is specified as the desired behavior of the system during the interaction of the system and the environment [3–7]

$$M(\ddot{x} - \ddot{x}_d) + B(\dot{x} - \dot{x}_d) + K(x - x_d) = -f_{\text{ext}} \tag{2}$$

where M , B , and K are positive constants to give proper dynamics, and $x_d \in \mathfrak{R}$ is the desired trajectory for the motion of the mechanical system. To design controller u in (1) so that the closed-loop system behaves like (2), we may firstly find \ddot{x} from (2) as

$$\ddot{x} = \ddot{x}_d - M^{-1}B(\dot{x} - \dot{x}_d) - M^{-1}K(x - x_d) - M^{-1}f_{\text{ext}} \tag{3}$$

Substitute (3) into (1), and Hogan’s impedance controller can be found to be

$$u = \underbrace{m\ddot{x}_d + mM^{-1}B\dot{x}_d + mM^{-1}Kx_d}_{\text{known}} + \underbrace{(b - mM^{-1}B)\dot{x} + (k - mM^{-1}K)x}_{\text{state feedback}} + \underbrace{(1 - mM^{-1})f_{\text{ext}}}_{\text{force feedback}} \tag{4a}$$

Thus, to implement this controller, we need to know all plant parameters (m, b, k), target impedance coefficients (M, B, K), system states (x, \dot{x}), and the external force f_{ext} . Due to the difficulties in the force feedback as stated in the previous section, a force sensorless algorithm is desirable. Most of the force sensorless designs [8–25] replaced force sensors by force estimators or observers that are generally with complex structures and are involved in their mathematical justifications. It was mentioned in ref. [7] that for the simple SISO case here if it is possible to select $M = m$, then the force feedback term $(1 - mM^{-1})f_{\text{ext}}$ in (4a) vanishes and a force sensorless impedance controller is obtained as

$$u = m\ddot{x}_d + mM^{-1}B\dot{x}_d + mM^{-1}Kx_d + (b - mM^{-1}B)\dot{x} + (k - mM^{-1}K)x \tag{4b}$$

With this controller, the mechanical system (1) will behave like the target impedance (2) without using the force sensor, and it is no need for constructing any force estimator. So, the implementation of this impedance controller is much simplified. However, the condition $M = m$ is not always achievable even for the simple SISO case here simply because selections of M relate to the eigen-structure of the target impedance and the closed-loop dynamics as well. Therefore, the presence of the force feedback term in (4a) is unavoidable.

Let us consider the case when $M \neq m$, and we would like to use some intuitive way to scale the coefficient of (2) to try to get an equivalent effect of $M = m$. This is done by firstly rewrite (2) as a monic equation

$$(\ddot{x} - \ddot{x}_d) + M^{-1}B(\dot{x} - \dot{x}_d) + M^{-1}K(x - x_d) = -M^{-1}f_{\text{ext}}$$

Then, multiplying m to the both sides to have

$$m(\ddot{x} - \ddot{x}_d) + mM^{-1}B(\dot{x} - \dot{x}_d) + mM^{-1}K(x - x_d) = -mM^{-1}f_{\text{ext}} \tag{5}$$

It seems that the inertia of the target impedance (5) becomes m which is exactly the inertia of the system equation (1). Can the force feedback term be canceled this way? Let us find \ddot{x} from (5) first to compute the impedance controller as we had done in (3) and (4a), but the result is again (3), and the impedance controller goes back to (4a). As a result, we still have the same force feedback term, and the force feedback is unavoidable. Therefore, scaling of the coefficients in the target impedance is infeasible in giving the condition $M = m$ to work properly. This is simply because (2) and (5) are the same equation, and hence, we still obtain the same impedance controller (4a) which requires the force feedback.

It is seen that the leading coefficient of (5) is the same as the system inertia, but the impedance controller for (1) based on the target impedance (5) will still go back to (4a) which needs force feedback. Let us look at the differences in (2) and (5) to find any possible way to cancel out the force feedback terms in the controller. It is obvious that the coefficient sets (M, B, K) in (2) and ($m, mM^{-1}B, mM^{-1}K$) in (5) will give identical eigenvalues, and hence, the two target impedances share the same dynamics. The only difference now is the coefficients in the external force terms in (2) and (5): one is with -1 and the other with $-mM^{-1}$. With -1 , it will result in cancelation of the external force term, and with $-mM^{-1}$, it will go back to (4a) which requires force feedback. Hence, let us try to modify the coefficient of the external force term in (5) to -1 as

$$m(\ddot{x} - \ddot{x}_d) + mM^{-1}B(\dot{x} - \dot{x}_d) + mM^{-1}K(x - x_d) = -f_{\text{ext}} \tag{6a}$$

Now, we would like to find the impedance controller of (1) based on the target impedance (6a). The result is exactly (4b) which is a force sensorless impedance controller even though the condition $M = m$ is not satisfied. Hence, a force sensorless impedance controller without using force estimators for the SISO case can be designed in two steps:

Step 1: Scaling the coefficients of the target impedance

Step 2: Modify the coefficient of the force term to -1

After this modification, the target impedance becomes (6a), and the force feedback term in the impedance controller is canceled.

Further observations can be done by writing (6a) into

$$M(\ddot{x} - \ddot{x}_d) + B(\dot{x} - \dot{x}_d) + K(x - x_d) = -Mm^{-1}f_{ext} \tag{6b}$$

It is seen that (2) and (6b) share the coefficient set (M, B, K) , and hence, the eigen-structure is identical which implies that the dynamics will be the same even though one will result in an impedance controller with force feedback and the other one without. Hence, we have proved that the cancelation of the force feedback term in the impedance controller this way will not destroy closed-loop stability. During the free space tracking phase (i.e., $f_{ext} = 0$), (4a) becomes (4b) and the tracking performance will be the same. In the compliant motion phase (i.e., $f_{ext} \neq 0$), the coefficient Mm^{-1} in (6b) will change the contact force. However, by proper selection of M , the contact force can be adjusted, and this may be useful in implementation.

3. Impedance control of robot manipulators

The new method developed in the previous section for SISO mechanical systems can be extended to the impedance control of robot manipulators to have a force sensorless design. Let us consider a robot manipulator described by the model

$$D(q)\ddot{q} + C(q, \dot{q})\dot{q} + g(q) = \tau - J^T F_{ext} \tag{7}$$

where $q \in \mathcal{N}^n$ is a vector of generalized coordinates, $D(q) \in \mathcal{N}^{n \times n}$ is a positive definite inertia matrix, $C(q, \dot{q})\dot{q} \in \mathcal{N}^n$ is a vector of centrifugal and Coriolis forces, $g(q) \in \mathcal{N}^n$ is a vector of gravitational forces, $\tau \in \mathcal{N}^n$ is the control torque vector, $J(q) \in \mathcal{N}^{n \times n}$ is the non-singular Jacobian matrix, and $F_{ext} \in \mathcal{N}^n$ is the external force vector at the end-effector. Let $x \in \mathcal{N}^n$ be the position vector of (7) in the Cartesian space, and we may use the Jacobian matrix to relate the velocity vector \dot{x} and \dot{q} in the joint space by using the relationship $\dot{x} = J\dot{q}$. Define the matrices $D_x(x) = J^{-T}DJ^{-1}$, $C_x(x, \dot{x}) = J^{-T}(C - DJ^{-1}J)J^{-1}$, and $g_x(x) = J^{-T}g$, and the system model in the Cartesian space becomes [2, 3, 5]

$$D_x(x)\ddot{x} + C_x(x, \dot{x})\dot{x} + g_x(x) = J^{-T}\tau - F_{ext} \tag{8}$$

We would like to design an impedance controller to (8) such that the closed-loop dynamics follows the target impedance

$$M(\ddot{x} - \ddot{x}_d) + B(\dot{x} - \dot{x}_d) + K(x - x_d) = -F_{ext} \tag{9}$$

where $M, B, K \in \mathcal{N}^{n \times n}$ are diagonal matrices representing the desired apparent inertia, damping, and stiffness, respectively, and $x_d \in \mathcal{N}^n$ is the desired trajectory of the end-effector. If all parameters in (8) are available, then Hogan’s impedance controller can be designed to be

$$\begin{aligned} \tau = & \underbrace{J^T D_x \ddot{x}_d + J^T D_x M^{-1} B \dot{x}_d + J^T D_x M^{-1} K x_d}_{\text{known}} \\ & + \underbrace{J^T (C_x - D_x M^{-1} B) \dot{x} + J^T g_x - J^T D_x M^{-1} K x}_{\text{state feedback}} \\ & + \underbrace{J^T (I - D_x M^{-1}) F_{ext}}_{\text{force feedback}} \end{aligned} \tag{10}$$

Similar to the SISO case in the previous section, implementation of this controller requires the knowledge of all plant parameters in (D_x, C_x, g_x) , target impedance coefficient matrices (M, B, K) , system states (x, \dot{x}) , and the external force vector F_{ext} . Again, if we may select M such that $D_x M^{-1} = I$, then the force feedback term in (10) will be canceled, and it becomes a force sensorless impedance controller. Since D_x is a function of the robot states and M is a constant matrix, the condition $D_x M^{-1} = I$ cannot be satisfied in general. Therefore, a force sensorless impedance control may not be achieved simply by selecting M to cancel the force feedback term in (10) directly. In the previous section, a force sensorless impedance controller was proposed for SISO mechanical systems in two steps. Let us extend the design to the control of robot manipulators as

Step 1: Scaling the coefficients of the target impedance (9) into

$$\mathbf{D}_x(\ddot{\mathbf{x}} - \ddot{\mathbf{x}}_d) + \mathbf{D}_x\mathbf{M}^{-1}\mathbf{B}(\dot{\mathbf{x}} - \dot{\mathbf{x}}_d) + \mathbf{D}_x\mathbf{M}^{-1}\mathbf{K}(\mathbf{x} - \mathbf{x}_d) = -\mathbf{D}_x\mathbf{M}^{-1}\mathbf{F}_{\text{ext}}$$

Step 2: Modify the coefficient of the external force term to $-\mathbf{I}$

$$\mathbf{D}_x(\ddot{\mathbf{x}} - \ddot{\mathbf{x}}_d) + \mathbf{D}_x\mathbf{M}^{-1}\mathbf{B}(\dot{\mathbf{x}} - \dot{\mathbf{x}}_d) + \mathbf{D}_x\mathbf{M}^{-1}\mathbf{K}(\mathbf{x} - \mathbf{x}_d) = -\mathbf{F}_{\text{ext}} \tag{11}$$

Now, the leading coefficient matrix is the same as the inertia matrix in (8), and the right-hand sides of (11) and (9) are identical. Then, the impedance controller of (8) with the given target impedance (11) is derived to be exactly (10) but without the force feedback term as

$$\begin{aligned} \boldsymbol{\tau} = & \underbrace{\mathbf{J}^T\mathbf{D}_x\ddot{\mathbf{x}}_d + \mathbf{J}^T\mathbf{D}_x\mathbf{M}^{-1}\mathbf{B}\dot{\mathbf{x}}_d + \mathbf{J}^T\mathbf{D}_x\mathbf{M}^{-1}\mathbf{K}\mathbf{x}_d}_{\text{known}} \\ & + \underbrace{\mathbf{J}^T(\mathbf{C}_x - \mathbf{D}_x\mathbf{M}^{-1}\mathbf{B})\dot{\mathbf{x}} + \mathbf{J}^T\mathbf{g}_x - \mathbf{J}^T\mathbf{D}_x\mathbf{M}^{-1}\mathbf{K}\mathbf{x}}_{\text{state feedback}} \end{aligned} \tag{12}$$

This is a force sensorless impedance controller without using the force estimator. With this impedance controller, the system in (8) will behave like the target impedance in (11) which can also be written as

$$\mathbf{M}(\ddot{\mathbf{x}} - \ddot{\mathbf{x}}_d) + \mathbf{B}(\dot{\mathbf{x}} - \dot{\mathbf{x}}_d) + \mathbf{K}(\mathbf{x} - \mathbf{x}_d) = -\mathbf{M}\mathbf{D}_x^{-1}\mathbf{F}_{\text{ext}} \tag{13}$$

It shares the same dynamics as the one in (9), since they have the same eigen-structure. However, their right-hand sides are different that will induce different contact forces. During the free space tracking phase, there is no external force induced, and hence, (10) and (12) are identical and the two impedance controllers will give the same closed-loop dynamics which implies the same free space tracking performance. On the other hand, during the compliant motion phase, the external force will be induced with different magnitudes due to the coefficient \mathbf{I} in (9) and $\mathbf{M}\mathbf{D}_x^{-1}$ in (13). By proper selection of \mathbf{M} , it is possible to make the force induced by the proposed controller be larger or smaller than the traditional one. It is seen that the closed-loop stability is not destroyed in both the free space tracking and compliant motion phases, and there is no need for any force estimators.

4. Adaptive impedance control of robot manipulators

In the previous section, we have proposed a force sensorless impedance controller without using force estimators under the assumption that all the system parameters are available. If there are uncertainties in (8), we would like to develop a force sensorless adaptive impedance controller in this section. An intuitive design of the adaptive version of the impedance controller is to replace matrices $(\mathbf{D}_x, \mathbf{C}_x, \mathbf{g}_x)$ in (12) by using their estimates $(\hat{\mathbf{D}}_x, \hat{\mathbf{C}}_x, \hat{\mathbf{g}}_x)$ as

$$\boldsymbol{\tau} = \mathbf{J}^T\hat{\mathbf{D}}_x\ddot{\mathbf{x}}_d + \mathbf{J}^T\hat{\mathbf{D}}_x\mathbf{M}^{-1}\mathbf{B}\dot{\mathbf{x}}_d + \mathbf{J}^T\hat{\mathbf{D}}_x\mathbf{M}^{-1}\mathbf{K}\mathbf{x}_d + \mathbf{J}^T(\hat{\mathbf{C}}_x - \hat{\mathbf{D}}_x\mathbf{M}^{-1}\mathbf{B})\dot{\mathbf{x}} + \mathbf{J}^T\hat{\mathbf{g}}_x - \mathbf{J}^T\hat{\mathbf{D}}_x\mathbf{M}^{-1}\mathbf{K}\mathbf{x}$$

This controller can then be substituted into (8) to get the error dynamics, and the update laws are able to be derived based on the Lyapunov stability theory. However, the adaptive impedance controller thus obtained requires the feedback of the joint accelerations, and there will be singularity problem during the estimation of $\hat{\mathbf{D}}_x$ [3]. The Slotine and Li’s modification can be applied with the support of the model reference design [3] to avoid the feedback of joint accelerations as well as the singularity problem, but the force sensorless structure will be destroyed in the computation of the reference model states. Hence, the traditional adaptive designs are not feasible here.

Let us rewrite (12) into

$$\boldsymbol{\tau} = \mathbf{J}^T \left\{ (\mathbf{D}_x\ddot{\mathbf{x}}_d + \mathbf{C}_x\dot{\mathbf{x}} + \mathbf{g}_x) - \left[\underbrace{\mathbf{D}_x\mathbf{M}^{-1}\mathbf{B}(\dot{\mathbf{x}} - \dot{\mathbf{x}}_d) + \mathbf{D}_x\mathbf{M}^{-1}\mathbf{K}(\mathbf{x} - \mathbf{x}_d)}_{= -\mathbf{D}_x(\ddot{\mathbf{x}} - \ddot{\mathbf{x}}_d) - \mathbf{F}_{\text{ext}} \text{ due to (11)}} \right] \right\}$$

The term $\mathbf{D}_x \mathbf{M}^{-1} \mathbf{B}(\dot{\mathbf{x}} - \dot{\mathbf{x}}_d) + \mathbf{D}_x \mathbf{M}^{-1} \mathbf{K}(\mathbf{x} - \mathbf{x}_d)$ above can be replaced by the term $-\mathbf{D}_x(\ddot{\mathbf{x}} - \ddot{\mathbf{x}}_d) - \mathbf{F}_{\text{ext}}$ due to (11) to give

$$\begin{aligned} \boldsymbol{\tau} &= \mathbf{J}^T \{ (\mathbf{D}_x \ddot{\mathbf{x}}_d + \mathbf{C}_x \dot{\mathbf{x}} + \mathbf{g}_x) + \mathbf{D}_x(\ddot{\mathbf{x}} - \ddot{\mathbf{x}}_d) + \mathbf{F}_{\text{ext}} \} \\ &= \mathbf{J}^T \left\{ (\mathbf{D}_x \ddot{\mathbf{x}} + \mathbf{C}_x \dot{\mathbf{x}} + \mathbf{g}_x + \mathbf{F}_{\text{ext}}) - \underbrace{\left[\mathbf{M}(\ddot{\mathbf{x}} - \ddot{\mathbf{x}}_d) + \mathbf{B}(\dot{\mathbf{x}} - \dot{\mathbf{x}}_d) + \mathbf{K}(\mathbf{x} - \mathbf{x}_d) + \mathbf{M} \mathbf{D}_x^{-1} \mathbf{F}_{\text{ext}} \right]}_{=0 \text{ due to (13)}} \right\} \end{aligned}$$

This can be rearranged into

$$\boldsymbol{\tau} = \mathbf{J}^T \left[\underbrace{\mathbf{D}_x \ddot{\mathbf{x}} + \mathbf{C}_x \dot{\mathbf{x}} + \mathbf{g}_x + \mathbf{F}_{\text{ext}} - \mathbf{M} \ddot{\mathbf{x}} - \mathbf{M} \mathbf{D}_x^{-1} \mathbf{F}_{\text{ext}}}_{=\mathbf{h}(t)} + \mathbf{M} \ddot{\mathbf{x}}_d - \mathbf{B}(\dot{\mathbf{x}} - \dot{\mathbf{x}}_d) - \mathbf{K}(\mathbf{x} - \mathbf{x}_d) \right]$$

Define $\mathbf{h}(t) = \mathbf{D}_x \ddot{\mathbf{x}} + \mathbf{C}_x \dot{\mathbf{x}} + \mathbf{g}_x + \mathbf{F}_{\text{ext}} - \mathbf{M} \ddot{\mathbf{x}} - \mathbf{M} \mathbf{D}_x^{-1} \mathbf{F}_{\text{ext}}$ as a vector containing uncertain plant parameters, acceleration feedback terms, and force feedback terms. This uncertain vector is time-varying without knowing its variation bounds, and hence, the traditional adaptive strategies as well as the conventional robust designs are infeasible to give proper treatment. Here, we would like to propose a function approximation [3]-based adaptive controller

$$\boldsymbol{\tau} = \mathbf{J}^T \left[\hat{\mathbf{h}} + \mathbf{M} \ddot{\mathbf{x}}_d - \mathbf{B}(\dot{\mathbf{x}} - \dot{\mathbf{x}}_d) - \mathbf{K}(\mathbf{x} - \mathbf{x}_d) \right] \tag{14}$$

where $\hat{\mathbf{h}}$ is an estimate of \mathbf{h} . It is seen that the realization of (14) does not require the knowledge of system parameters, and it is a force sensorless algorithm. Substituting (14) into (8) and the closed-loop system becomes in the form

$$\mathbf{M}(\ddot{\mathbf{x}} - \ddot{\mathbf{x}}_d) + \mathbf{B}(\dot{\mathbf{x}} - \dot{\mathbf{x}}_d) + \mathbf{K}(\mathbf{x} - \mathbf{x}_d) = \left(\hat{\mathbf{h}} - \mathbf{h} \right) - \mathbf{M} \mathbf{D}_x^{-1} \mathbf{F}_{\text{ext}} \tag{15}$$

Therefore, if we may find a proper update law for $\hat{\mathbf{h}}$ to have $\hat{\mathbf{h}} \rightarrow \mathbf{h}$, then (15) will converge to (13) asymptotically and the force cancellation is achievable. To find the update law, let us define $\mathbf{e} = \mathbf{x} - \mathbf{x}_d$ as the trajectory tracking error, and (15) can be rewritten as

$$\ddot{\mathbf{e}} + \mathbf{M}^{-1} \mathbf{B} \dot{\mathbf{e}} + \mathbf{M}^{-1} \mathbf{K} \mathbf{e} = \mathbf{M}^{-1} \left(\hat{\mathbf{h}} - \mathbf{h} \right) - \mathbf{D}_x^{-1} \mathbf{F}_{\text{ext}} \tag{16}$$

Let $\mathbf{x}_e = [\mathbf{e}^T \dot{\mathbf{e}}^T]^T \in \mathfrak{R}^{2n}$ be the state vector, and then, (16) can be represented in the state space form

$$\dot{\mathbf{x}}_e = \mathbf{A}_e \mathbf{x}_e - \mathbf{B}_e \left(\hat{\mathbf{h}} - \mathbf{h} \right) - \mathbf{B}_e \mathbf{M} \mathbf{D}_x^{-1} \mathbf{F}_{\text{ext}} \tag{17}$$

where

$$\mathbf{A}_e = \begin{bmatrix} \mathbf{0} & \mathbf{I}_n \\ -\mathbf{M}^{-1} \mathbf{K} & -\mathbf{M}^{-1} \mathbf{B} \end{bmatrix} \in \mathfrak{R}^{2n \times 2n} \quad \mathbf{B}_e = \begin{bmatrix} \mathbf{0} \\ \mathbf{M}^{-1} \end{bmatrix} \in \mathfrak{R}^{2n \times n}$$

The vectors \mathbf{h} and $\hat{\mathbf{h}}$ can be approximated by using the function approximation technique [3, 26] as

$$\mathbf{h} = \mathbf{W}^T \mathbf{z} + \boldsymbol{\varepsilon}$$

$$\hat{\mathbf{h}} = \hat{\mathbf{W}}^T \mathbf{z}$$

where $\mathbf{W} \in \mathfrak{R}^{n\beta \times n}$ is the weighting matrix, $\hat{\mathbf{W}} \in \mathfrak{R}^{n\beta \times n}$ is its estimate, $\mathbf{z}(t) \in \mathfrak{R}^{n\beta \times 1}$ is a vector of basis functions, and $\boldsymbol{\varepsilon} \in \mathfrak{R}^n$ is the approximation error vector. Suppose a large enough number β is used and the approximation error can be ignored, then (17) may be further written into

$$\dot{\mathbf{x}}_e = \mathbf{A}_e \mathbf{x}_e - \mathbf{B}_e \tilde{\mathbf{W}}^T \mathbf{z} - \mathbf{B}_e \mathbf{M} \mathbf{D}_x^{-1} \mathbf{F}_{\text{ext}} \tag{18}$$

where $\tilde{\mathbf{W}} = \hat{\mathbf{W}} - \mathbf{W}$ is the approximation error of \mathbf{W} . Consider the Lyapunov function like candidate

$$V = \frac{1}{2} \mathbf{x}_e^T \mathbf{P} \mathbf{x}_e + \frac{1}{2} \text{Tr}(\tilde{\mathbf{W}}^T \Gamma \tilde{\mathbf{W}})$$

where $\text{Tr}(\cdot)$ is the trace operation, $\Gamma \in \mathfrak{N}^{n\beta \times n\beta}$ is a positive definite weighting matrix, and $\mathbf{P} = \mathbf{P}^T \in \mathfrak{N}^{2n \times 2n}$ is a positive definite matrix satisfying the Lyapunov equation $\mathbf{A}_e^T \mathbf{P} + \mathbf{P} \mathbf{A}_e = -\mathbf{Q}$ for a given positive definite and symmetric matrix $\mathbf{Q} \in \mathfrak{N}^{2n \times 2n}$. Taking the time derivative of V along the trajectory of (18), we have

$$\begin{aligned} \dot{V} &= \frac{1}{2} \mathbf{x}_e^T (\mathbf{A}_e^T \mathbf{P} + \mathbf{P} \mathbf{A}_e) \mathbf{x}_e - \mathbf{x}_e^T \mathbf{P} \mathbf{B}_e \tilde{\mathbf{W}}^T \mathbf{z} - \text{Tr}(\tilde{\mathbf{W}}^T \Gamma \dot{\hat{\mathbf{W}}}) - \mathbf{x}_e^T \mathbf{P} \mathbf{B}_e \mathbf{M} \mathbf{D}_x^{-1} \mathbf{F}_{\text{ext}} \\ &= -\frac{1}{2} \mathbf{x}_e^T \mathbf{Q} \mathbf{x}_e - \text{Tr} \left[\tilde{\mathbf{W}}^T (\mathbf{z} \mathbf{x}_e^T \mathbf{P} \mathbf{B}_e + \Gamma \dot{\hat{\mathbf{W}}}) \right] - \mathbf{x}_e^T \mathbf{P} \mathbf{B}_e \mathbf{M} \mathbf{D}_x^{-1} \mathbf{F}_{\text{ext}} \end{aligned}$$

Therefore, the update law can be selected to be

$$\dot{\hat{\mathbf{W}}} = -\Gamma^{-1} \mathbf{z} \mathbf{x}_e^T \mathbf{P} \mathbf{B}_e \tag{19}$$

then we may have

$$\dot{V} = -\frac{1}{2} \mathbf{x}_e^T \mathbf{Q} \mathbf{x}_e - \mathbf{x}_e^T \mathbf{P} \mathbf{B}_e \mathbf{M} \mathbf{D}_x^{-1} \mathbf{F}_{\text{ext}} \tag{20}$$

Hence, in the free space tracking phase, there will be no contact force and (20) implies uniform boundedness of \mathbf{x}_e and $\tilde{\mathbf{W}}$. Square integrability of \mathbf{x}_e can also be proved by the derivation

$$\begin{aligned} \int_0^\infty (\sqrt{\mathbf{Q}} \mathbf{x}_e)^T (\sqrt{\mathbf{Q}} \mathbf{x}_e) dt &= \int_0^\infty \mathbf{x}_e^T \mathbf{Q} \mathbf{x}_e dt \\ &= -2 \int_0^\infty \dot{V} dt = -2 [V(\infty) - V(0)] < \infty \end{aligned}$$

Together with boundedness of $\dot{\mathbf{x}}_e$ ensured in (18), we may have asymptotic convergence of the tracking error during the free space tracking phase by following Barbalat’s lemma [3]. On the other hand, in the compliant motion phase ($\mathbf{F}_{\text{ext}} \neq \mathbf{0}$), we may not ensure convergence of the tracking error by using (20). Let us assume that there exists some unknown $\alpha > 0$ such that $\|\mathbf{F}_{\text{ext}}\| < \alpha$, and we would like to prove boundedness of $\mathbf{e} = \mathbf{x} - \mathbf{x}_d$. Rewrite (20) into

$$\dot{V} \leq \left(-\frac{1}{2} \lambda_{\min}(\mathbf{Q}) \|\mathbf{x}_e\| + \alpha \|\mathbf{P} \mathbf{B}_e \mathbf{M} \mathbf{D}_x^{-1}\| \right) \|\mathbf{x}_e\| \tag{21}$$

This implies $\dot{V} \leq 0$ if $\|\mathbf{x}_e\| \geq \beta$ where

$$\beta = \frac{2\alpha}{\lambda_{\min}(\mathbf{Q})} \|\mathbf{P} \mathbf{B}_e \mathbf{M} \mathbf{D}_x^{-1}\|$$

is a positive constant which is adjustable by proper selection of the pair (\mathbf{P}, \mathbf{Q}) . Therefore, boundedness of the tracking error during complaint motion can be ensured.

In summary, for a robot manipulator containing parametric uncertainties, the adaptive controller (14) and update law (19) can give impedance control performance without using force sensors or force estimators. In the free space tracking phase, the robot motion will converge to the desired trajectory. In the compliant motion phase, the robot end-effector is going to touch the environment, and robot motion will deviate from the desired trajectory. However, the tracking error will still be bounded.

5. Computer simulations

Simulation cases are given in this section to verify the effectiveness of the proposed designs. Let us consider a two-link rigid robot as shown in Fig. 1 where $m_1 = m_2 = 0.5(\text{kg})$ are link masses, $l_1 = l_2 =$

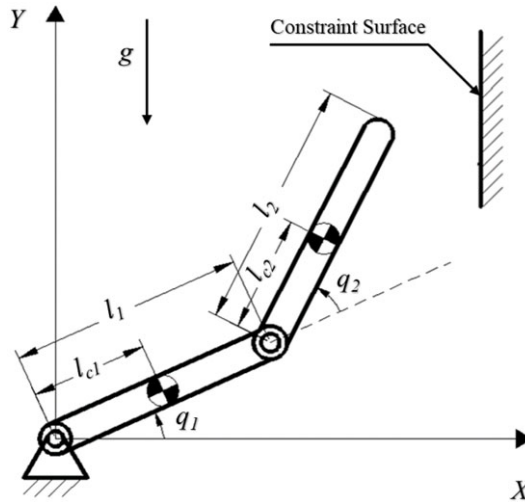


Figure 1. A two-link robot manipulator.

0.75(m) are link lengths, $l_{c1} = l_{c2} = 0.375(m)$ are distances of the center of gravity to the actuator, and $I_1 = I_2 = 0.0234(kg \cdot m^2)$ are moments of inertia of the links. The model of the robot can be derived to be in the form of (7) where [3, 5].

$$\begin{aligned}
 \mathbf{D}(\mathbf{q}) &= \begin{bmatrix} m_1 l_{c1}^2 + m_2 d_1 + I_1 + I_2 & m_2 (l_{c2}^2 + l_1 l_{c2} \cos q_2) + I_2 \\ m_2 (l_{c2}^2 + l_1 l_{c2} \cos q_2) + I_2 & m_2 l_{c2}^2 + I_2 \end{bmatrix} \\
 \mathbf{C}(\mathbf{q}, \dot{\mathbf{q}}) &= \begin{bmatrix} -m_2 l_1 l_{c2} \sin q_2 \dot{q}_2 & -m_2 l_1 l_{c2} \sin q_2 (\dot{q}_1 + \dot{q}_2) \\ m_2 l_1 l_{c2} \sin q_2 \dot{q}_1 & 0 \end{bmatrix} \\
 \mathbf{g}(\mathbf{q}) &= \begin{bmatrix} (m_1 l_{c1} + m_2 l_1) g \cos q_1 + m_2 l_{c2} g \cos(q_1 + q_2) \\ m_2 l_{c2} g \cos(q_1 + q_2) \end{bmatrix}
 \end{aligned}$$

with $d_1 = l_1^2 + l_{c2}^2 + 2l_1 l_{c2} \cos q_2$. The motion of the robot manipulator is in the vertical plane, and a vertical smooth constraint surface is at the position $x = 0.95$ m whose stiffness is assumed to be $k = 5 \times 10^4$ N/m. The desired trajectory begins from (0.8m, 0.8m) which is a circle centering at (0.8m, 1m) with radius 0.2(m). The end-effector starts from (0.8m, 0.75m) to track the desired trajectory in 10 s. The initial condition of the robot in the joint space is then $\mathbf{q}(0) = [0.0022 \ 1.5019 \ 0 \ 0]^T$. There is a 0.05m initial error in the Y direction which can be used to observe the transient response of the free space tracking.

There are two simulation cases. The first case is for the performance comparisons of Hogan’s impedance controller and the proposed force sensorless impedance controller under the assumption that all system parameters are known. For case 2, the system parameters are not available and the proposed adaptive controller is employed in the simulation.

CASE 1: In this case, all system parameters are assumed to be given, and Hogan’s impedance controller (10) and the proposed force cancelation impedance controller (12) are used in the simulation for performance comparisons. The target impedance coefficient matrices are selected as $\mathbf{M} = 0.15\mathbf{I}_2$, $\mathbf{B} = 100\mathbf{I}_2$, and $\mathbf{K} = 3000\mathbf{I}_2$ for both the controllers. These values are selected to have a natural frequency 140 rad/s and damping ratio 2.375 in the closed-loop dynamics so that the impact during contact can be alleviated. The matrices \mathbf{M} , \mathbf{B} , and \mathbf{K} are selected to be diagonal so that the target impedance becomes a decoupled MIMO system. Selections of the diagonal elements are equivalent to the selections of the

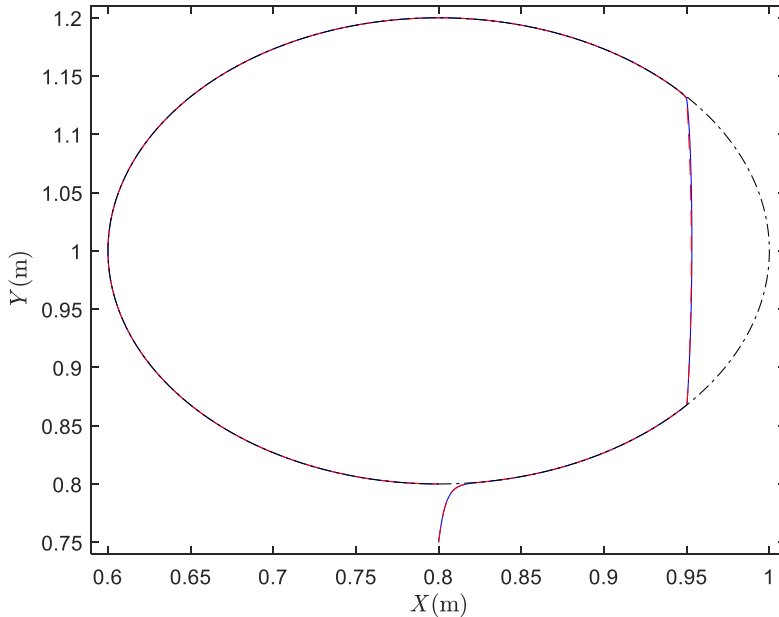


Figure 2. Tracking performance in Cartesian space in Case 1. The dash-dot line is the desired trajectory, the solid line is the trajectory of the end-effector under the control of the proposed controller, and the dashed line is the trajectory of the end-effector under the control of Hogan's impedance control.

dynamics of the corresponding second-order linear subsystems. The behavior of these subsystems represents the performance of both the free space tracking and compliant motion phase. The simulation results are shown in Figs. 2–5. The trajectory tracking performance in the Cartesian space is presented in Fig. 2 where the dash-dot line is the desired trajectory, the solid line is the trajectory of the end-effector based on the proposed controller, and the dashed line is the trajectory of Hogan's controller. The two control results are almost identical in the free space tracking phase. When the end-effector touches the constraint surface, there are no obvious impact activities for the two controllers. During the compliant motion phase, both trajectories slide on the surface smoothly. When leaving the surface, the two controllers drive the robot manipulator effectively to catch up with the desired trajectories nicely. Figure 3 shows the tracking performance in the joint space. It is seen that both the transients end in about 0.1 s, and the tracking errors are small afterward in the free space. The deviations of the trajectories from the desired path are in the compliant motion phases. Figure 4 gives the control efforts of the two controllers. We see that they are identical during the free space tracking phase, while the control effort of the new controller during the compliant motion is slightly smaller. Figure 5 is the time histories of the contact forces. Since the constraint surface is smooth, it can only exhibit a normal force. The simulation setup is specifically designed to make the contact force on the second joint be always zero. The peak value of the contact force for the traditional impedance control is about 140(N), and it is about 160(N) for the new controller.

The simulation results show that the proposed controller gives almost identical motion trajectory as the Hogan's design but induces slightly different contact force under the assumption that all system parameters are available. Therefore, the force cancelation technique is feasible to avoid the installation of force sensors in the impedance control paradigm.

CASE 2: The previous case verifies that the proposed force cancelation controller can give similar response as Hogan's controller under the assumption that the system parameters are available even though the force sensor information is not used. Here, in this case, we would like to assume that the parameters in $(\mathbf{D}_x, \mathbf{C}_x, \mathbf{g}_x)$ are not available and the proposed adaptive controller (14) with the update law

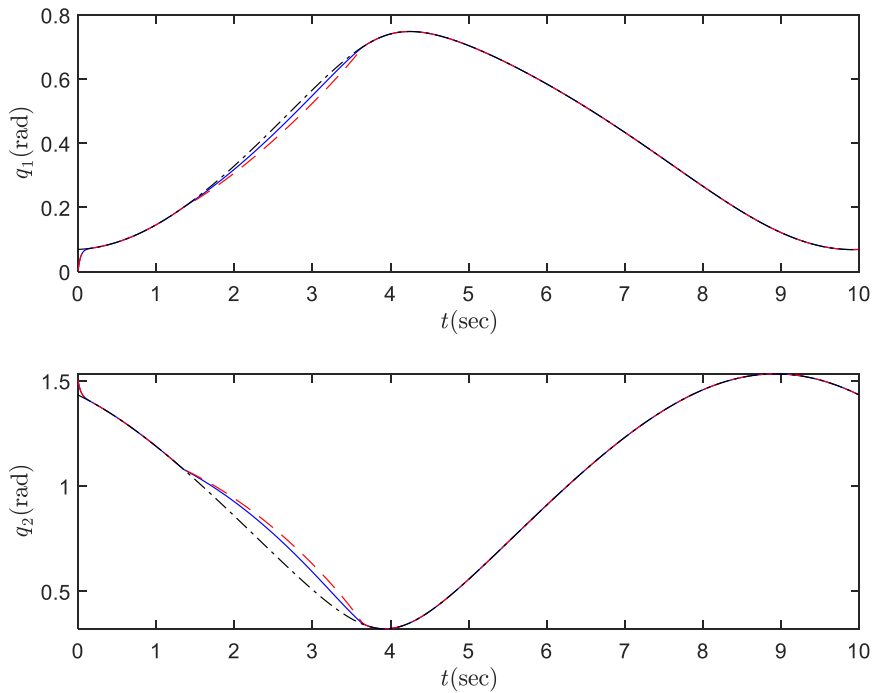


Figure 3. Tracking performance in joint space forces in Case 1.

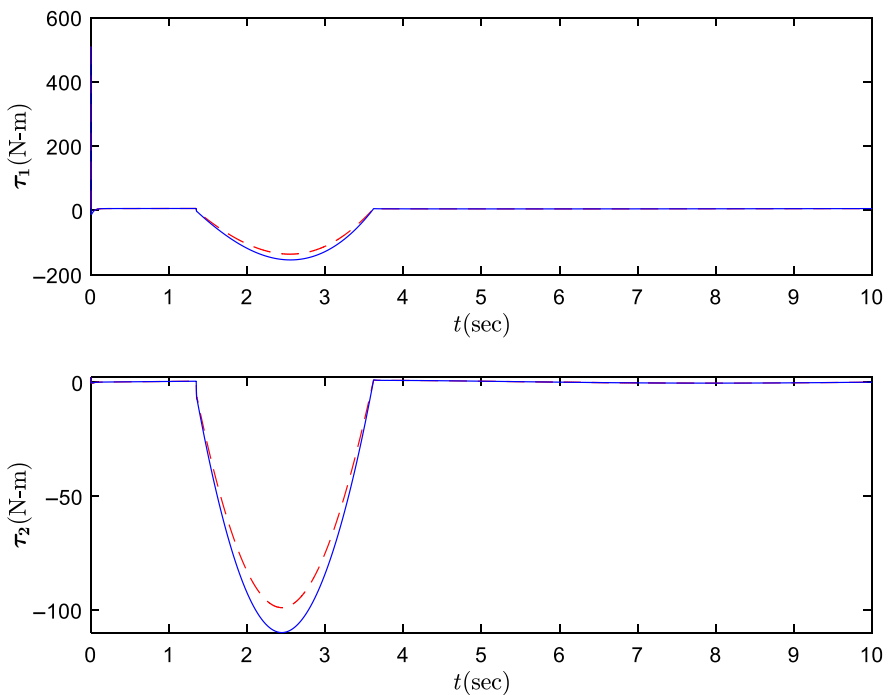


Figure 4. Time histories of control efforts in Case 1.

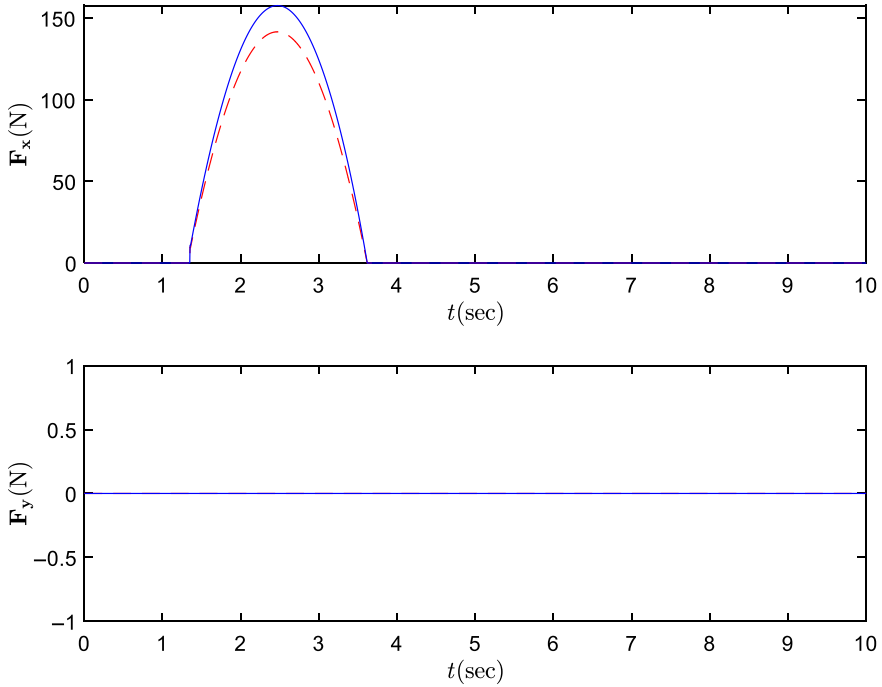


Figure 5. Time histories of contact forces in Case 1.

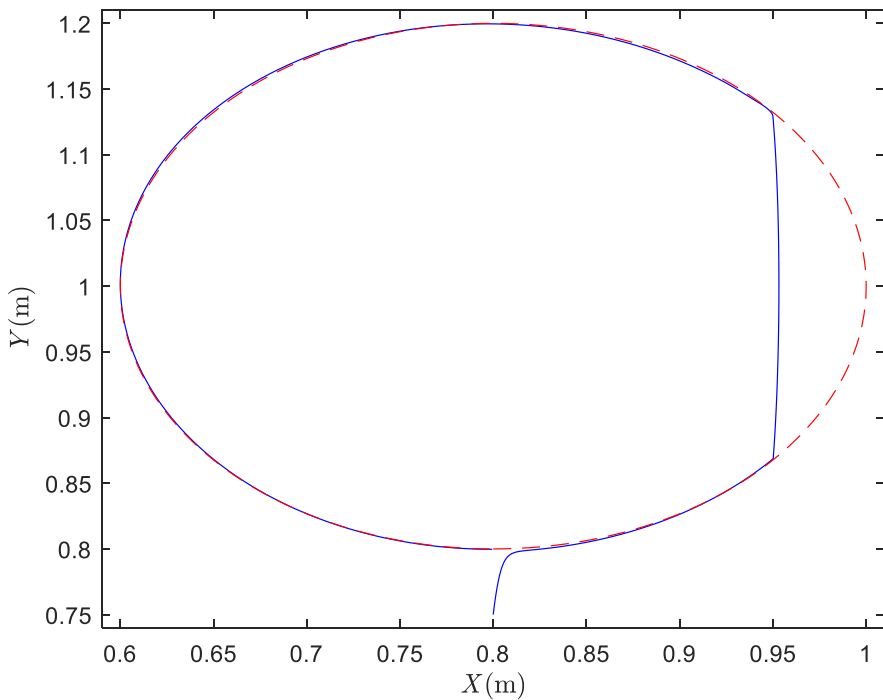


Figure 6. Tracking performance in Cartesian space in Case 2.

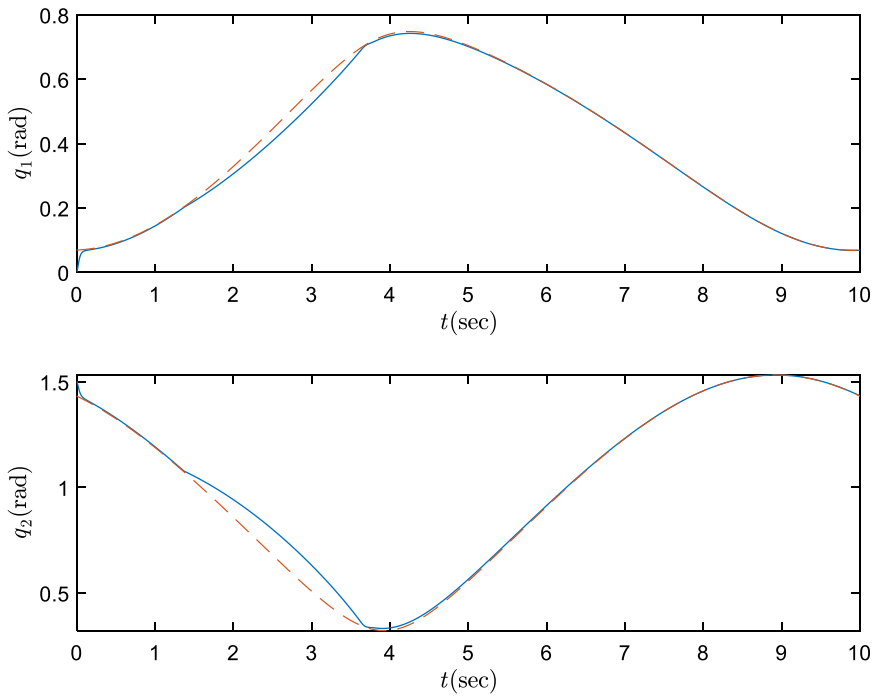


Figure 7. Tracking performance in joint space in Case 2.

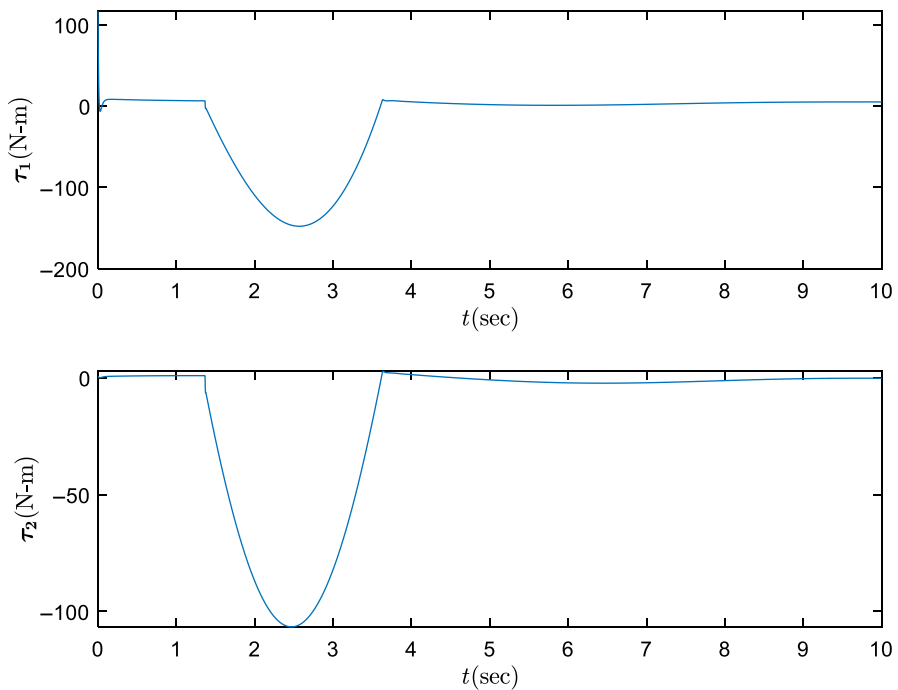


Figure 8. Time history of control efforts in Case 2.

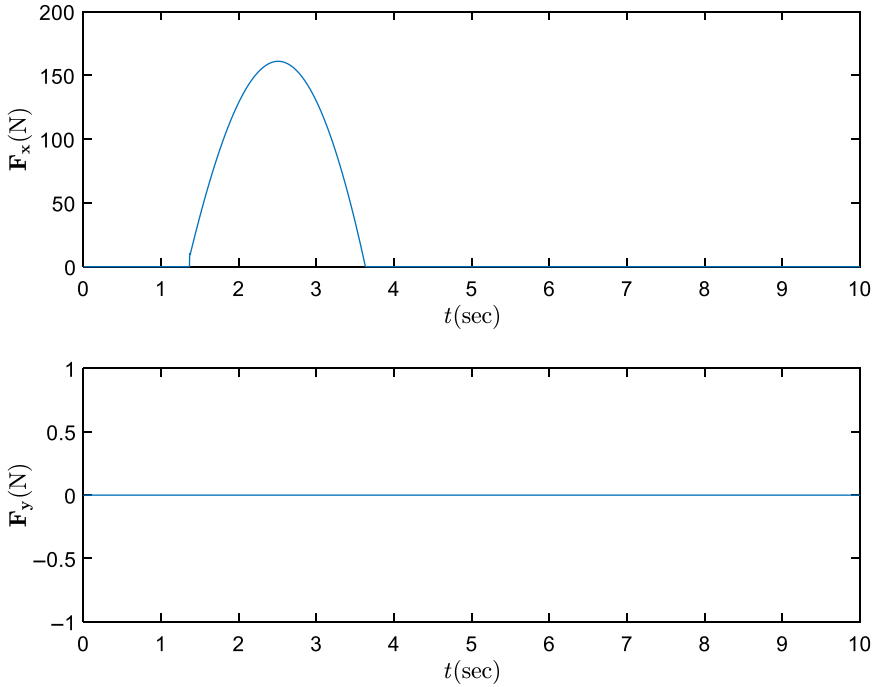


Figure 9. Time history of contact force in Case 2.

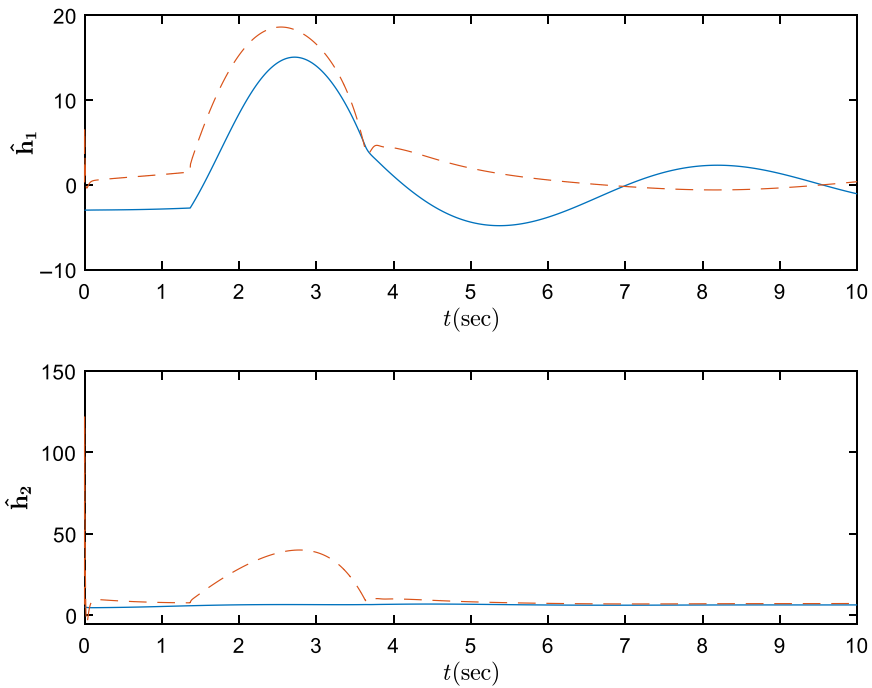


Figure 10. Function approximation results.

(19) is implemented. The target impedance coefficient matrices are the same as those in the previous case, and the controller parameters are selected to be $\Gamma = 0.1 * \mathbf{I}_{21 \times 21}$ and

$$\mathbf{Q} = \begin{bmatrix} 20000 & 0 & 3000 & 0 \\ 0 & 140000 & 0 & 1200 \\ 3000 & 0 & 600 & 0 \\ 0 & 1200 & 0 & 300 \end{bmatrix}.$$

A 21-term Fourier series is utilized as the basis functions, and the initial estimate is selected to be $\hat{\mathbf{h}}(0) = [-3 \ 5]$. The initial weighting vectors for function approximation are $\hat{\mathbf{w}}_1(0) = [-30 \ \dots \ 0]^T \in \mathfrak{R}^{21 \times 1}$ and $\hat{\mathbf{w}}_2(0) = [50 \ \dots \ 0]^T \in \mathfrak{R}^{21 \times 1}$. The simulation results are shown in Figs. 6–10. The tracking performance in the Cartesian space given in Fig. 6 is like the one in case 1. The transient trajectory is smooth even though the system parameters are unavailable. Figure 7 shows that the tracking performance in the joint space is nice where the transient is within 0.1 s. Figure 8 gives the control efforts to the joints whose magnitudes are realizable. Figure 9 is the time histories of the contact forces whose peak value is the same as the one in Case 1. Figure 10 is the parameter estimation time history where all values are bounded as proved in Section 4. The discrepancies in the function approximation do not invalidate the convergence of the free space tracking as seen in Figs. 6 and 7. In summary, the adaptive control version of the proposed force sensorless impedance controller can give almost the same performance as the new controller for the known system parameters case.

6. Conclusions

A force sensorless impedance control law has been designed for robot manipulators without using force estimators. This is achieved by modifying the coefficient matrix of the contact force in the target impedance so that the force feedback term in the impedance control law can be canceled. A force sensorless adaptive impedance controller has also been suggested for the systems containing parametric uncertainties. All these new designs give almost the same performance as Hogan’s impedance control in the free space tracking phase. During the compliant motion control phase, the end-effector can slide on the constraint surface smoothly. Both the mathematical proofs and computer simulation results show effectiveness of the proposed designs.

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Competing interests. The authors declare none.

References

- [1] M. H. Raibert and J. J. Craig, “Hybrid position/force control of manipulators,” *ASME J. Dyn. Syst. Meas. Control* **103**(2), 126–133 (1981).
- [2] J. J. Craig, *Introduction to Robotics: Mechanics and Control* (3rd edition, Pearson Prentice Hall, Upper Saddle River, NJ, 2005).
- [3] A. C. Huang and M. C. Chien. *Adaptive Control of Robot Manipulators – A Unified Regressor-Free Approach* (World Scientific, 2010).
- [4] N. Hogan, “Impedance control: An approach to manipulation: Part1—theory, Part2—implementation, Part3—an approach to manipulation,” *ASME J. Dyn. Syst. Meas. Control* **107**(1), 1–24 (1985).
- [5] M. W. Spong, S. Hutchinson and M. Vidyasagar. *Robot Modeling and Control* (John Wiley & Sons, Hoboken, NJ, 2006).
- [6] P. Song, Y. Yu and X. Zhang, “A tutorial survey and comparison of impedance control on robotic manipulation,” *Robotica* **37**(5), 801–836 (2019).

- [7] H. F. N. Al-Shuka, S. Leonhardt, W. H. Zhu, R. Song, C. Ding and Y. Li, "Active impedance control of bioinspired motion robotic manipulators: An overview," *Appl. Bionics Biomech.* **2018**, 8203054 (2018).
- [8] T. Murakami, F. Yu and K. Ohnishi, "Torque sensorless control in multi-degree-of-freedom manipulator," *IEEE Trans. Ind. Electron.* **40**(2), 259–265 (1993).
- [9] K. S. Eom, I. H. Suh, W. K. Chung and S. R. Oh, "Disturbance observer-based force control of robot manipulator without force sensor," *IEEE Int. Conf. Robot. Autom.* **4**, 3012–3017 (1998).
- [10] A. Alcocer, A. Robertsson, A. Valera and R. Johansson, "Force estimation and control in robot manipulators," *IFAC Proc.* **36**(17), 55–60 (2003).
- [11] S. Tungpataratana Wong, K. Ohishi and T. Miyazaki, "Force sensorless workspace impedance control considering resonant vibration of industrial robot," *31st Annu. Proc. IEEE Conf. Ind. Electron. Soc.* 1878–1883 (Raleigh, NC, 2005).
- [12] M. S. Erden and T. Tomiyama, "Human-intent detection and physically interactive control of a robot without force sensors," *IEEE Trans. Robot.* **26**(2), 370–382 (2010).
- [13] M. Van Damme, P. Beyl, B. Vanderborght, V. Grosu, R. Van Ham, I. Vanderniepen, A. Matthys and D. Lefeber, "Estimating robot end-effector force from noisy actuator torque measurements," *2011 IEEE Int. Conf. Robot. Autom.*, 1108–1113 (Shanghai, 2011).
- [14] S. Tachi, T. Sakaki, H. Arai, S. Nishizawa and J. F. Pelaez-Polo, "Impedance control of a direct-drive manipulator without using force sensors," *Adv. Robot.* **5**(2), 183–205 (2012).
- [15] A. Wahrburg, E. Morara, G. Cesari, B. Matthias and H. Ding, "Cartesian contact force estimation for robotic manipulators using Kalman filters and the generalized momentum," *2015 IEEE Int. Conf. Autom. Sci. Eng.*, 1230–1235 (Gothenburg, 2015).
- [16] M. Ragaglia, A. M. Zanchettin, L. Bascetta and P. Rocco, "Accurate sensorless lead-through programming for lightweight robots in structured environments," *Robot. Comput. Integr. Manuf.* **39**, 9–21 (2016).
- [17] J. H. Choi, J. H. Kwak, J. An and S. Oh, "Force sensorless multi-functional impedance control of rehabilitation robot," *IFAC-PapersOnLine* **50**(1), 12077–12082 (2017).
- [18] F. Yuan, Y. Qian, L. Gao, Z. Yuan and W. Wan, "Position-based impedance force controller with sensorless force estimation," *Assembly Autom.* **39**(3), 489–496 (2019).
- [19] L. Han, W. Xu, B. Li and P. Kang, "Collision detection and coordinated compliance control for a dual-arm robot without force/torque sensing based on momentum observer," *IEEE/ASME Trans. Mechatron.* **24**(5), 2261–2272 (2019).
- [20] F. Zeng, J. Xiao and H. Liu, "Force/torque sensorless compliant control strategy for assembly tasks using a 6-DOF collaborative robot," *IEEE Access* **7**, 108795–108805 (2019).
- [21] A. Dong, Z. Du and Z. Yan, "A sensor interaction forces estimator for bilateral teleoperation system based on online sparse Gaussian process regression," *Mech. Mach. Theory* **143**, 103620 (2020).
- [22] G. Peng, C. Yang, W. He and C. L. P. Chen, "Force sensorless admittance control with neural learning for robots with actuator saturation," *IEEE Trans. Ind. Electron.* **67**(4), 3138–3148 (2020).
- [23] G. Peng, C. L. P. Chen, W. He and C. Yang, "Neural learning based force sensorless admittance control for robots with input deadzone," *IEEE Trans. Ind. Electron.* **68**(6), 5184–5196 (2021).
- [24] C. Yang, G. Peng, L. Cheng, J. Na and Z. Li, "Force sensorless admittance control for teleoperation of uncertain robot manipulator using neural networks," *IEEE Trans. Syst. Man Cybern. Syst.* **51**(5), 3282–3292 (2021).
- [25] L. Roveda, A. A. Shahid, N. Iannacci and D. Piga, "Sensorless optimal interaction control exploiting environment stiffness estimation," *IEEE Trans. Control Syst. Technol.* **30**(1), 218–233 (2022).
- [26] M. C. Chien and A. C. Huang, "Adaptive impedance control of robot manipulators based on function approximation technique," *Robotica* **22**(4), 395–403 (2004).