

# Physical Human Robot Interaction

Emanuele Feola, VR474837

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# 1 Homework 1

## 1.1 Assignment description

- Implement the Single-Input Single-Output Four-channel bilateral teleoperation architecture with

$$C_m = B_m + \frac{K_m}{s}$$

$$C_s = B_s + \frac{K_s}{s}$$

$$Z_m^{-1} = \frac{1}{M_m s}$$

$$Z_s^{-1} = \frac{1}{M_s s}$$

where  $M_m = 0.5$ ,  $M_s = 2$ .

- What happens if

$$Z_m^{-1} = \frac{1}{M_m s + D_m}$$

$$Z_s^{-1} = \frac{1}{M_s s + D_s}$$

with  $D_m = 5$  and  $D_s = 10$ ?

- For the reference signal  $x^d(t)$  in SISO system, it is possible to use

- a sinusoidal signal to test the dynamic response in free motion for different frequencies
- a step response of a first-order low-pass filter with target value higher than the position of the environment  $x_e$  to test the interaction response

## 1.2 Assumptions

- the network delay is zero
- we know the exact dynamics of both master and slave manipulators
- position and force measurements are available for both master and slave manipulators

### 1.3 4 channel - schema

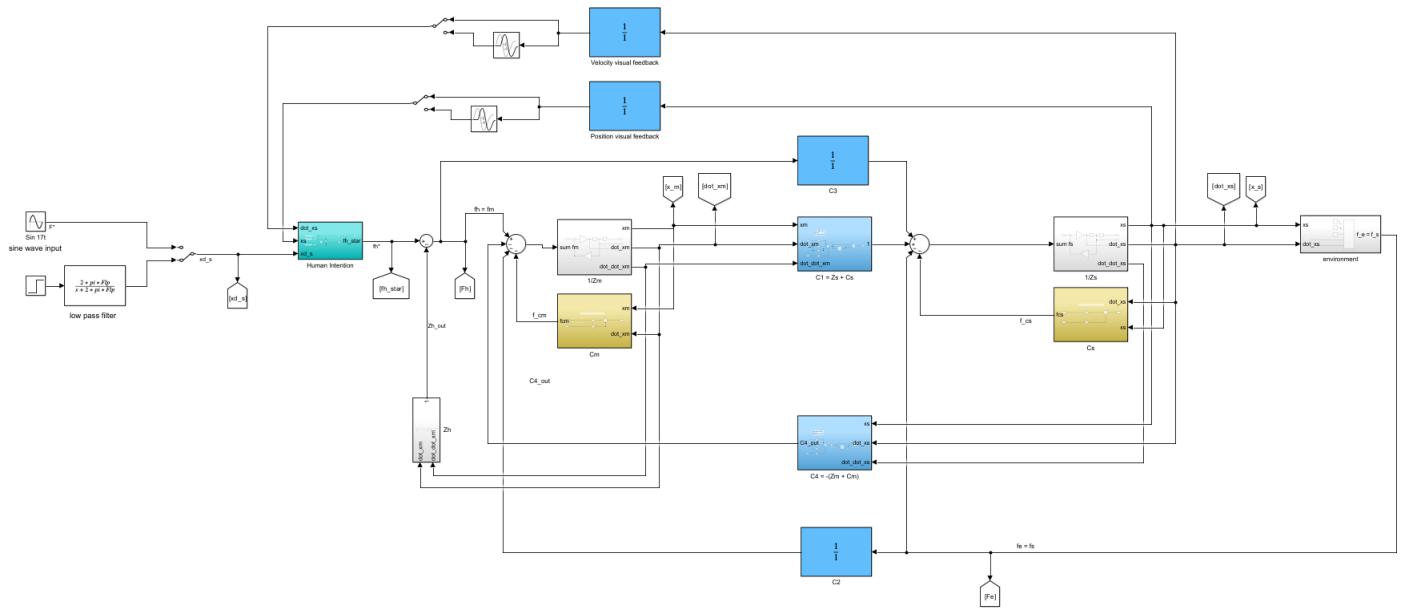


Figure 1: 4 channel architecture - simulink schema

## 1.4 4 channel - sinusoidal reference

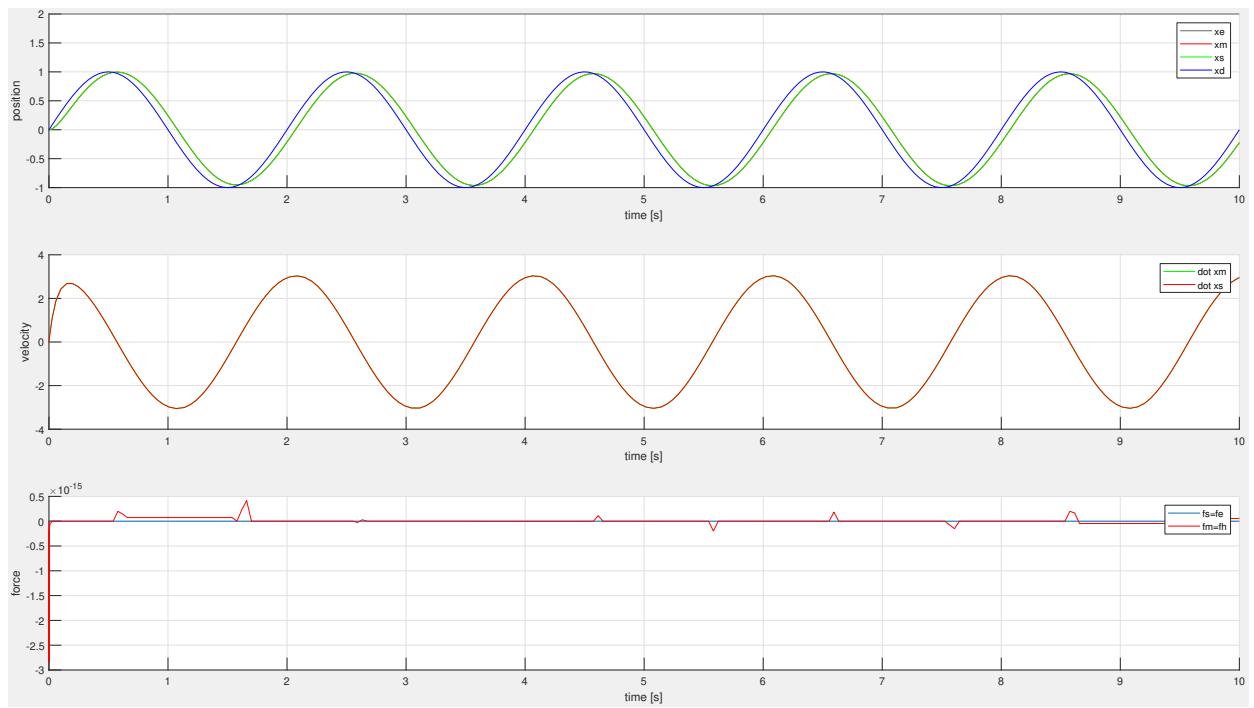


Figure 2: 4 channel architecture - free motion with sinusoidal reference

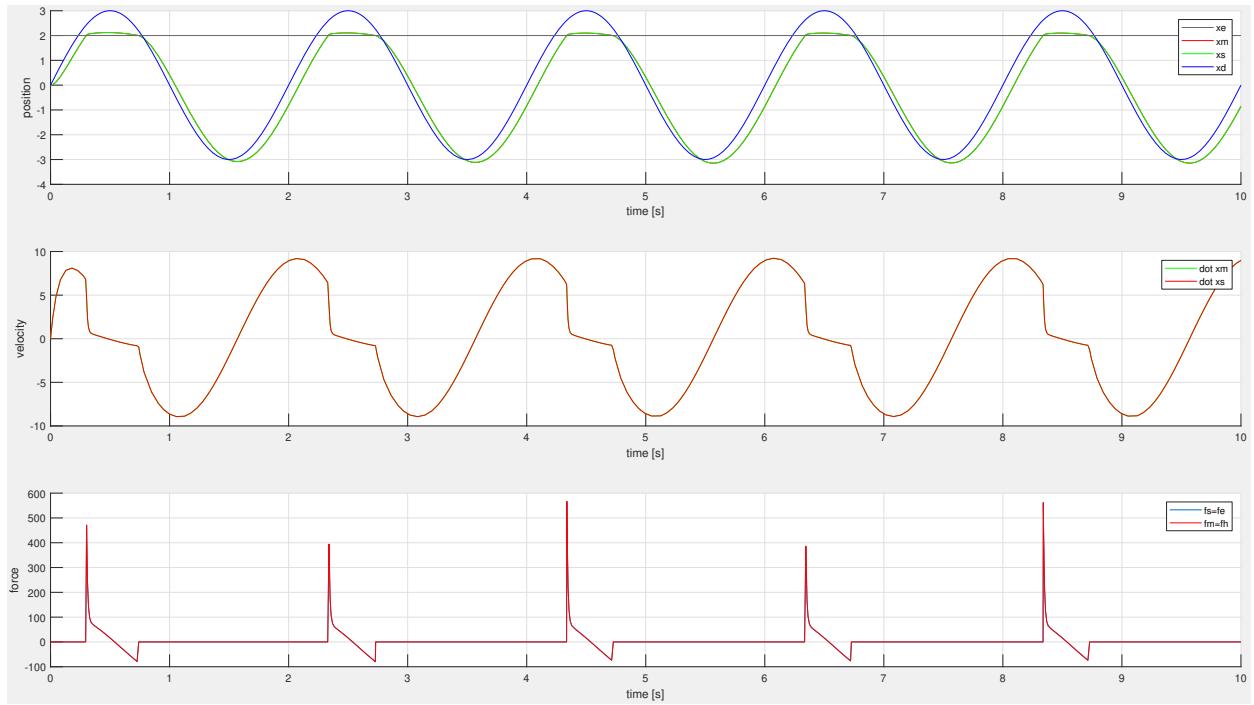


Figure 3: 4 channel architecture - contact with sinusoidal reference

## 1.5 4 channel - sinusoidal reference, $D_m = 5$ , $D_s = 10$

We lose transparency, i.e.  $x_m \neq x_e$ , because we are not compensating in C1 and C4 controllers the correct manipulators dynamics. If we add  $D_m$  and  $D_s$  also in C1 and C4, then we get transparency again.

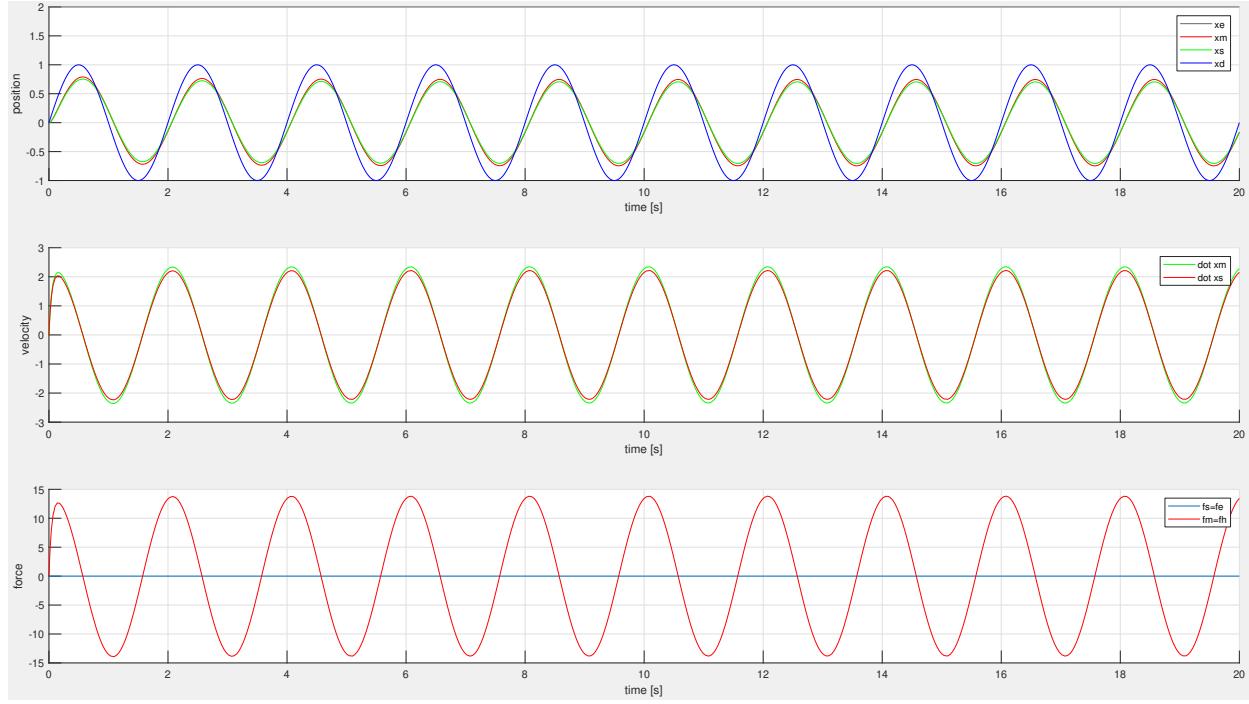


Figure 4: 4 channel architecture - free motion with sinusoidal reference,  $D_m$  and  $D_S$  not compensated

## 1.6 4 channel - step reference

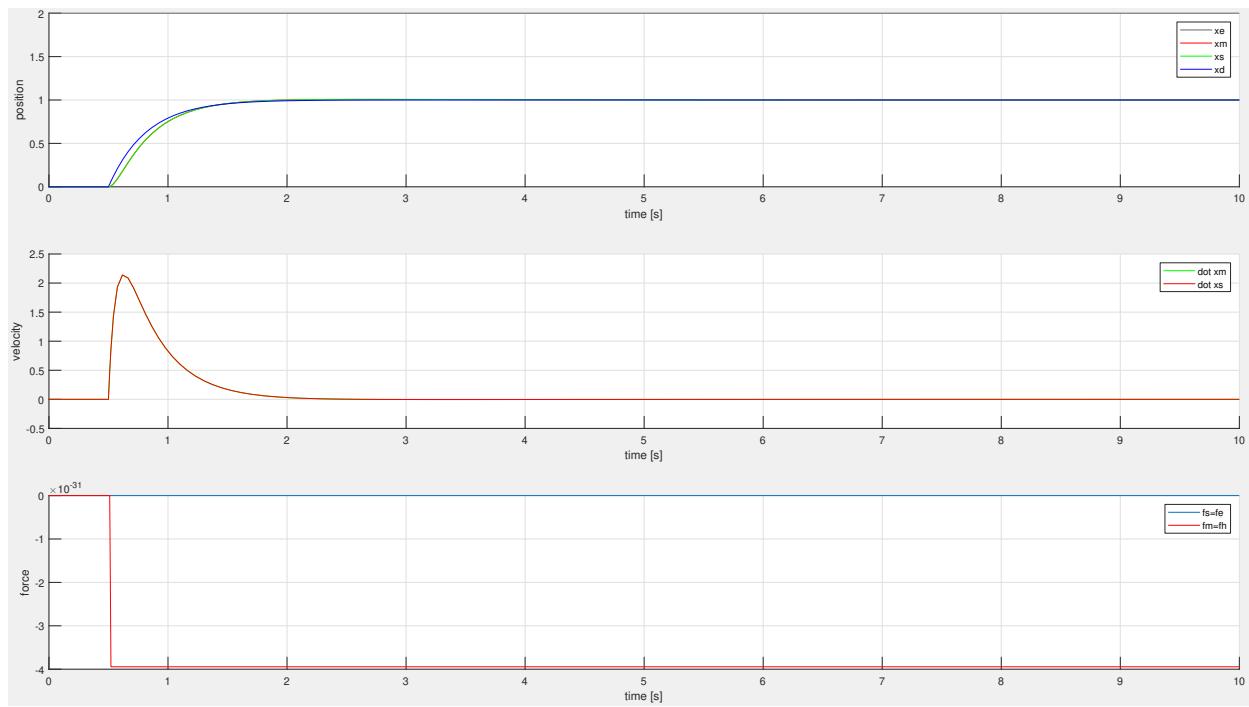


Figure 5: 4 channel architecture - free motion with step reference

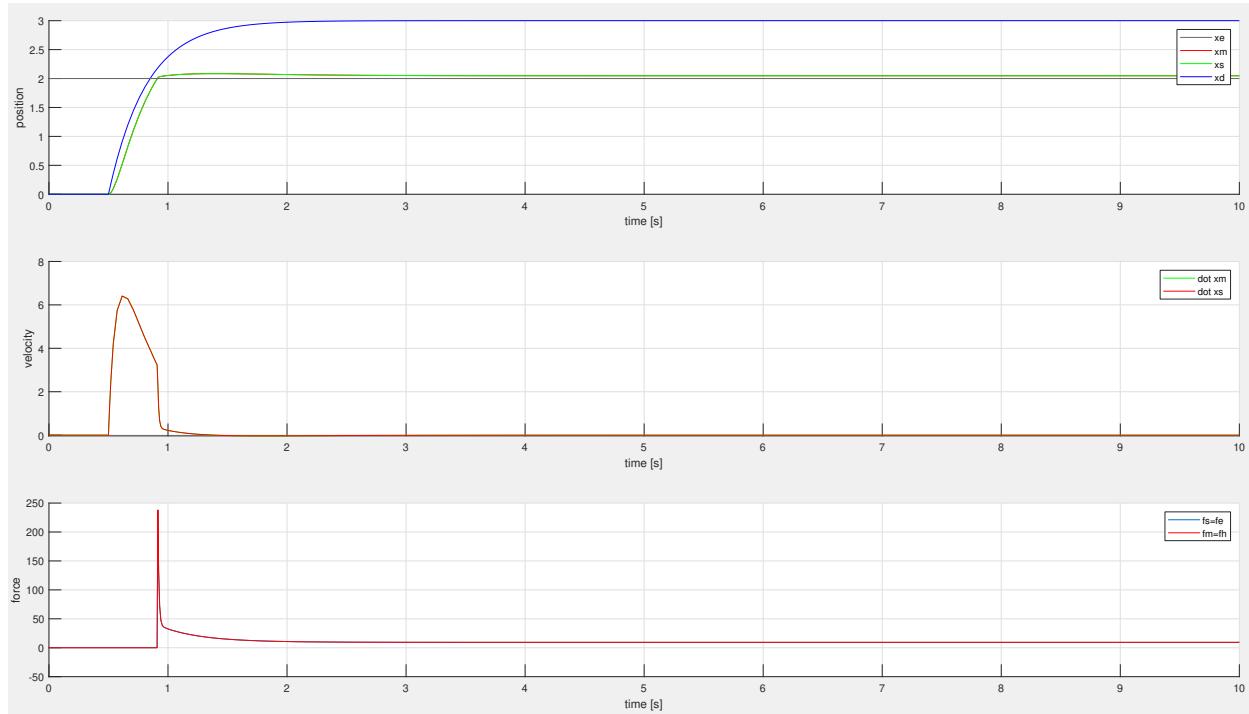


Figure 6: 4 channel architecture - contact with step reference

## 2 Homework 2

### 2.1 Assignment description

- Implement the three Two-Channel bilateral teleoperation architectures and the Three-Channel bilateral teleoperation architecture. Same parameters as in HW #1.
- What happens if transportation delays (see Simulink) are added in series at the controllers  $C_i$  (light blue blocks) in the different architectures?

### 2.2 Considerations

- By removing sensors, either force or position sensors, we lose perfect transparency, i.e.  $x_m! = x_s$ . - By adding a delay we get closer to instability and system starts to have an oscillatory component like behaviour

Three channel:

- we delete the force channel from master to slave
- we delete the force sensor on the haptic device
- we keep the force sensor on end-effector of the slave

Two channel pos-pos:

- we delete the force channels from master to slave and from slave to master
- to implement this architecture we do not need any force sensors

Two channel force-pos:

- we delete the force channel from master to slave
- we delete the velocity channel from slave to master

Two channel force-force:

- we delete the velocity channel from master to slave
- we delete the velocity channel from slave to master

## 2.3 Three-Channel bilateral teleoperation architecture

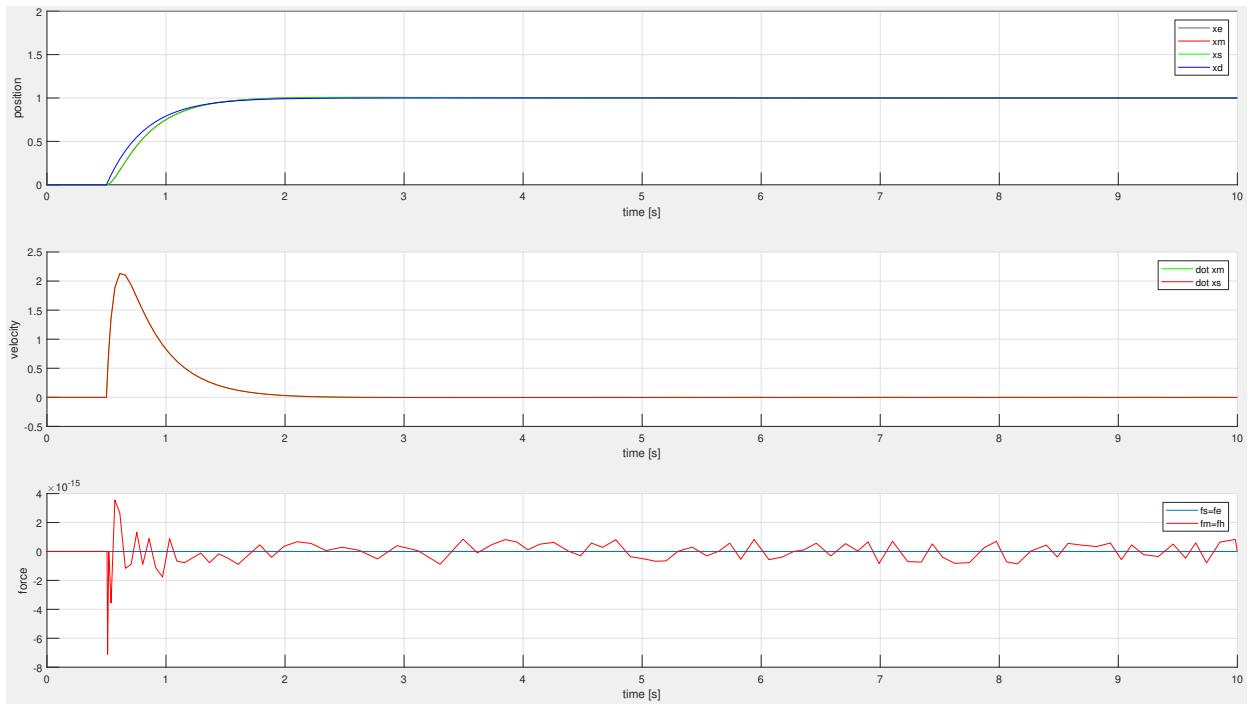


Figure 7: Three-Channel bilateral teleoperation architecture - free motion with step reference

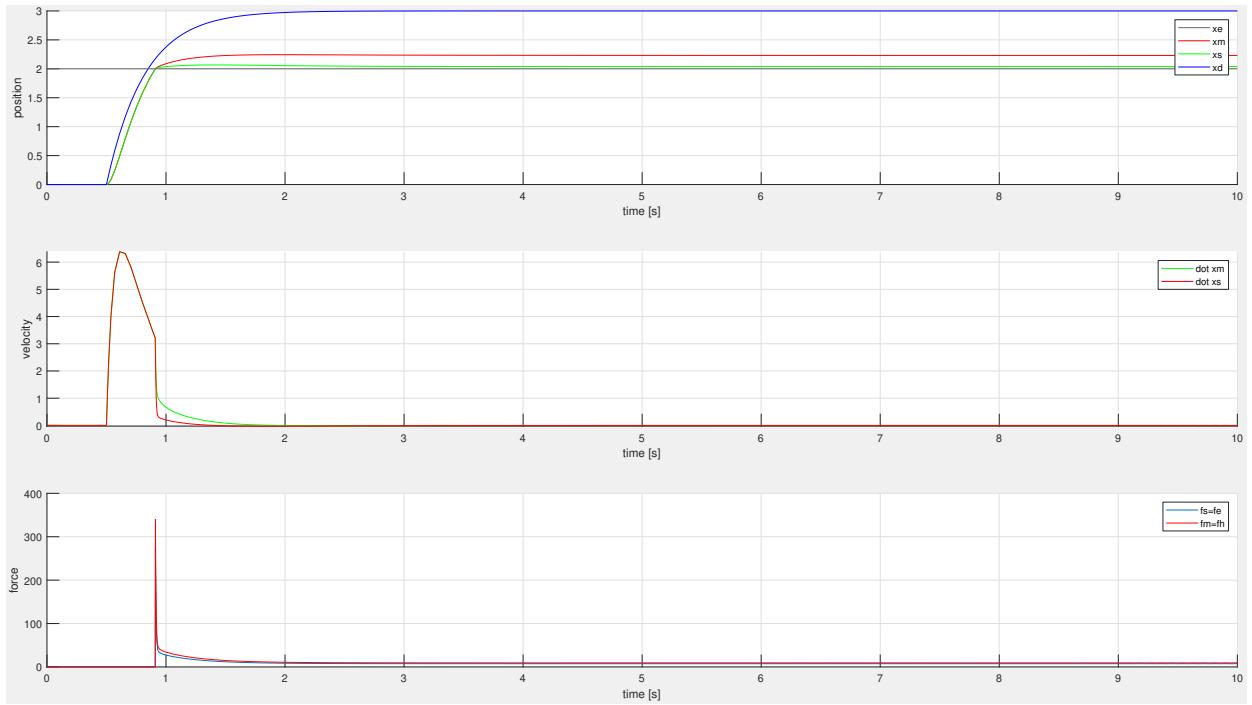


Figure 8: Three-Channel bilateral teleoperation architecture - contact with step reference

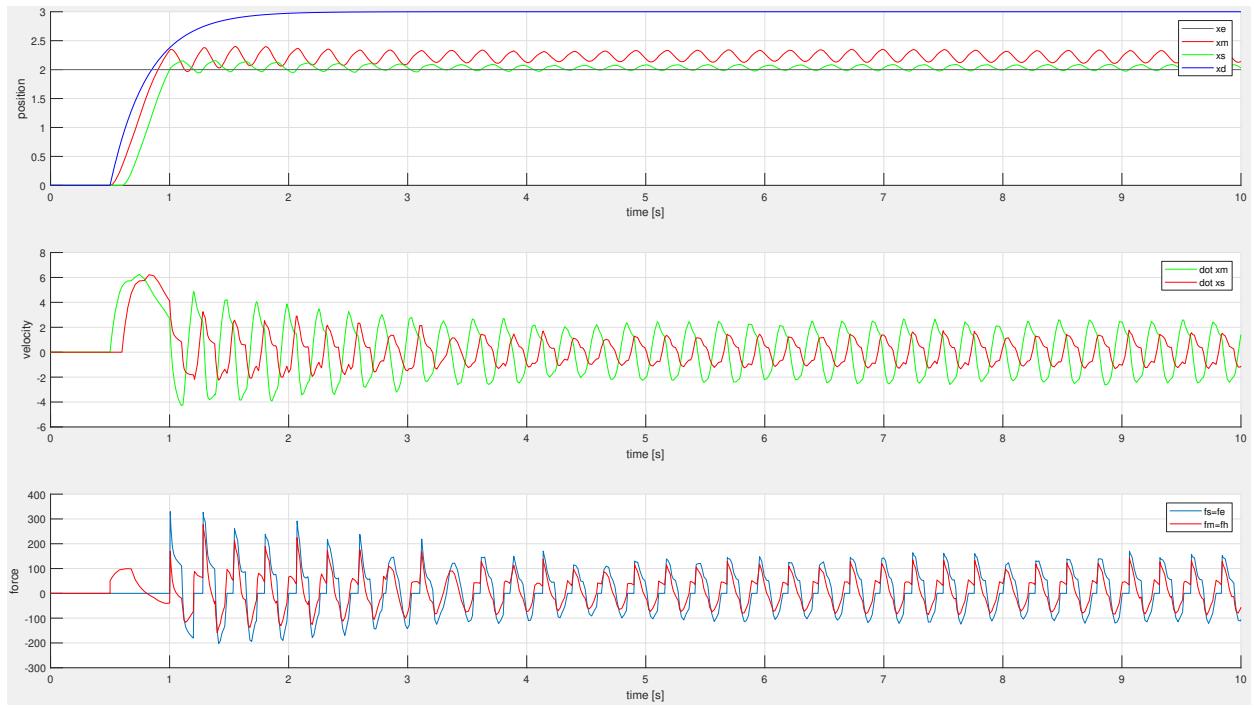


Figure 9: Three-Channel bilateral teleoperation architecture - contact with step reference and  $0.1s$  delay

## 2.4 Two-Channel position-position bilateral teleoperation architecture

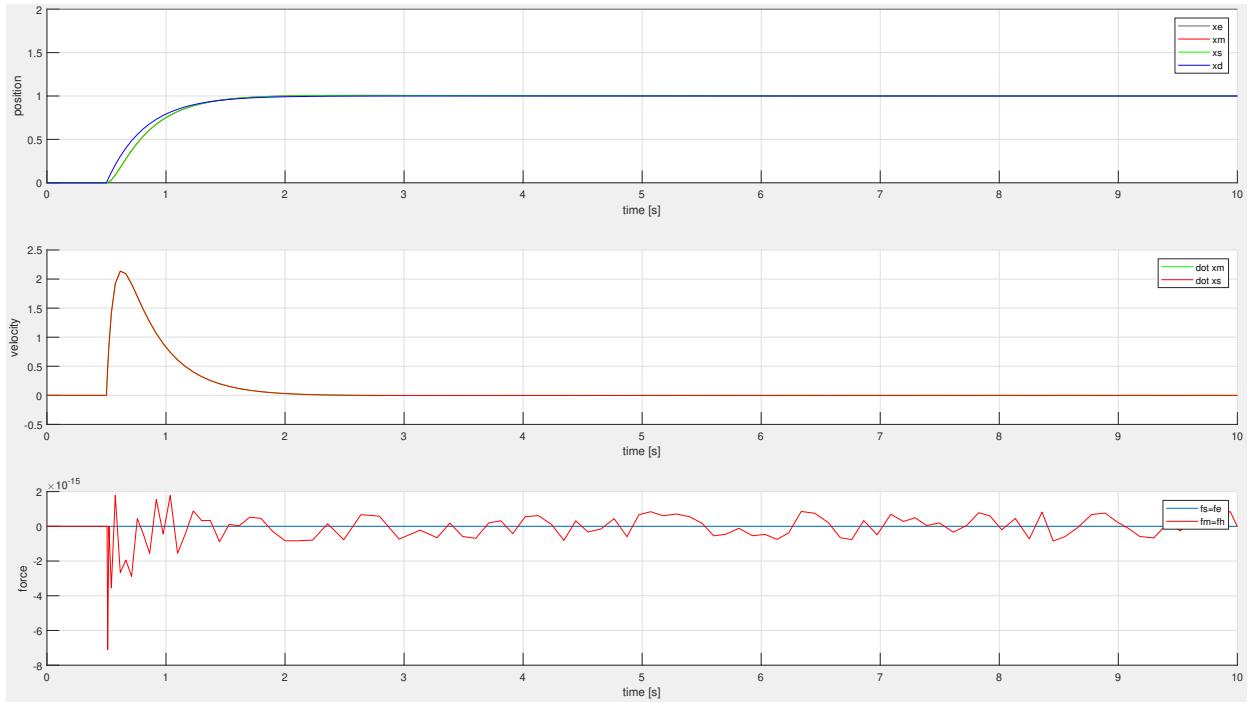


Figure 10: Two-Channel position-position bilateral teleoperation architecture - free motion with step reference

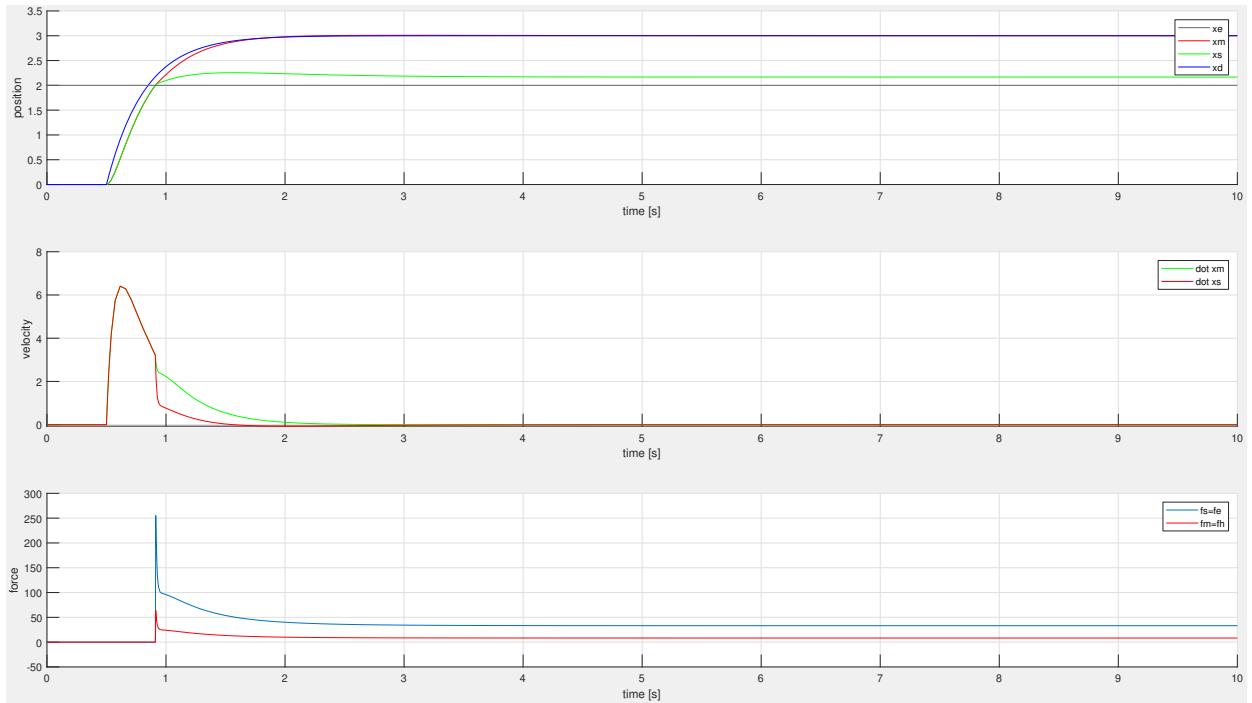


Figure 11: Two-Channel position-position bilateral teleoperation architecture - contact with step reference

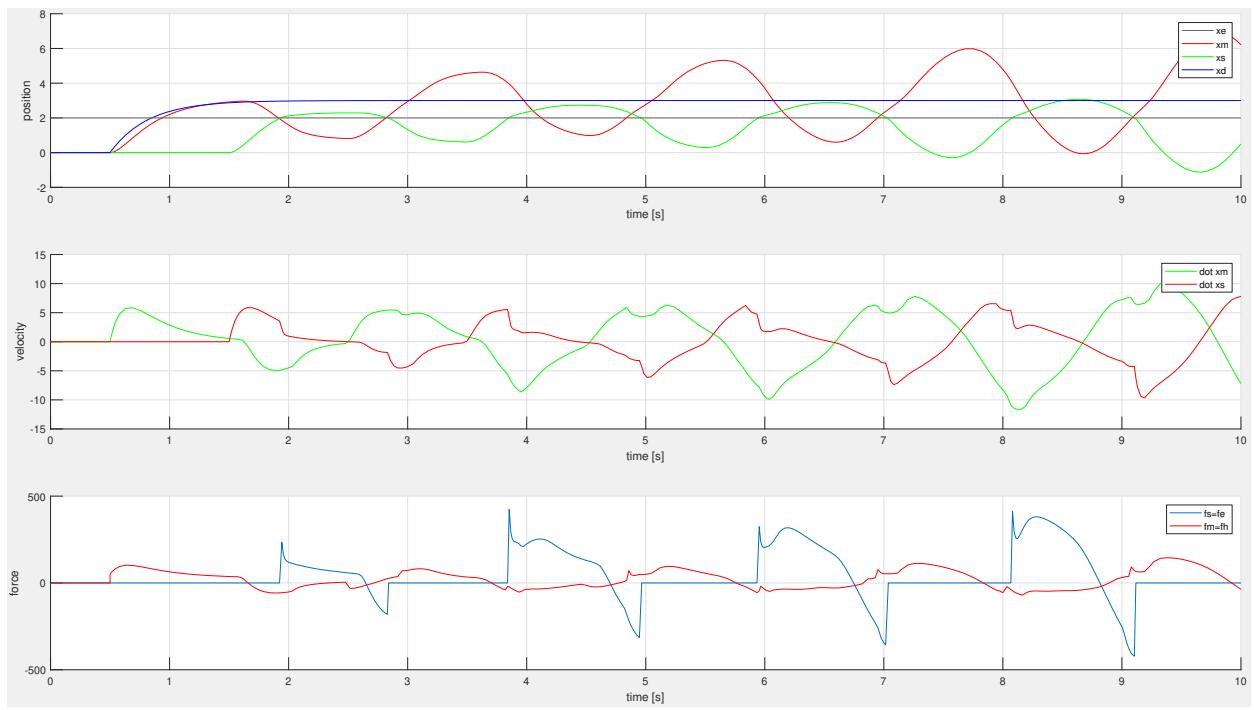


Figure 12: Two-Channel position-position bilateral teleoperation architecture - contact with step reference and 0.1s delay

## 2.5 Two-Channel force-position bilateral teleoperation architecture

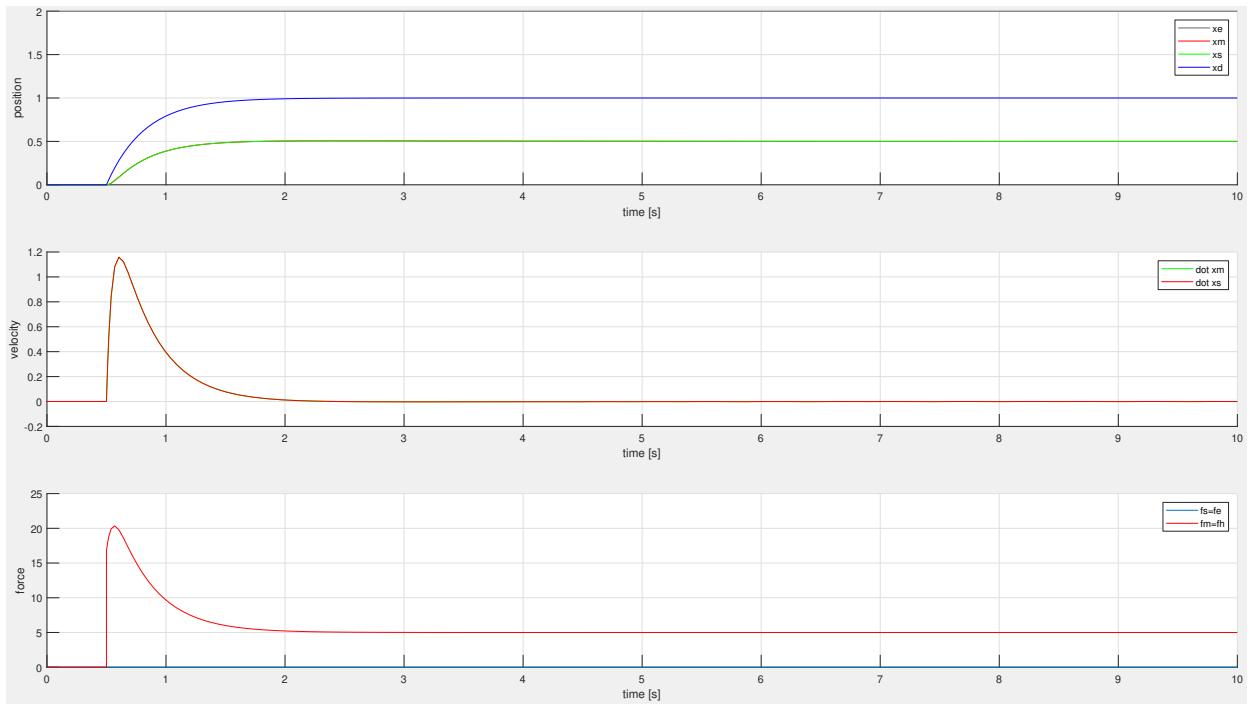


Figure 13: Two-Channel force-position bilateral teleoperation architecture - free motion with step reference

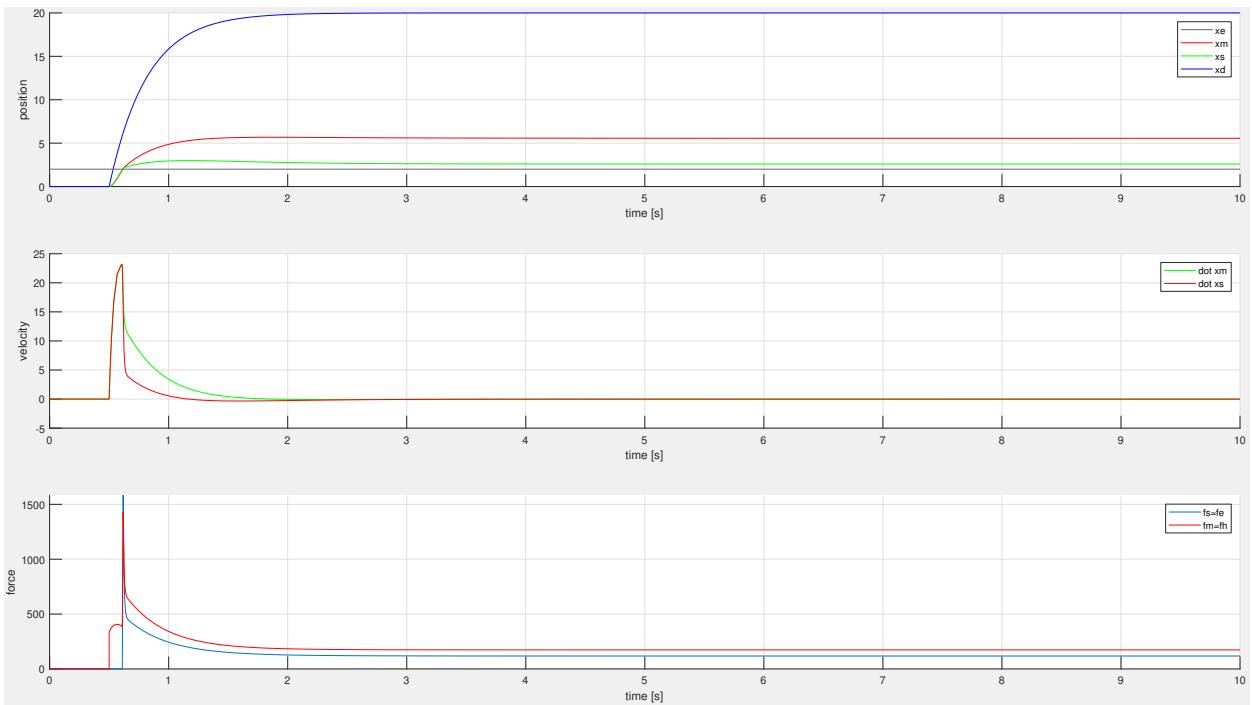


Figure 14: Two-Channel force-position bilateral teleoperation architecture - contact with step reference

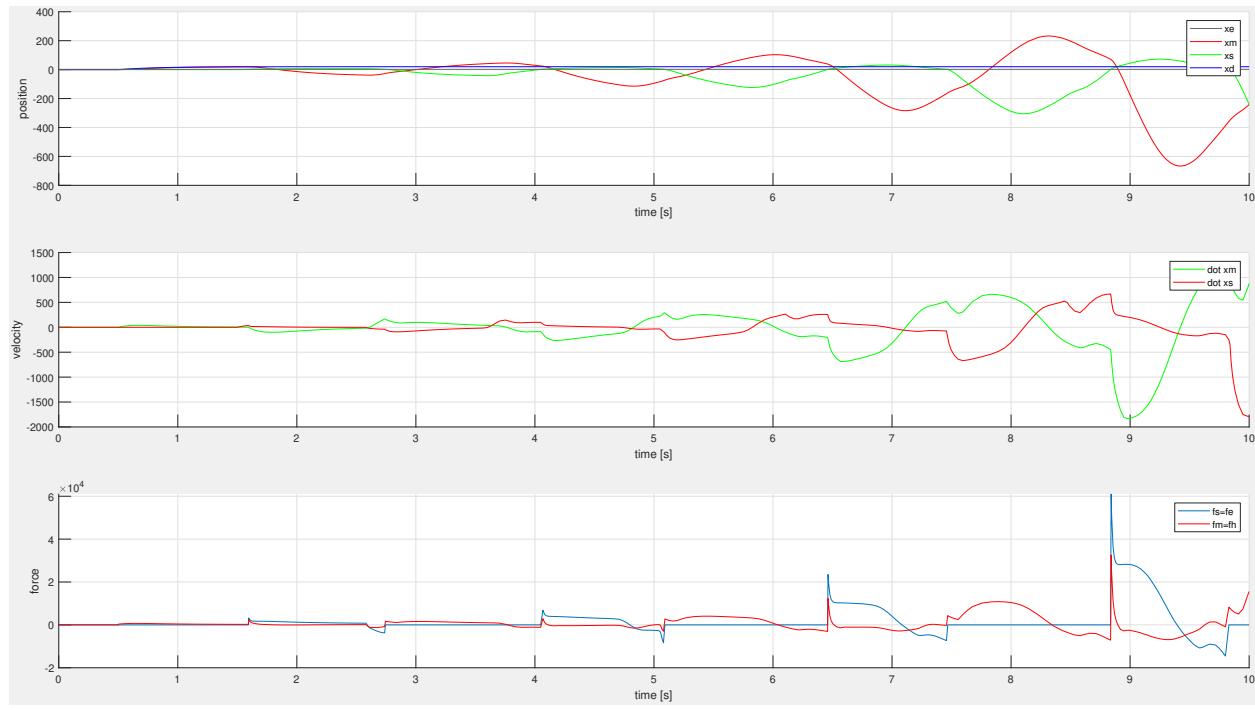


Figure 15: Two-Channel force-position bilateral teleoperation architecture - contact with step reference and 0.1s delay

## 2.6 Two-Channel force-force bilateral teleoperation architecture

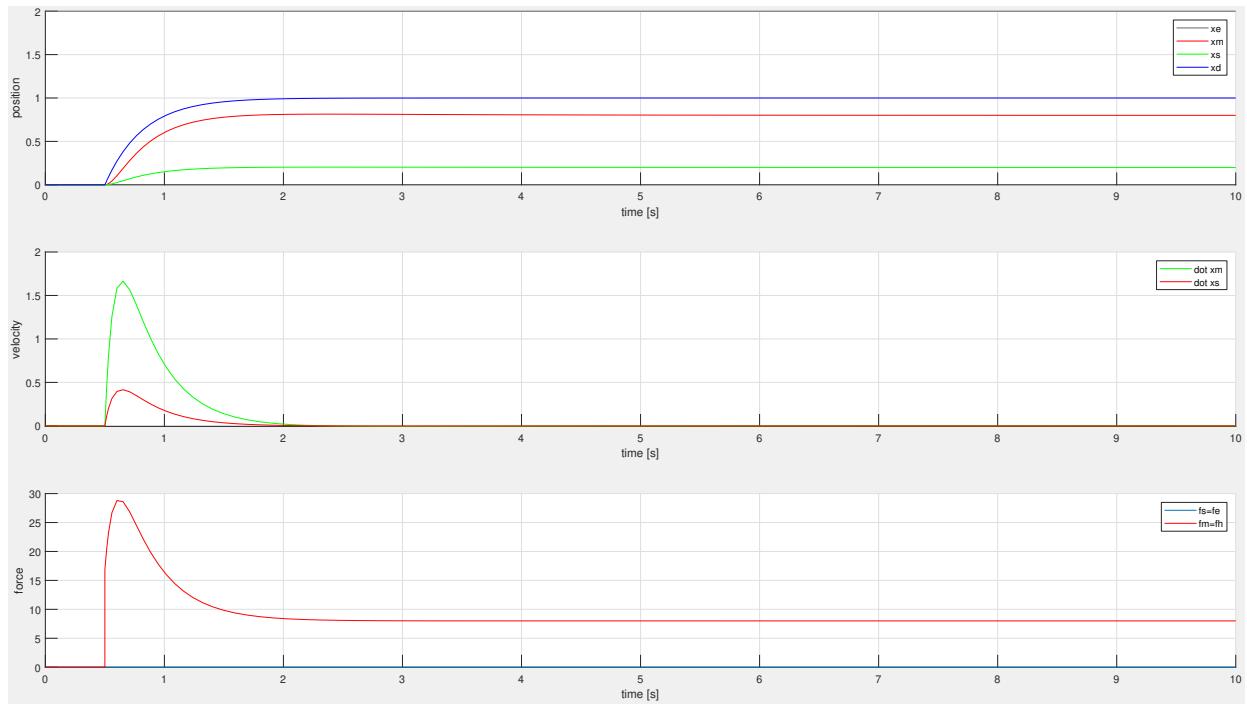


Figure 16: Two-Channel force-force bilateral teleoperation architecture - free motion with step reference

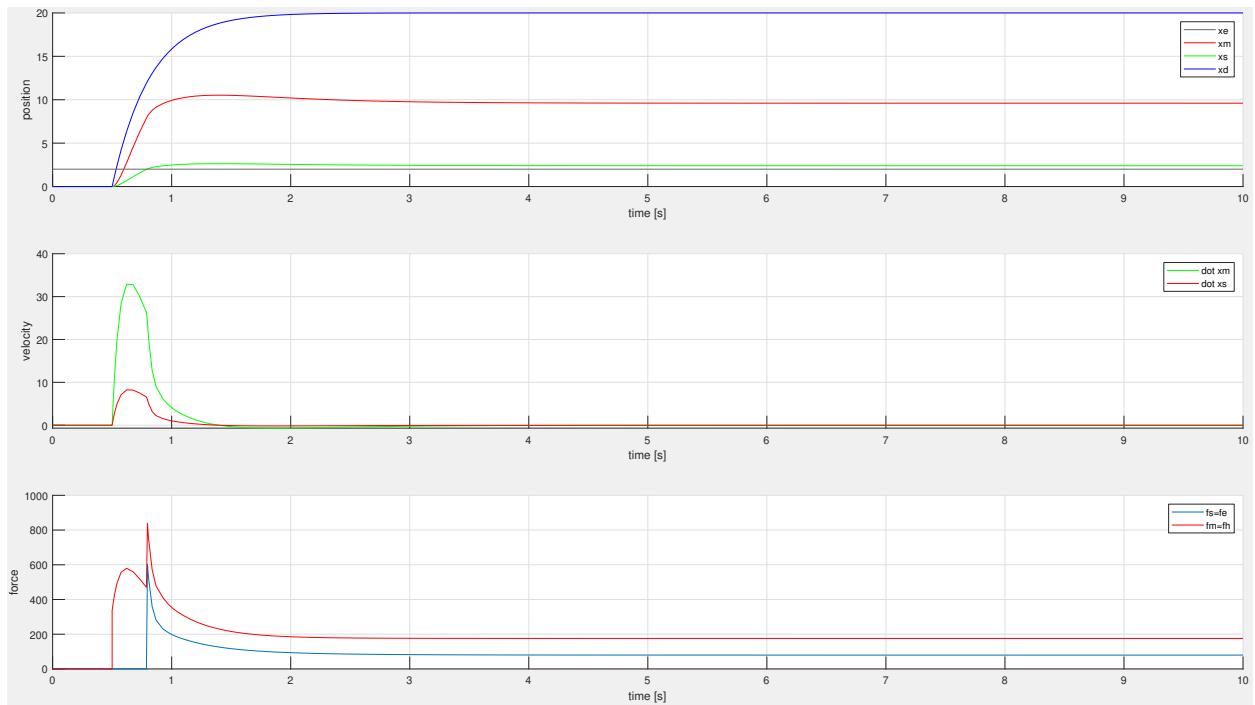


Figure 17: Two-Channel force-force bilateral teleoperation architecture - contact with step reference

### 3 Homework 3-4

#### 3.1 Assignment description

- Implement the Kalman filter/predictor and estimate the velocity and acceleration from noisy position measurements (see .mat file)
- Implement the steady-state Kalman filter/predictor and estimate the velocity and acceleration from noisy position measurements (see .mat file)
- Implement the Kalman smoother and estimate the velocity and acceleration from noisy position measurements (see .mat file)

#### 3.2 Considerations

##### 3.2.1 Continuous time system

$$x = \begin{bmatrix} \theta \\ \omega \\ \dot{\omega} \end{bmatrix}$$

$$\dot{x}(t) = \begin{bmatrix} 0 & 1 & 0 \\ 0 & 0 & 1 \\ 0 & 0 & 0 \end{bmatrix} x(t) + \begin{bmatrix} 0 \\ 0 \\ 1 \end{bmatrix} w(t) \quad y(t) = [1 \ 0 \ 0] x(t) + v(t)$$

The derivative of the angular acceleration  $\ddot{\omega}$ , i.e. the third element of  $\dot{x}(t)$ , is described by white noise  $w(t)$  defined as a gaussian random variable  $\mathcal{N}(\mu = 0, \sigma^2 = Q)$ .

The measurement equation  $y(t)$  is the 'real' angular displacement  $\theta$  + white noise  $v(t)$ , defined as  $\mathcal{N}(\mu = 0, \sigma^2 = R)$

##### 3.2.2 Discrete time system

The discrete version of the continuous time model must be computed, since we introduce  $t = KT_s$

$$A_d = e^{AT_s} = e^{\begin{bmatrix} 0 & 1 & 0 \\ 0 & 0 & 1 \\ 0 & 0 & 0 \end{bmatrix} T_s} = \begin{bmatrix} 1 & T_s & \frac{T_s^2}{2} \\ 0 & 1 & \frac{T_s^2}{2} \\ 0 & 0 & 1 \end{bmatrix}$$

$$B_d = \int_0^{T_s} e^{\begin{bmatrix} 1 & \tau & \tau^2/2 \\ 0 & 1 & \tau \\ 0 & 0 & 1 \end{bmatrix} \tau} d\tau = \begin{bmatrix} T_s^3/6 \\ T_s^2/2 \\ T_s \end{bmatrix}$$

$$C_d = C = [1 \ 0 \ 0]$$

### 3.3 Kalman filter and predictor

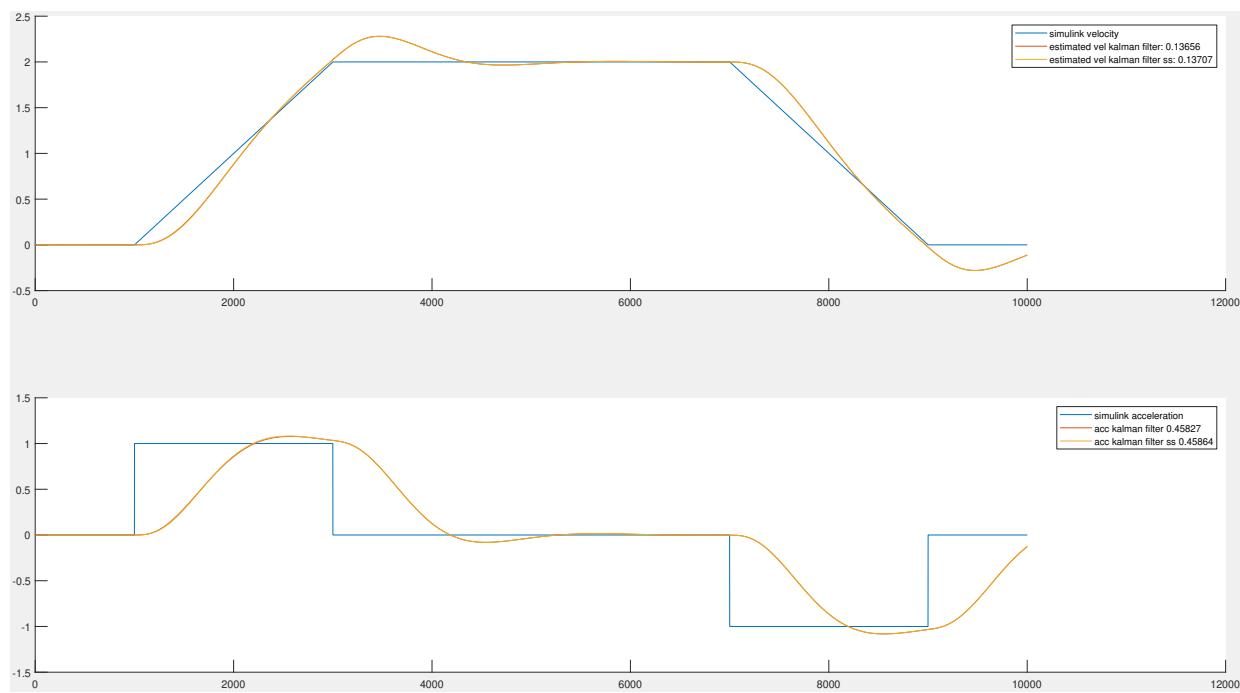


Figure 18: Velocity and acceleration estimation from noisy position data - filter, filter ss

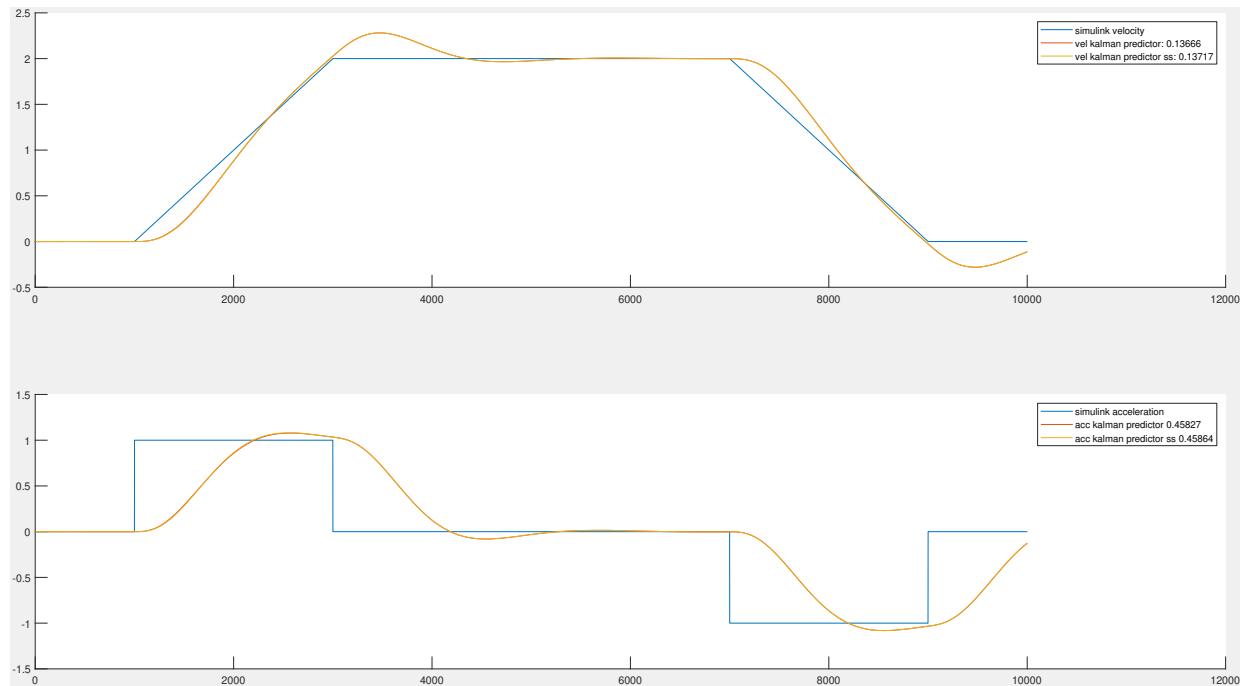


Figure 19: Velocity and acceleration estimation from noisy position data - predictor, predictor ss

### 3.4 Kalman filter and smoother

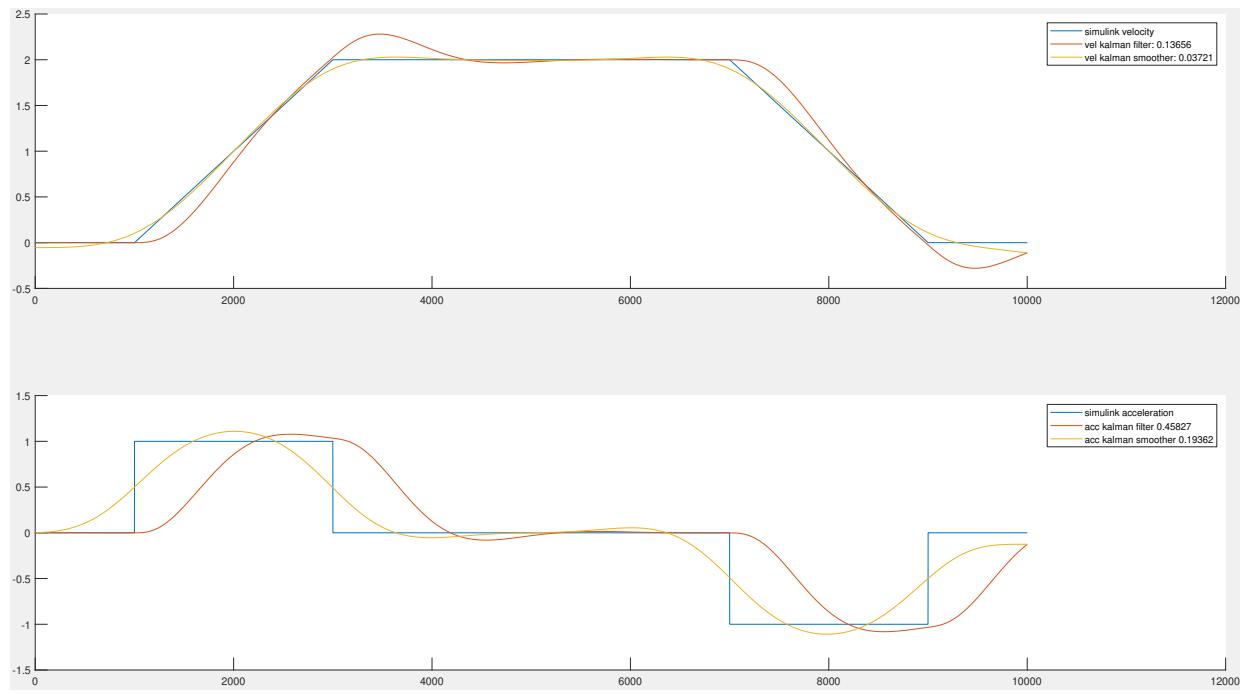


Figure 20: Velocity and acceleration estimation from noisy position data - filter, smoother

### 3.5 Euler derivatives, Kalman filter, predictor, smoother

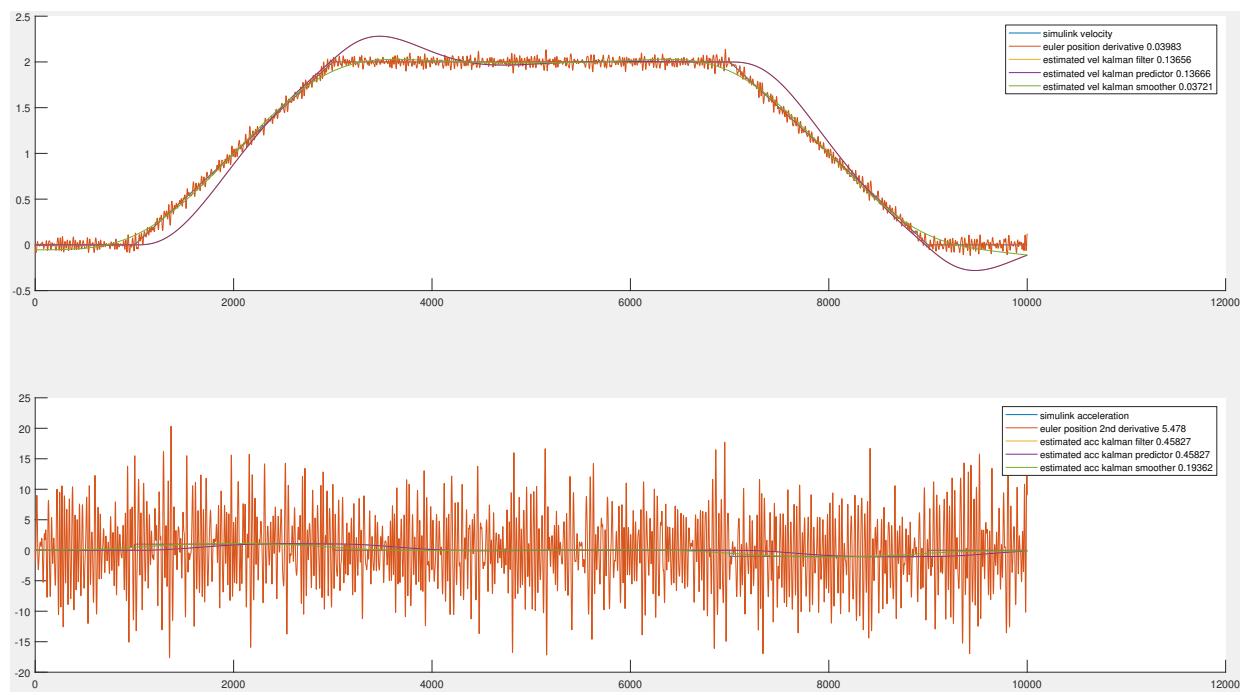


Figure 21: Velocity and acceleration estimation from noisy position data - euler derivative, filter, predictor, smoother

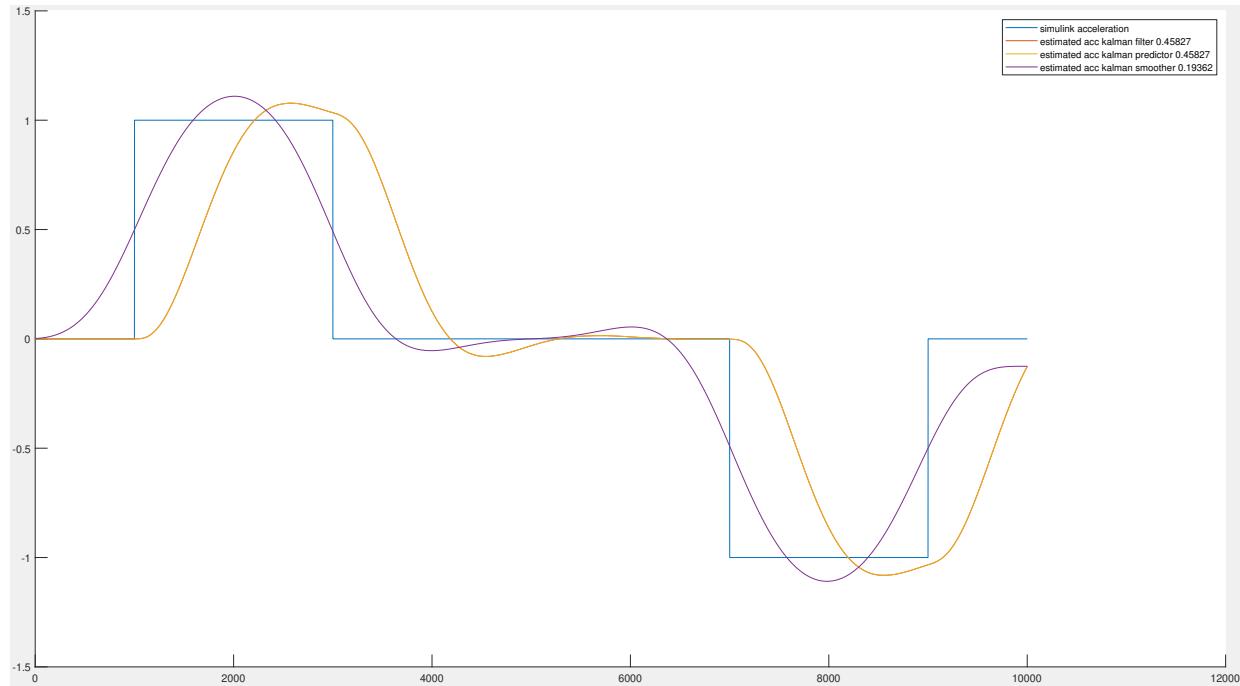


Figure 22: Acceleration estimation from noisy position data - filter, predictor, smoother

## 4 Homework 5

### 4.1 Assignment description

- Identify the parameters  $k$  and  $\tau$  (i.e.  $J$  and  $D$ ) using the LS and the RLS on the DC motors data.

### 4.2 Considerations

#### 4.3 Model

Starting from the differential equation of a DC motor, we get the following relationship:

$$x = \begin{bmatrix} \dot{\omega} \\ \omega \end{bmatrix} \quad y = V \quad \theta = \begin{bmatrix} \tau/k \\ 1/k \end{bmatrix}$$
$$y = x\theta$$

and given N samples of  $x$  and  $y$ :

$$Y = X\theta$$

The prediction of  $y$  given a new value of  $x$  is:

$$\hat{y} = x\hat{\theta}$$

where  $\hat{\theta} = (X^T X)^{-1} X^T Y$ .

**NB:**  $\theta$  is the vector of unknowns we want to estimate

### 4.4 Goal

Starting from noisy position measurements (exported from Simulink) velocity  $\omega$  and acceleration  $\dot{\omega}$  are computed using the Kalman Filter. Voltage measurements are also exported from Simulink. Both LS and RLS are used to compute  $\tau$  and  $k$ .

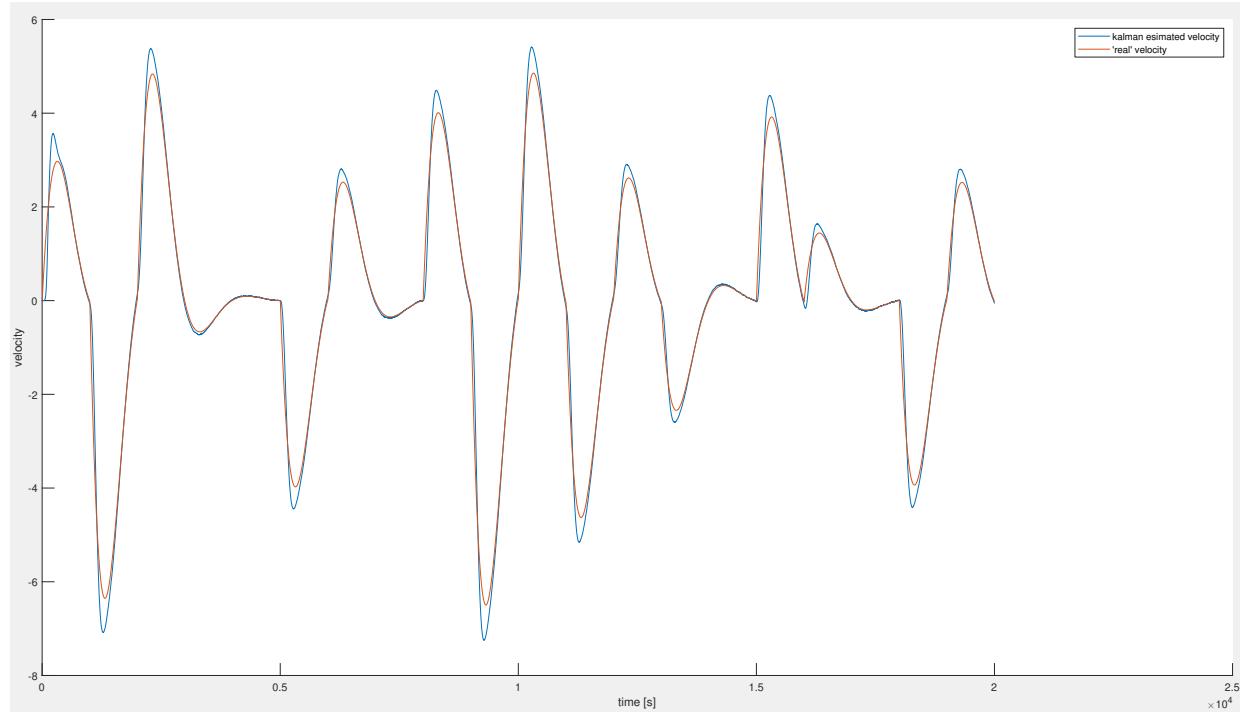


Figure 23: Velocity estimation from noisy position data - kalman filter vs real velocity

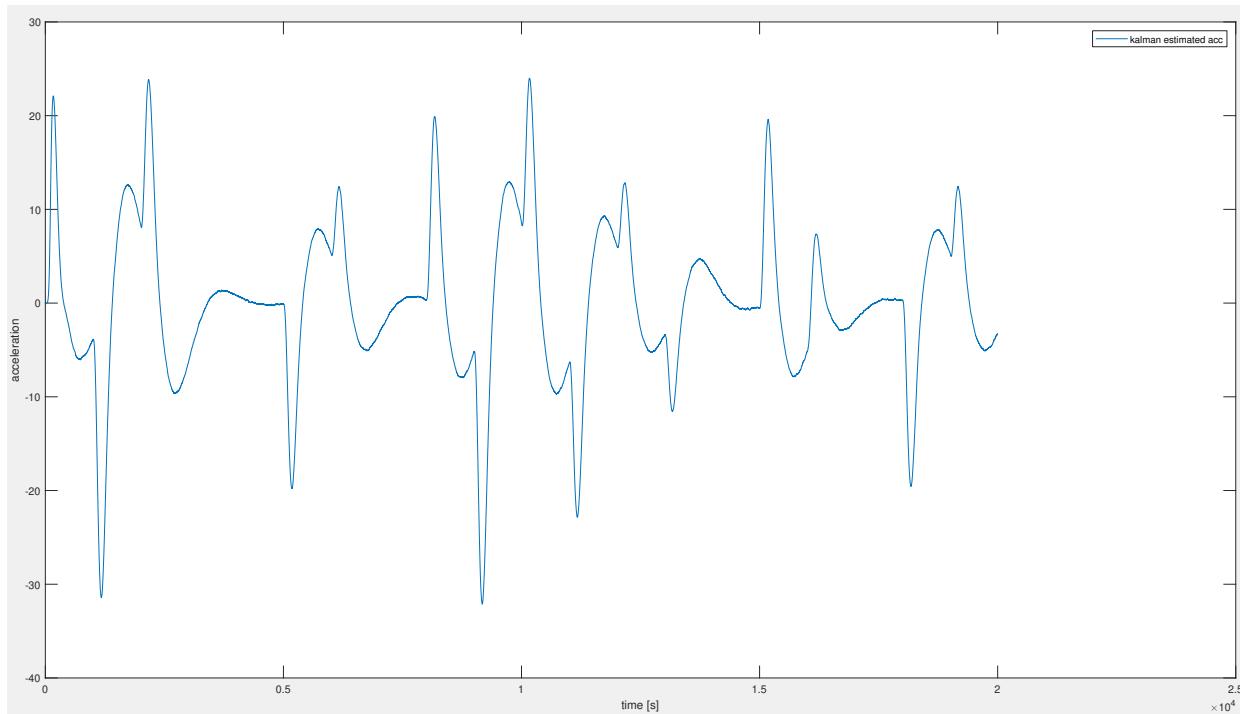


Figure 24: Acceleration estimation from noisy position data - kalman filter

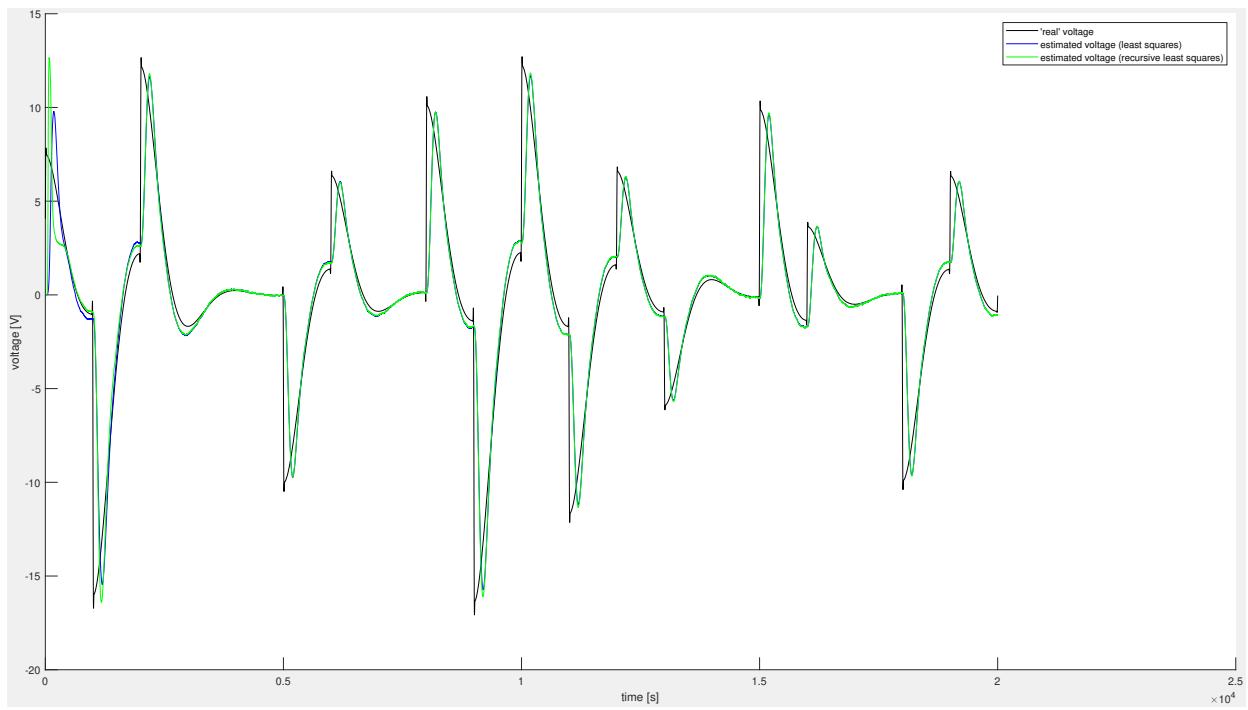


Figure 25: Voltage estimation using estimated parameters - Least Squares estimated voltage vs Recursive LS estimated voltage vs real voltage

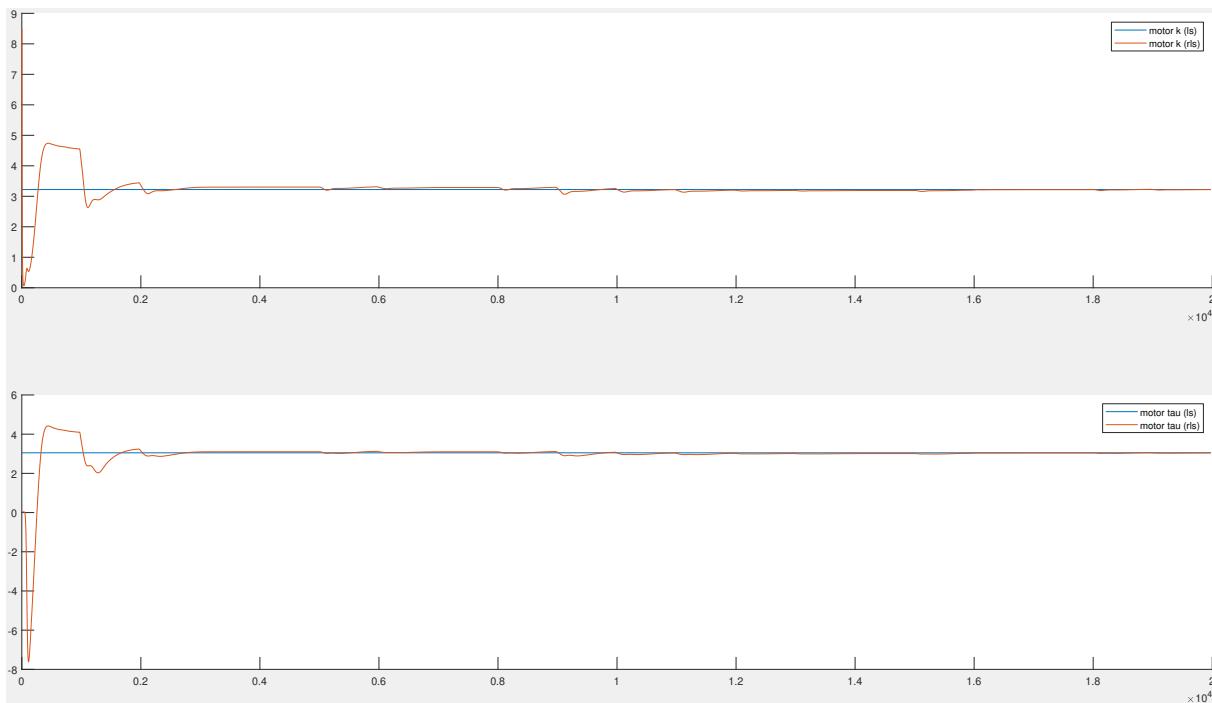


Figure 26: Motor parameter estimation - LS vs RLS

## 5 Homework 6

### 5.1 Assignment description

- Implement the Scattering-based bilateral teleoperation architecture for the
  - Force-Position case
  - Position-Position case
- Compare positions, velocities, forces, commands in free motion and in contact
- Create another simulink model and (a) add the measurement noise to the position/force signals, and (b) estimate velocities from positions

### 5.2 Considerations

- The scattering-based bilateral teleoperation architecture was evaluated with a delay of 100 time steps in the communication channel. Since the sampling time  $T_s = 0.001s$ , the total delay is about  $0.1s$ .
- A low pass filter with cutoff frequency of  $100Hz$  was introduced in the communication channel to correct numerical errors.
- The environment is modeled as a spring-damper system with  $K_e = 200$  and  $B_e = 100$ .
- In the following images, a 'ripple' appears in the velocity plots. This is due to the delay, if the architecture is evaluated with a shorter delay, e.g. 10 time steps, then the ripple disappears.

### 5.3 Scattering-based Position-Position

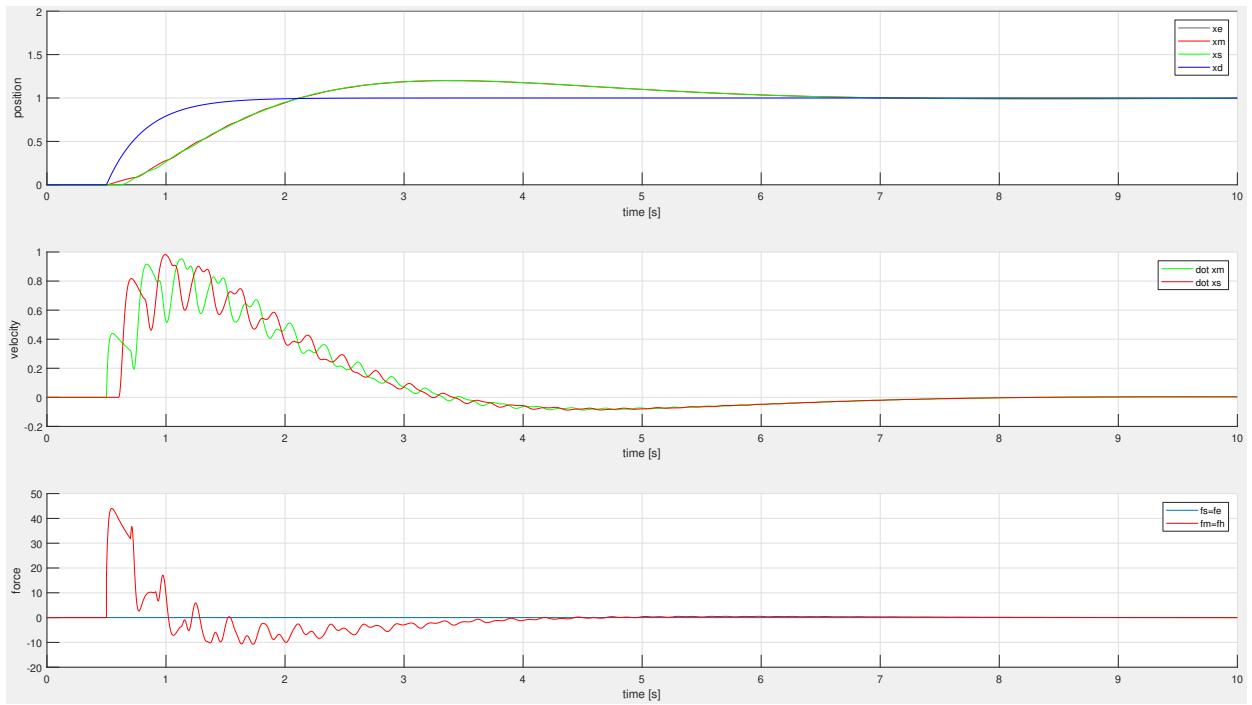


Figure 27: Scattering-based Position-Position: free motion

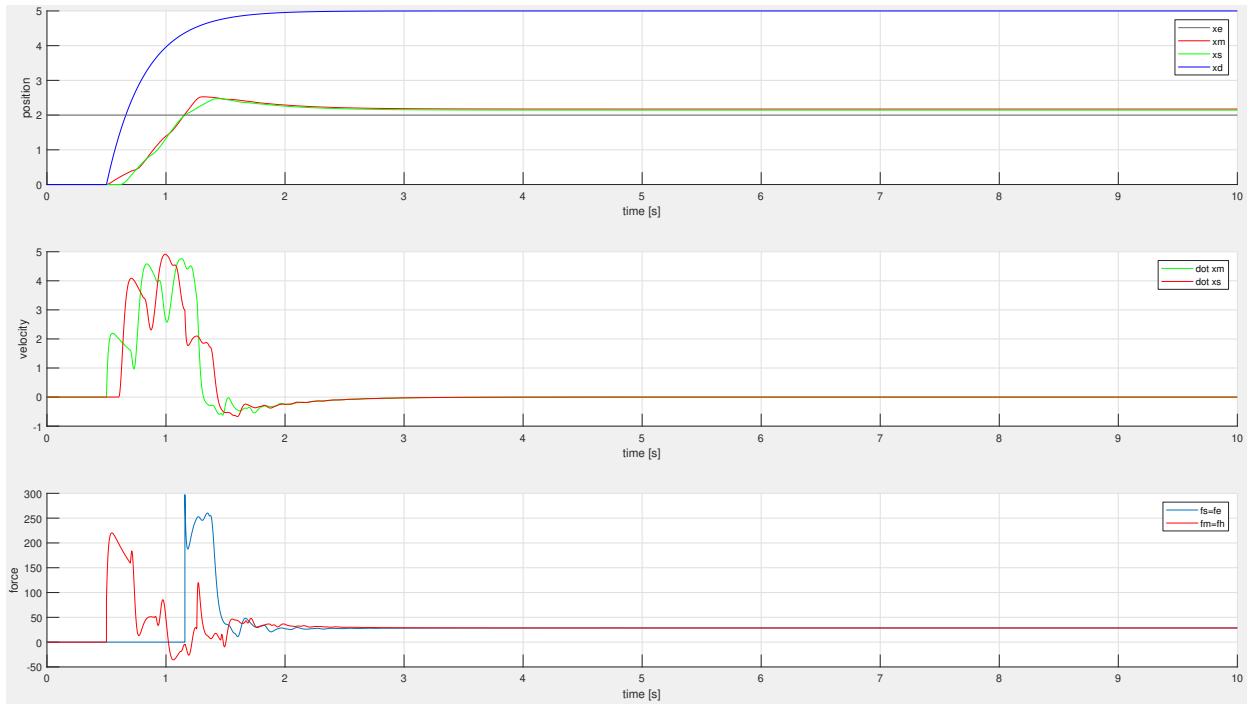


Figure 28: Scattering-based Position-Position: contact with environment

## 5.4 Scattering-based Force-Position

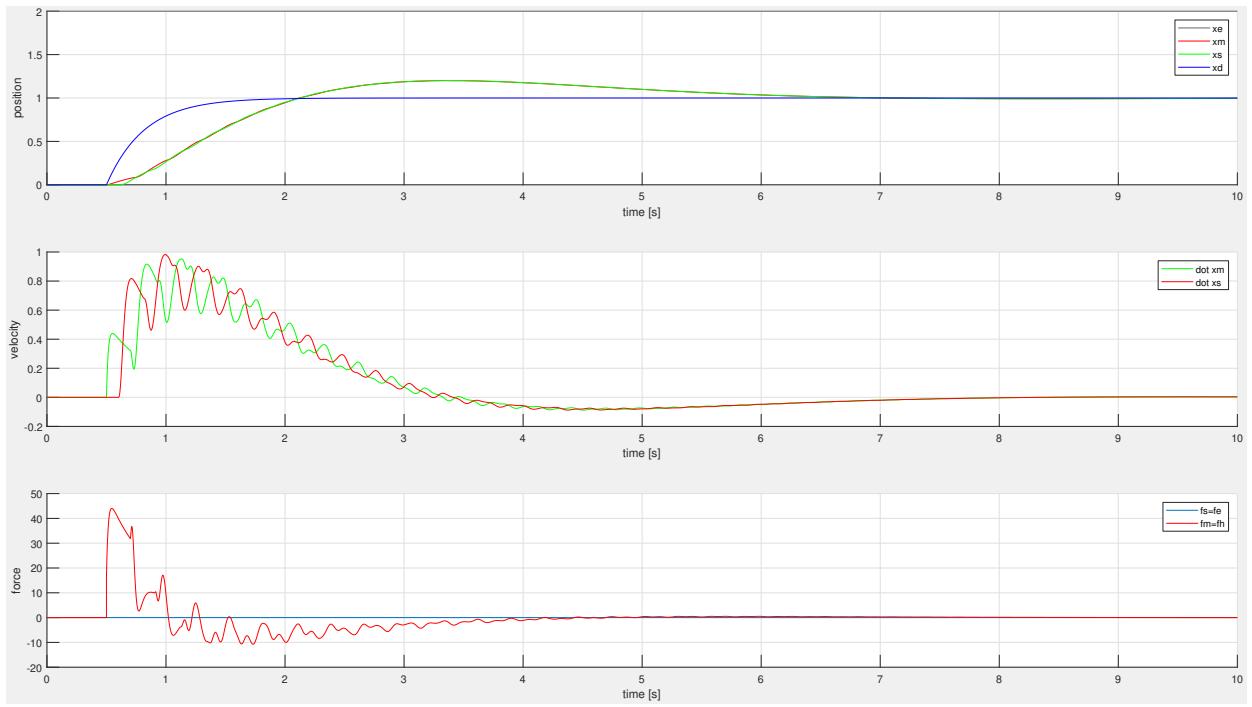


Figure 29: Scattering-based Force-Position: free motion

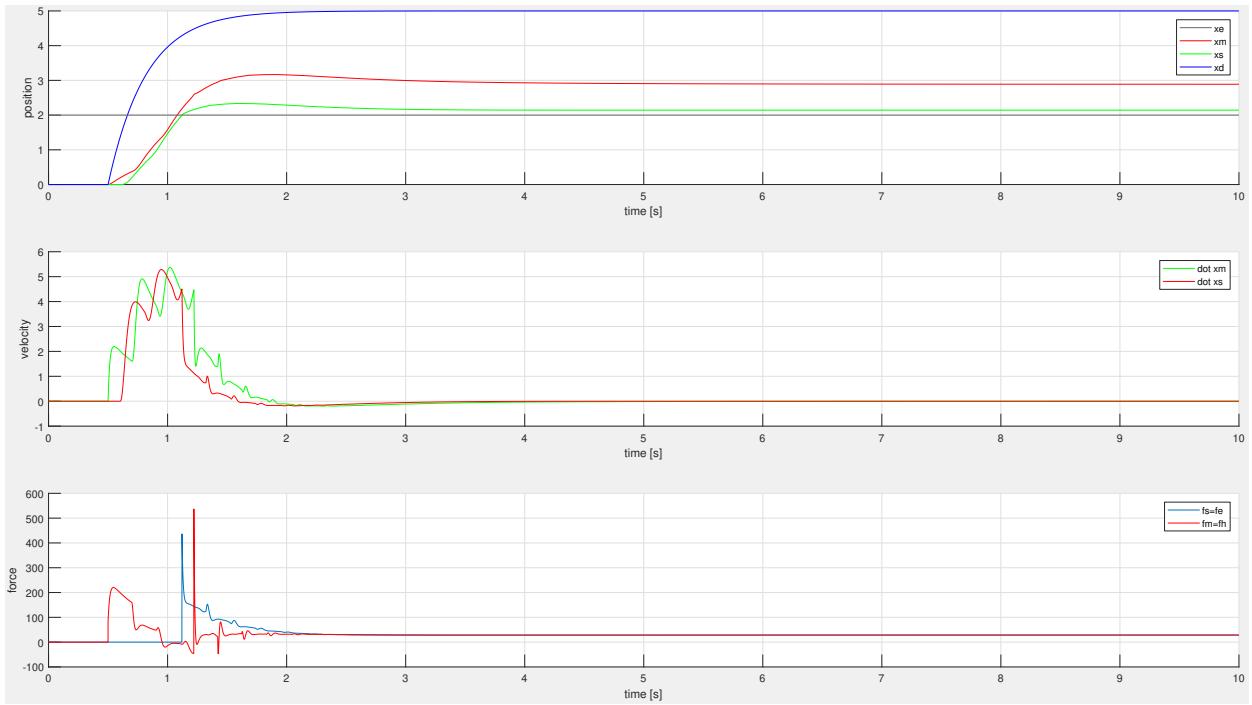


Figure 30: Scattering-based Force-Position: contact with environment

## 6 Homework 7

### 6.1 Assignment description

- Implement the Tank-based bilateral teleoperation architecture for the
  - Force-Position case
  - Position-Position case
- Compare positions, velocities, forces, commands in free motion and in contact
- Create another simulink model and (a) add the measurement noise to the position/force signals, and (b) estimate velocities from positions (if needed)

### 6.2 Considerations

- The tank-based bilateral teleoperation architecture was evaluated with a delay of 100 time steps in the communication channel. Since the sampling time  $T_s = 0.001s$ , the total delay is about  $0.1s$ .
- The environment is modeled as a spring-damper system with  $K_e = 200$  and  $Be = 100$ .

### 6.3 Tank-based Position-Position

$\beta = 0.01$ ,  $\alpha = 0.2$ , the initial tank energy is enough to perform the desired trajectory.

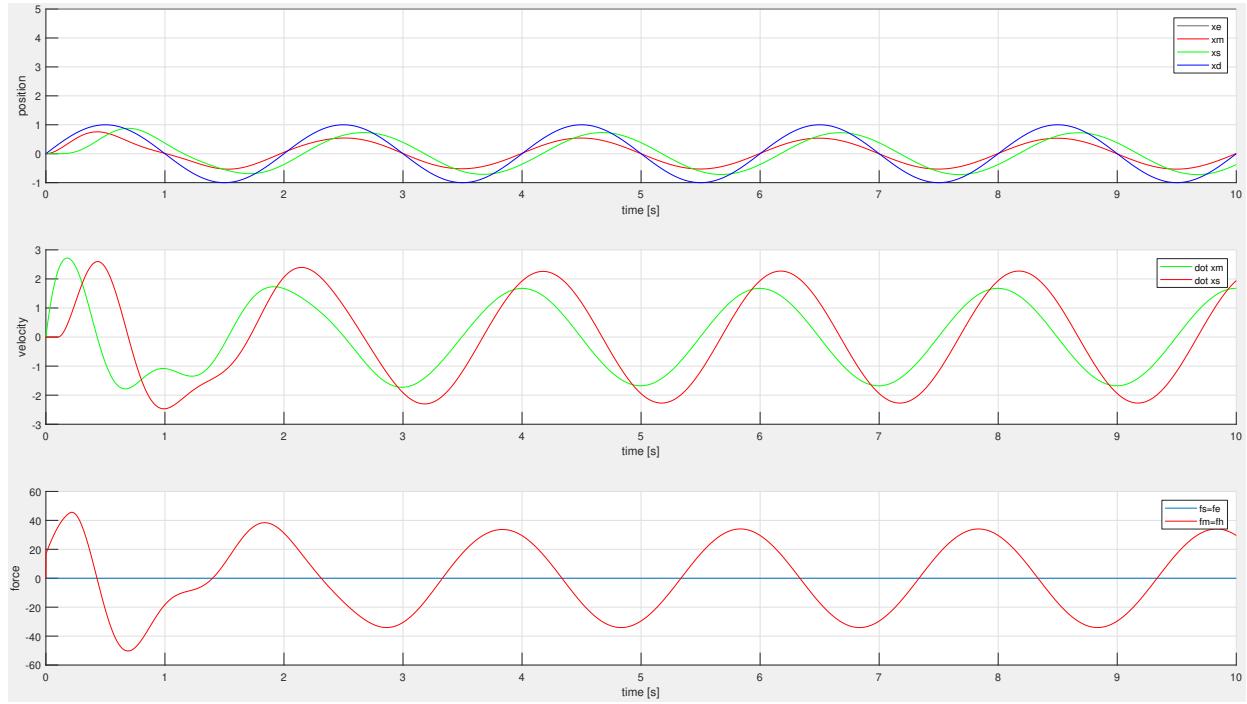


Figure 31: Tank-based Position-Position: free motion,  $\beta = 0.01$ ,  $\alpha = 0.2$

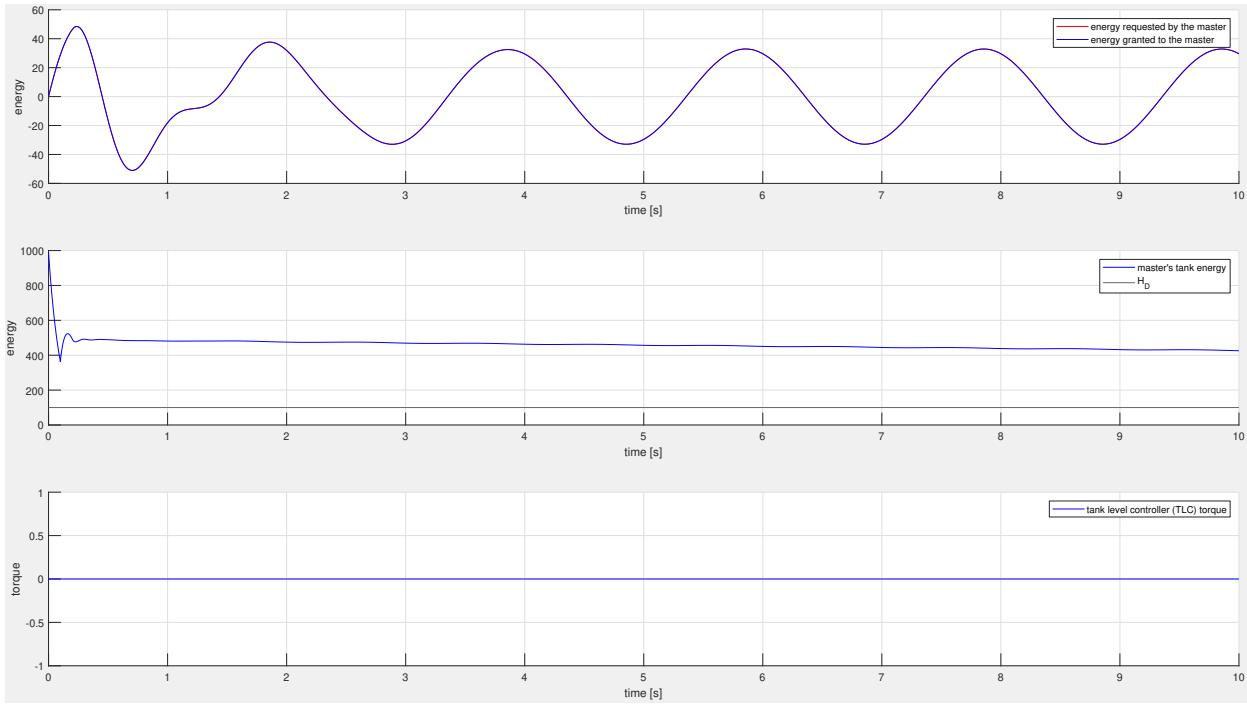


Figure 32: Tank-based Position-Position: free motion,  $\beta = 0.01$ ,  $\alpha = 0.2$

$\beta = 0.1$ ,  $\alpha = 0.2$ . Going from  $\beta = 0.01$  to  $\beta = 0.1$ , the initial energy is not enough. By increasing  $\beta$  the trajectory is more energy-intensive.

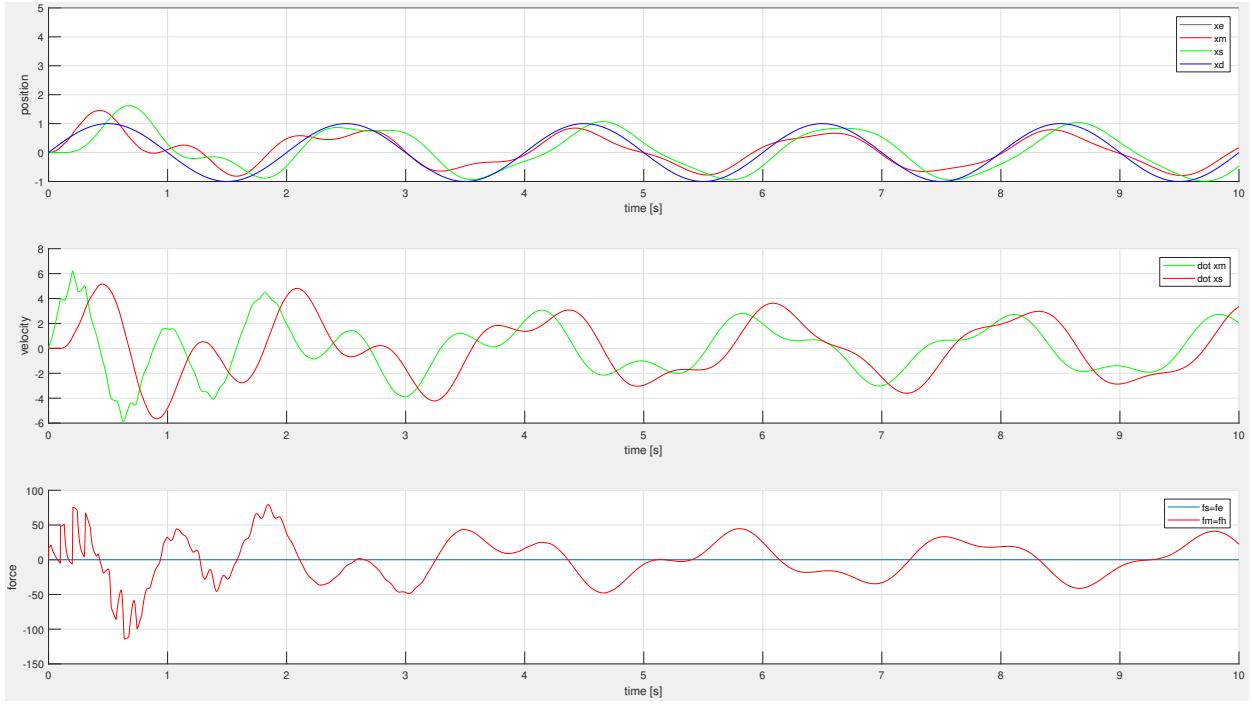


Figure 33: Tank-based Position-Position: free motion,  $\beta = 0.1$ ,  $\alpha = 0.2$

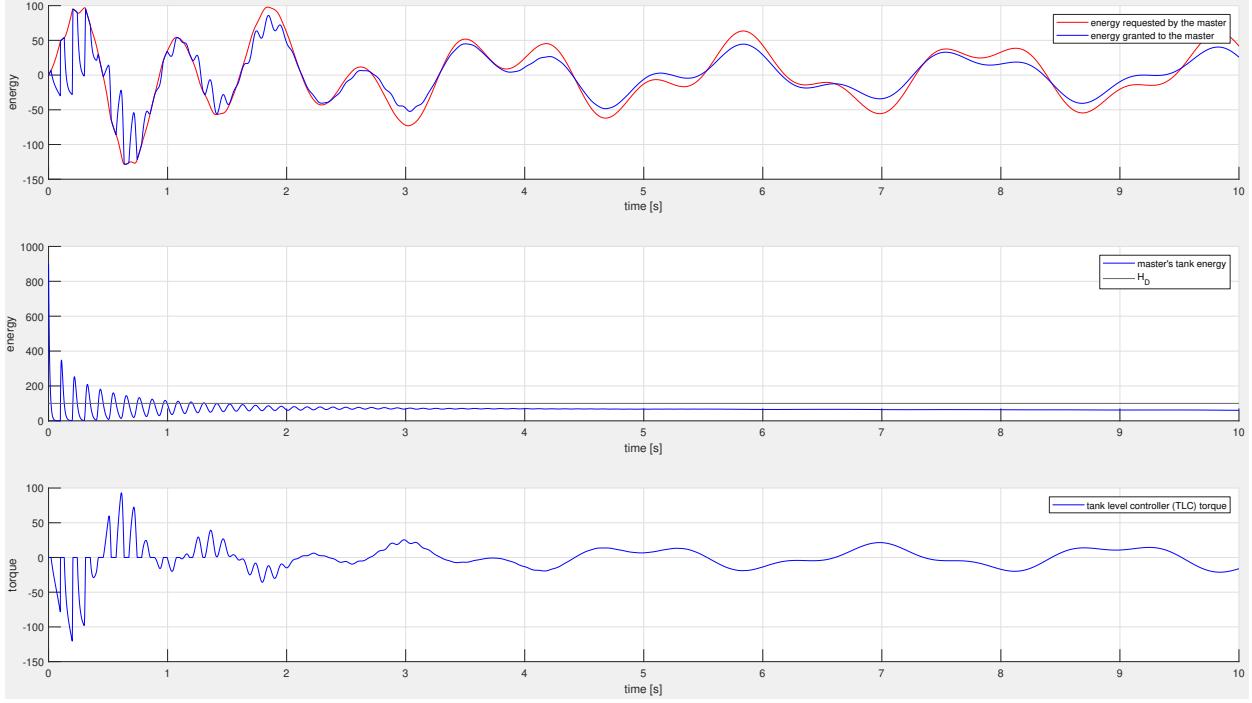


Figure 34: Tank-based Position-Position: free motion,  $\beta = 0.1$ ,  $\alpha = 0.2$

$\beta = 0.1$ ,  $\alpha = 0.02$ . Going from  $\alpha = 0.2$  to  $\alpha = 0.02$  we are harvesting less energy from the operator.

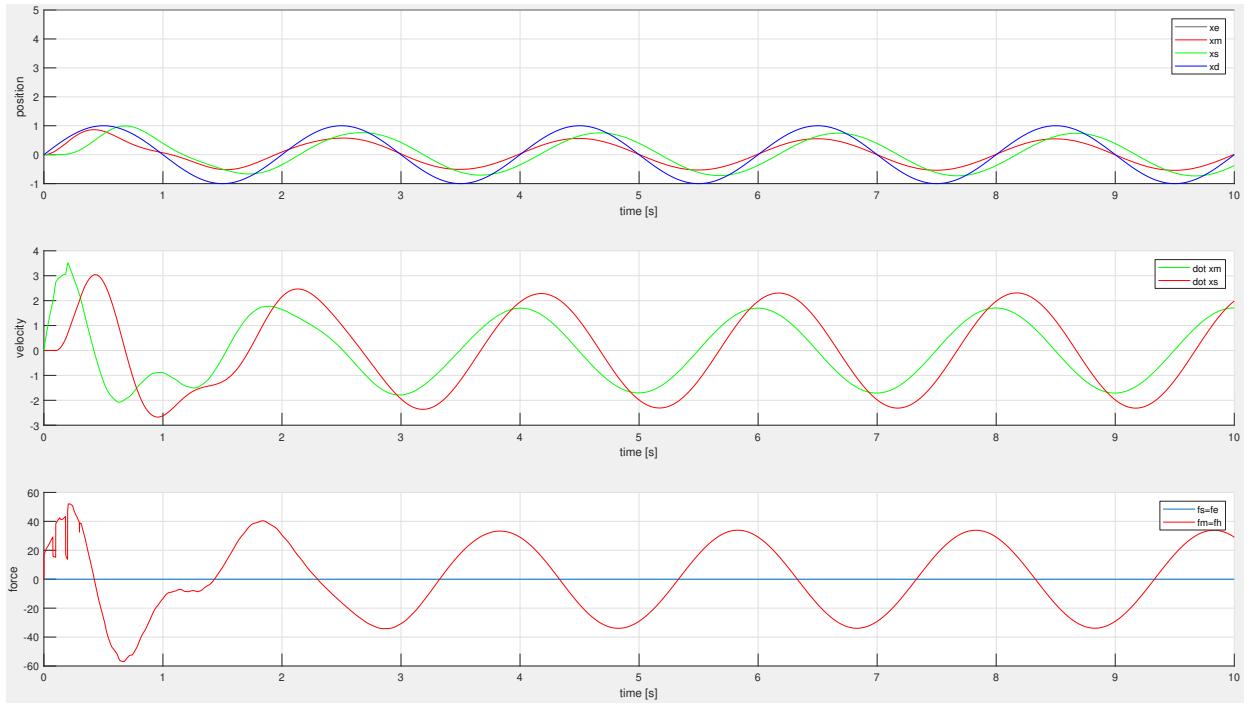


Figure 35: Tank-based Position-Position: free motion,  $\beta = 0.1$ ,  $\alpha = 0.02$

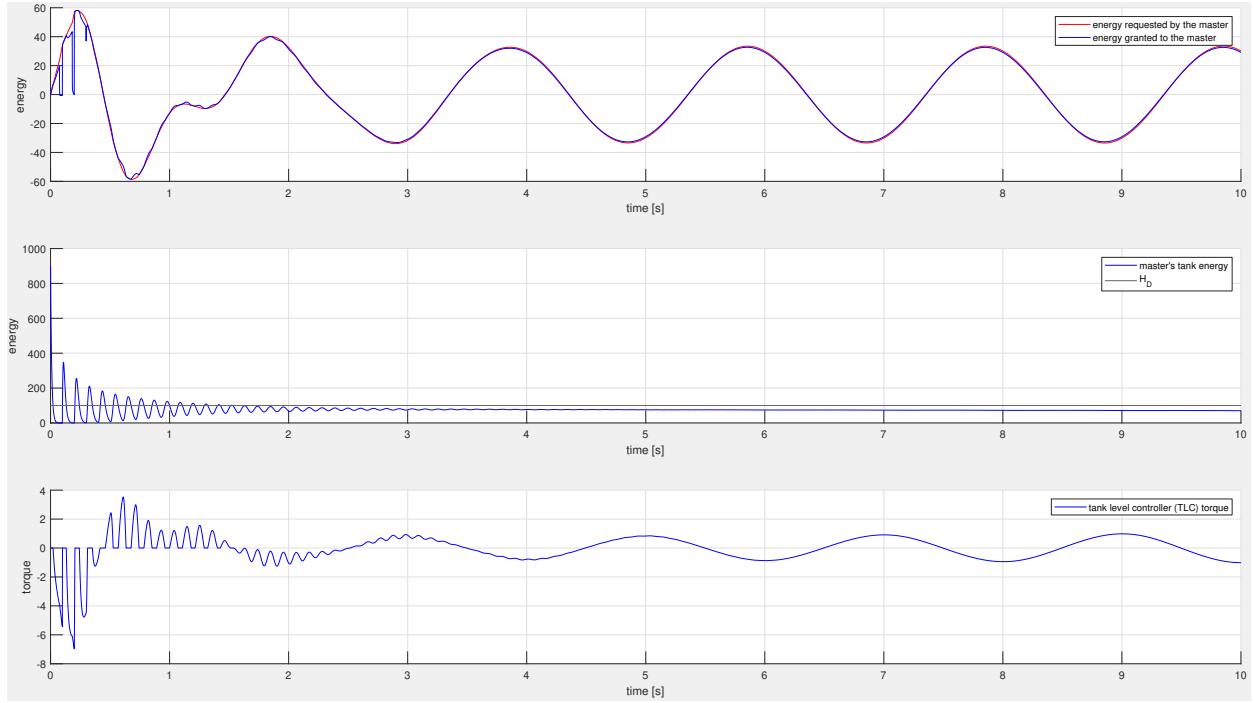


Figure 36: Tank-based Position-Position: free motion,  $\beta = 0.1$ ,  $\alpha = 0.02$

$\beta = 0.1$ ,  $\alpha = 0.2$  and in contact with the environment.

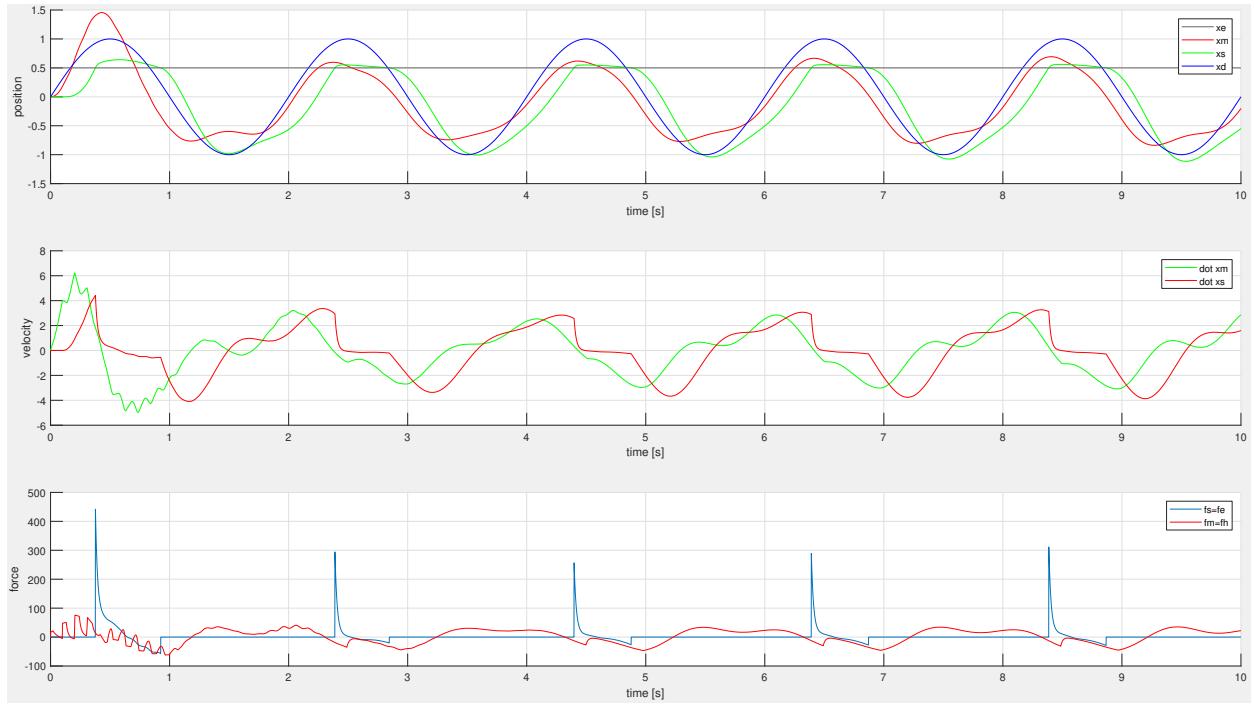


Figure 37: Tank-based Position-Position: contact,  $\beta = 0.1$ ,  $\alpha = 0.2$

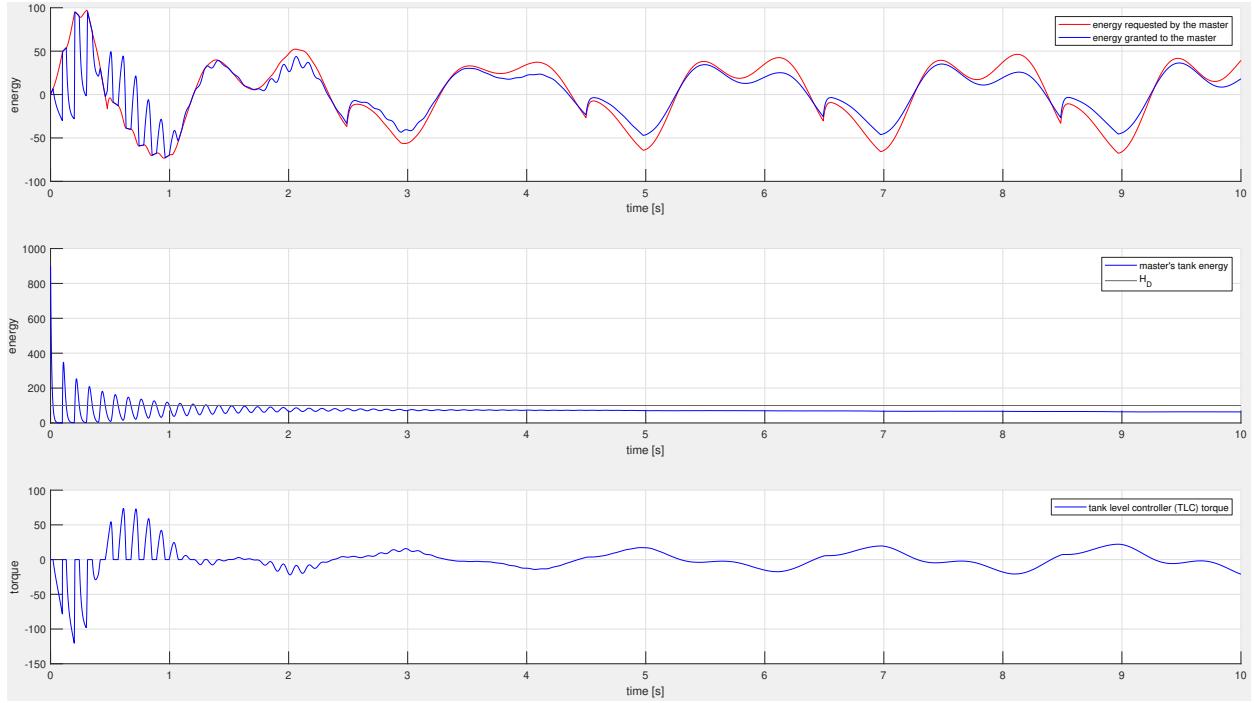


Figure 38: Tank-based Position-Position: contact,  $\beta = 0.1$ ,  $\alpha = 0.2$

## 6.4 Tank-based Force-Position

### 6.4.1 Sufficient initial energy

$\beta = 0.1$ ,  $\alpha = 0.1$  and in contact with the environment. Initial energy is enough.

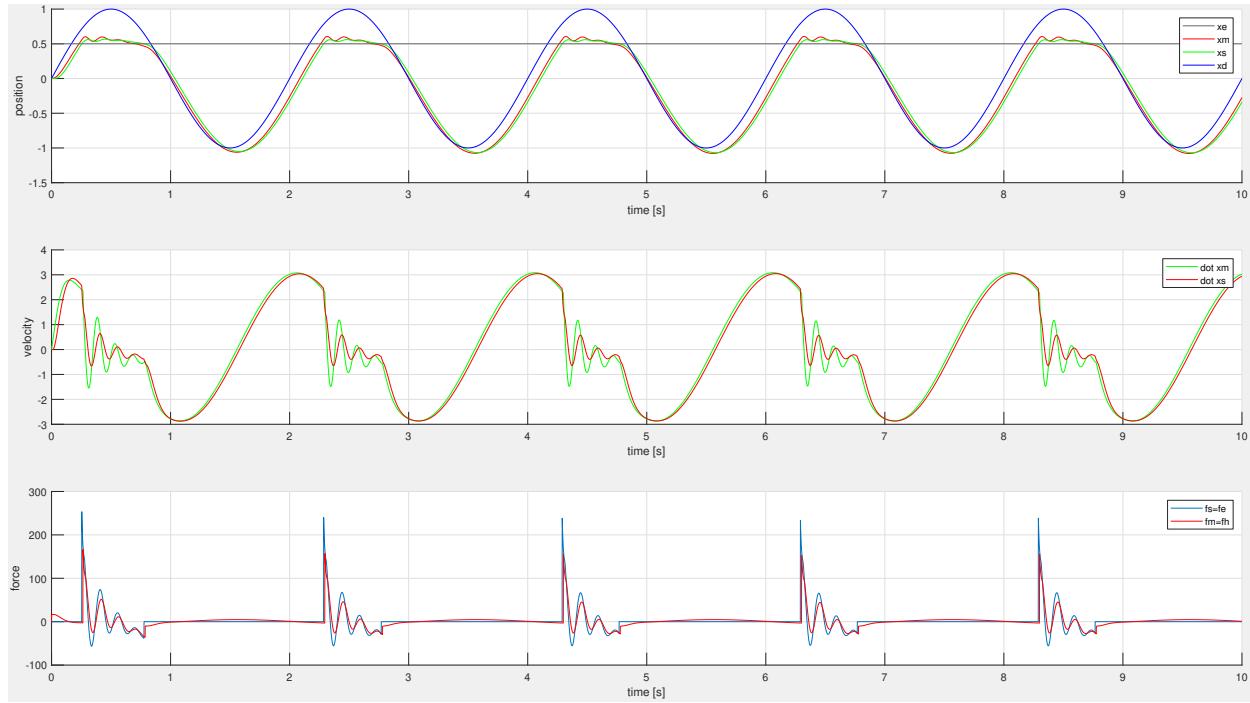


Figure 39: Tank-based Force-Position: contact,  $\beta = 0.1$ ,  $\alpha = 0.1$

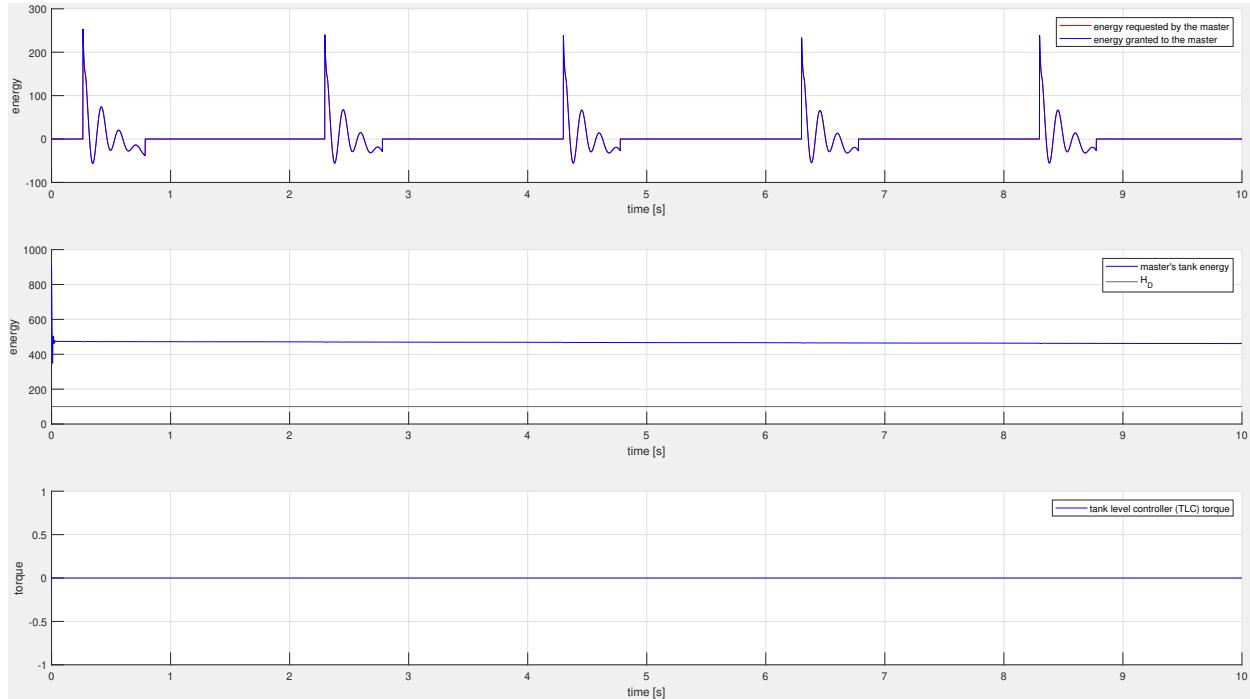


Figure 40: Tank-based Force-Position: contact,  $\beta = 0.1$ ,  $\alpha = 0.1$

#### 6.4.2 Not sufficient initial energy

With  $\beta = 0.1$ ,  $\alpha = 0.1$  and in contact with the environment. Initial energy is not enough.

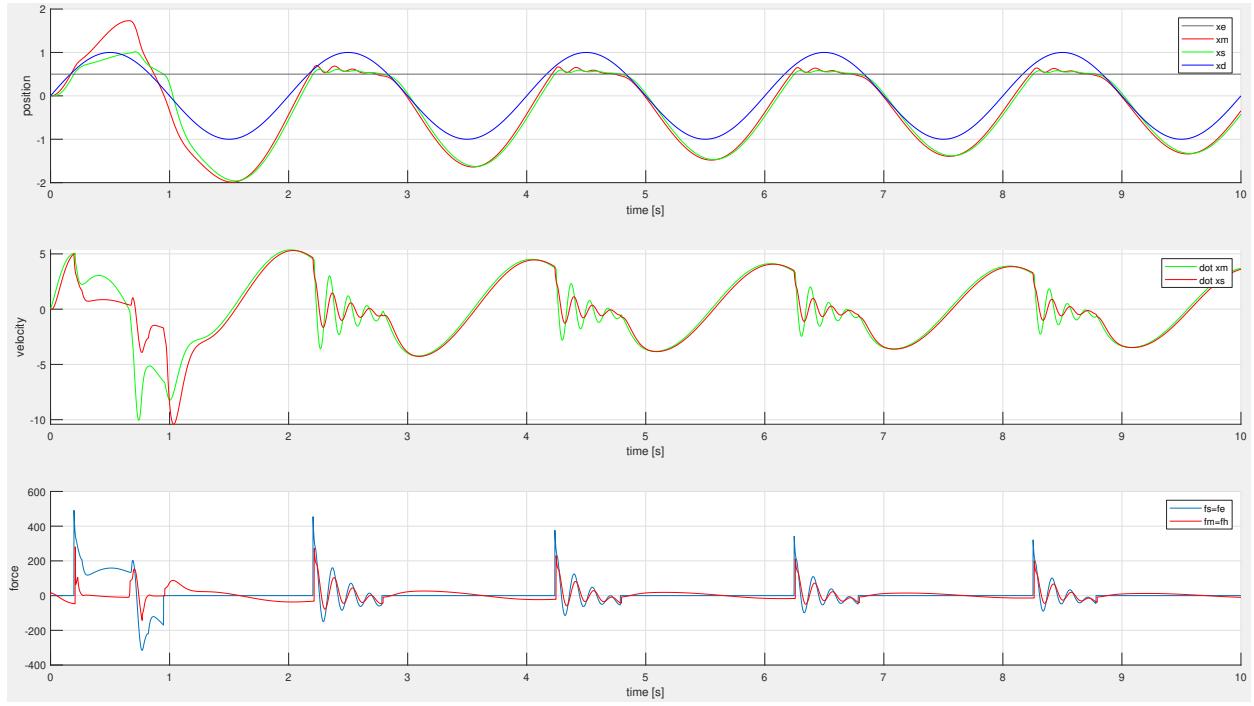


Figure 41: Tank-based Force-Position: contact,  $\beta = 0.1$ ,  $\alpha = 0.1$

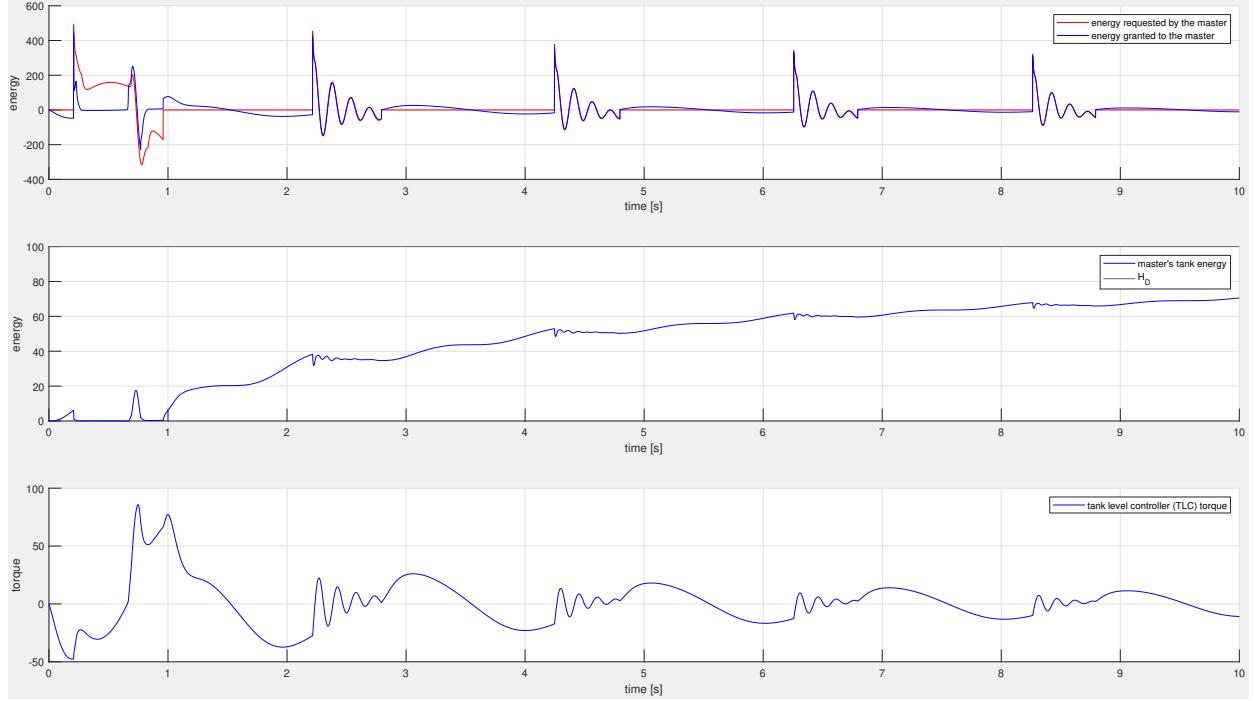


Figure 42: Tank-based Force-Position: contact,  $\beta = 0.1$ ,  $\alpha = 0.1$

#### 6.4.3 Velocity estimation from noisy position measurement

Gaussian noise (mean = 0, variance = 0.00001) is added to the master position  $x_m$ . The master velocity is estimated from the noisy position signal using kalman (filter, predictor, smoother). The *RMSE* is computed with respect to the reference velocity signal exported from simulink and it is reported in the legend.

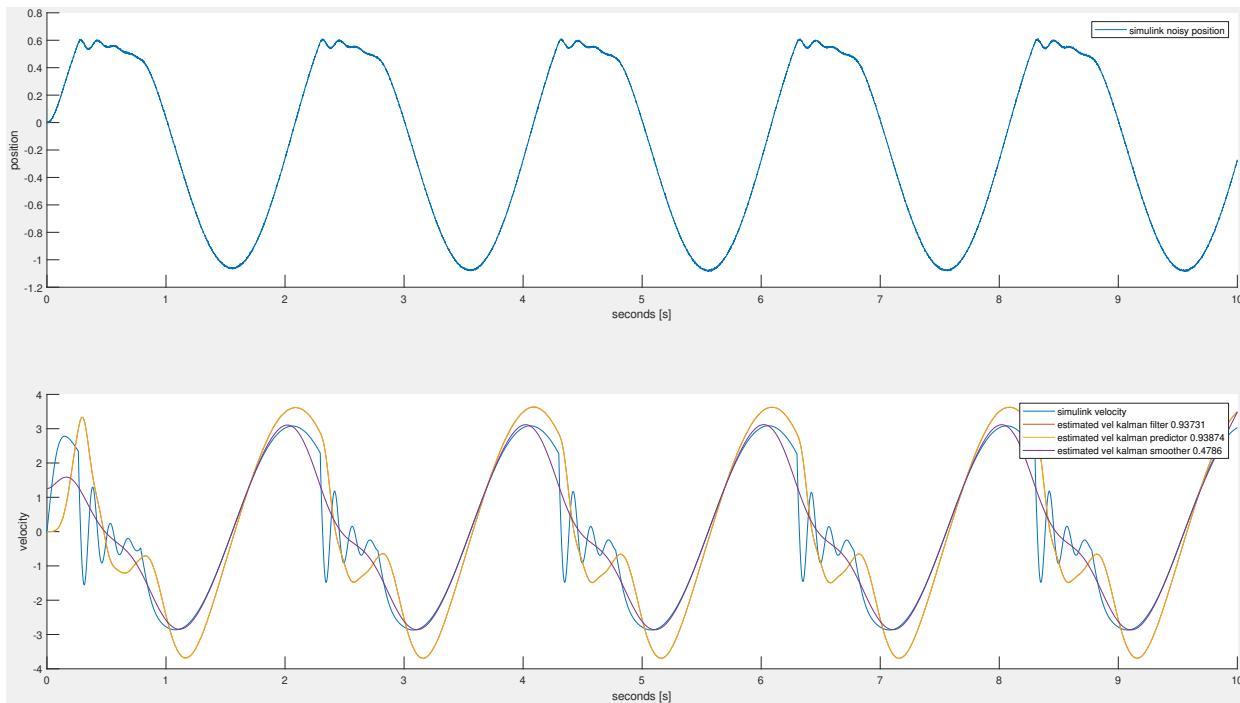


Figure 43: Tank-based Force-Position: master's velocity estimation from noisy position measurement of the master