## **Modeling for Control**

Training Session 4: Feedback & feedforward control

COC January 11th, 2023





























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- Feedback control
- Feedforward control
- Self-study assignment

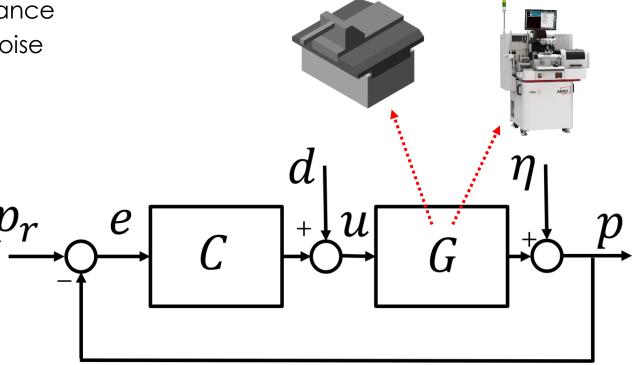
### FEEDBACK CONTROL



### Motion control system (without feedforward control)

- $\ \ \ p_r$ : reference position
- □ p: encoder position
- e: error
- □ d: external disturbance
- $\square$   $\eta$ : measurement noise
- *u*: motor input

- **□** *G*: plant
- □ C: feedback controller





### How to design for closed-loop performance?

Open loop:

$$L = G \cdot C$$

Closed-loop transfer-functions:

1. Sensitivity:

- $S := \frac{e}{p_r} = \frac{u}{d} = \frac{1}{1+L}$
- 2. Complementary sensitivity:

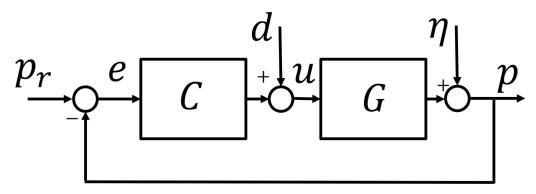
$$T := \frac{p}{p_r} = \frac{p}{\eta} = \frac{L}{1+L}$$

3. Process sensitivity:

$$GS \coloneqq \frac{p}{d} = \frac{G}{1+L}$$

4. Control sensitivity:

$$CS := \frac{u}{p_r} = \frac{C}{1+L}$$



### Feedback controller design: general rules of thumb

- Typical controller structure:  $C = P \cdot \left(1 + \frac{2\pi f_i}{s}\right) \cdot \frac{1 + \frac{1}{2\pi f_{lead}}}{1 + \frac{s}{2\pi f_{lag}}}$
- General tuning procedure:
  - 1. Select desired control bandwidth  $f_{hw}$  (0dB magnitude-point in open-loop),
  - 2. Set proportional gain  $P = \frac{1}{3} \frac{1}{|G|_{(0)} f_{PW}}$ ,
  - 3. The derivative-action should start at frequency  $f_{lead} = \frac{f_{bw}}{3}$  and end at frequency  $f_{lag} = 3f_{bw}$ ,
  - 4. The integrator action should stop before the start of the lead-action, typically at frequency  $f_i = \frac{f_{bw}}{10}$  or  $f_i = \frac{f_{bw}}{5}$ .

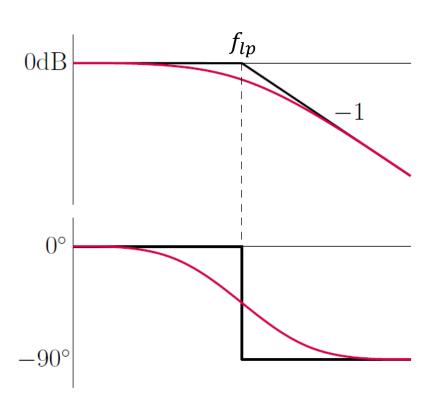


### Feedback controller design: other useful control elements (1/2)

■ If necessary, a first-order low-pass filter can be used to further suppress the high-frequency noise and resonance-modes:

$$C_{lp} = \frac{1}{1 + \frac{s}{2\pi f_{lp}}},$$

■ with, typically,  $f_{lp} = 9f_{bw}$  or  $f_{lp} = 6f_{bw}$ 



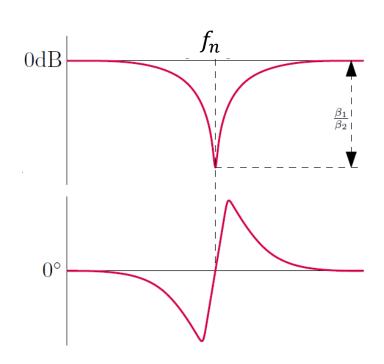


### Feedback controller design: other useful control elements (2/2)

■ If necessary, notch-filters can be used to selectively target specific resonance frequencies:

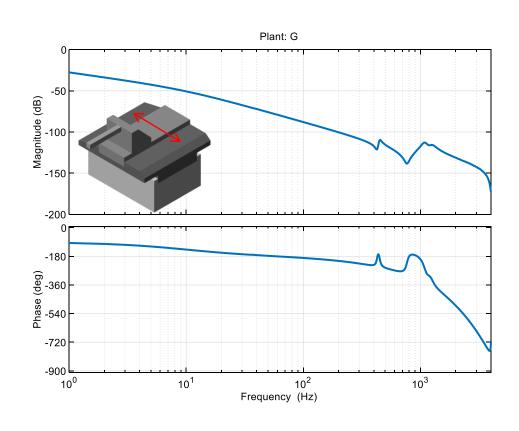
$$C_n = \frac{\left(\frac{1}{(2\pi f_n)^2} s^2 + \frac{2\beta_1}{2\pi f_n} s + 1\right)}{\left(\frac{1}{(2\pi f_n)^2} s^2 + \frac{2\beta_2}{2\pi f_n} s + 1\right)},$$

with  $f_n$  the resonance frequency that we want to suppress.



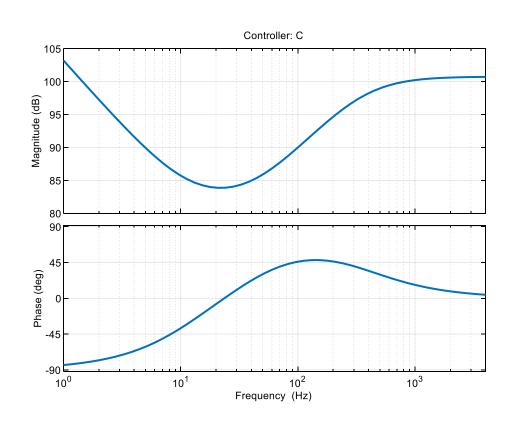


### Case study: X-stage of the AB383 Simscape model



- The first clearly visible resonance frequency lays at 452 Hz.
- The time-delay results in a phase loss linearly related to the frequency.
- The combination of flexible dynamics and phase loss caused by time-delay results in a limited obtainable bandwidth.
- Let us try to tune an open loop bandwidth  $f_{bw} = 120 \text{ Hz}.$

### Case study: feedback controller C



$$\square C = P \cdot \left(1 + \frac{2\pi f_i}{s}\right) \cdot \frac{1 + \frac{s}{2\pi f_{lead}}}{1 + \frac{s}{2\pi f_{lead}}}$$

- □ Gain:
  - $|G|_{@120\,Hz} = db2mag(-91.2)$
  - $P = \frac{1}{3} \frac{1}{|G|_{@f_{hw}}} = 11982$
- Lead/lag:

■ 
$$f_{lead} = \frac{f_{bw}}{3} = 40 \text{ Hz}$$

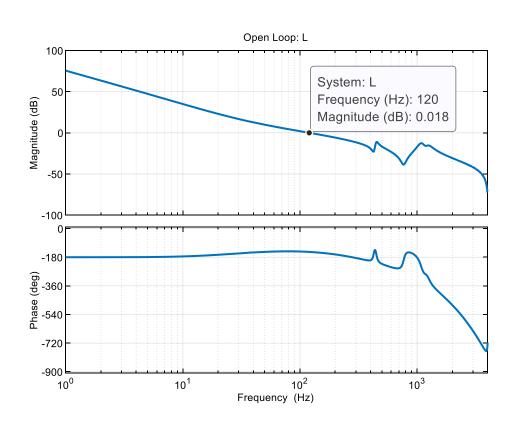
■ Integrator:

■ Total controller:

$$C = 11982 \cdot \left(1 + \frac{75.4}{s}\right) \cdot \frac{1 + 0.004019s}{1 + 0.0004421s}$$



### Case study: open loop L

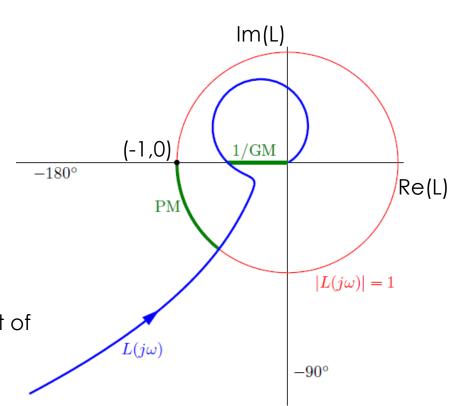


- $\square$  Open loop:  $L = G \cdot C$ .
- Open loop bandwidth is 120
  Hz, as desired.
- □ The next step is to check if the controller is indeed stable.



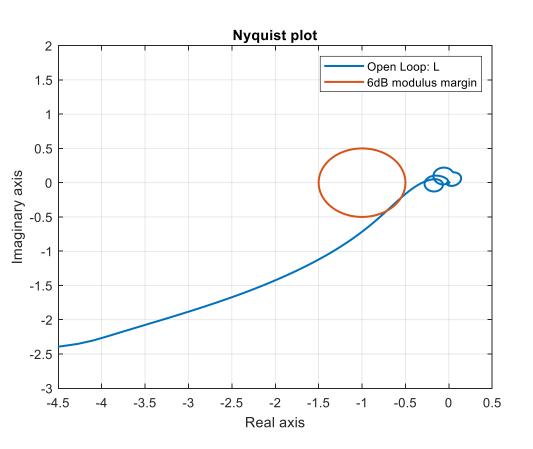
#### Intermezzo: Nyquist Stability Criterion

- The Nyquist Stability Criterion can be used to asses closed-loop stability:
  - graphical check
  - Based on frequency-response function (FRF) of the plant, i.e. mechanical spectrum
- Nyquist plot:
  - Re(L) on horizontal axis
  - Im(L) on vertical axis
- Necessary requirement for stability:
  - (-1,0) is on the left side of the Nyquist plot of the open loop L
- Robustness margins:
  - PM: phase margin
  - GM: gain margin





### Case study: Nyquist Stability Criterion

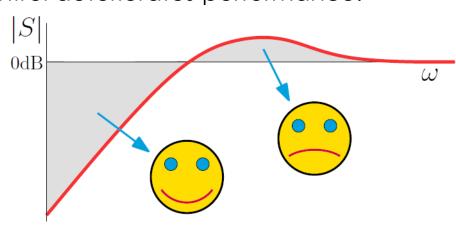


- The Nyquist plot of L:
  - is on the right hand side of the point (-1,0);
  - shows that the closed loop is stable;
  - only slightly enters the 6dB modulus margin region.
- Note:
  - The modulus margin is a measure for robustness
  - The modulus margin corresponds to the peak in the sensitivity
  - Therefore, the sensitivity is expected to have a peak slightly higher than 6dB



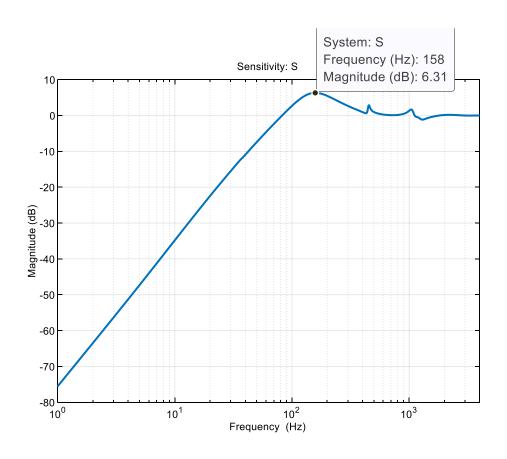
### Performance assessment using sensitivity function

- □ The sensitivity function:
  - is a common measure for performance;
  - peak corresponds to modulus margin, typically tuned to be below 6dB for robustness;
  - magnitude corresponds to the amount of disturbance suppression/amplification at a given frequency:
    - $\square |S| < 0 \text{ dB} \rightarrow \text{Feedback control improves performance};$
    - $\square |S| > 0$  dB  $\rightarrow$  Feedback control deteriorates performance.
- □ The waterbed effect:
  - suppression of |S| at given frequency results in amplification elsewhere;
  - is a fundamental limitation of linear control.





### Case study: sensitivity function



- As expected from the Nyquist plot, the modulus margin is slightly higher than 6 dB
- Up to 82 Hz, the feedback controller improves the performance of the system

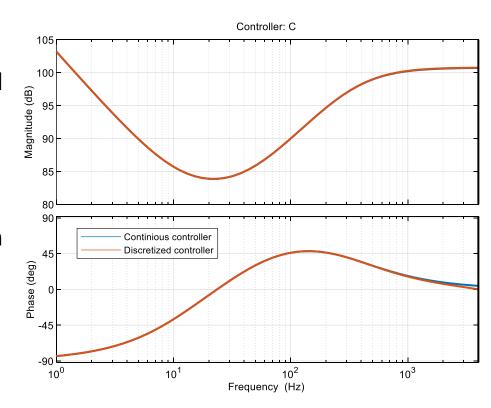
#### ■ Note:

Reference profiles used by ASMPT typically have their dominant energy content in the low-frequency range



### Case study: discretization of feedback controller

- Our machines run on a fixed sampling rate
- Therefore, the feedback controller needs to be discretized before implementation on the machine
- Tustin-discretization is a common method to convert a system from the continuous to the discrete time domain
- Discretized and continuous feedback controllers have similar Bode characteristics -> discretization successful





### **COFFEE BREAK**

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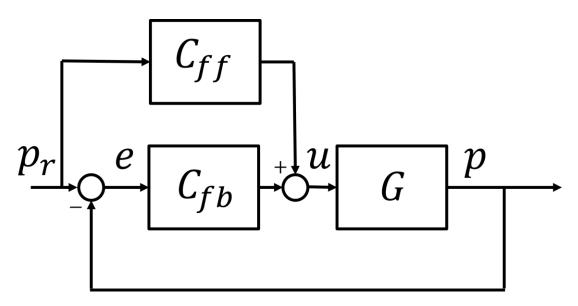
### FEEDFORWARD CONTROL



### Motion control system (with feedforward control)

- $\square$   $p_r$ : reference position
- □ p: encoder position
- e: error
- u: motor input
- for simplicity, the disturbances are ignored here.

- **□** *G*: plant
- $\Box$   $C_{fb}$ : feedback controller
- $\Box$   $C_{ff}$ : feedforward controller





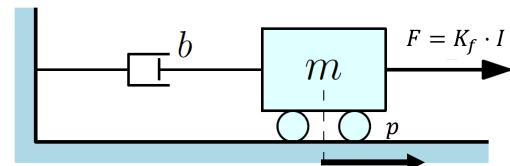
#### Why feedforward control?

- Feedback reacts to an already existing error and is therefore always lacking behind
- Feedforward uses knowledge about the motion profile and the plant dynamics to deliver the desired motor input before the error can occur
- In principle, if the machine dynamics are exactly known, no feedback is needed. However, in practice:
  - disturbances are present;
  - the machine dynamics are not exactly known.
  - Therefore, combining feedback and feedforward is the way to go.



#### Feedforward: simple example

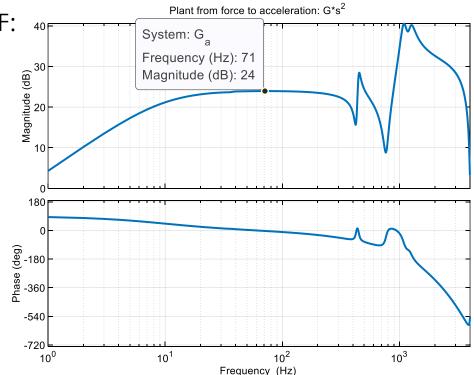
- We want to control the following system:
  - $G(s) = \frac{p(s)}{I(s)} = \frac{K_f \cdot p(s)}{F(s)} = \frac{K_f}{ms^2 + bs}$
  - with, position p, force F, current I, mass m, viscous friction b, force constant  $K_f$ , and Laplace variable s
- The optimal feedforward controller is given by:
  - $C_{ff}(s) = (G(s))^{-1} = \frac{I(s)}{p(s)} = \frac{m}{K_f} s^2 + \frac{b}{K_f} s = K_a s^2 + K_v s$
  - $I(s) = (K_a s^2 + K_v s) p(s)$
  - Conversion to time domain:  $I(t) = K_a\ddot{p}(t) + K_v\dot{p}(t)$
  - Therefore, an acceleration and velocity feedforward need to be used for this system, with feedforward parameters  $K_a$  and  $K_v$ .
  - For many motion systems within ASMPT, a feedforward consisting of an acceleration and velocity element are capable to capture the desired current to follow a given motion profile with >90% accuracy.





### How to obtain the feedforward parameters? ( $K_a$ )

- $lue{\Box}$  An initial guess of the acceleration feedforward parameter  $K_a$  can be directly estimated from the plant FRF:
  - 1. Measure the FRF from current I to position p. i.e.,  $G(s) = \frac{p(s)}{I(s)}$
  - 2. Take the 2<sup>nd</sup> derivative of this FRF:  $G(s) \cdot s^2 = \frac{p(s)}{I(s)} \cdot s^2 = \frac{\ddot{p}(s)}{I(s)}$
  - 3. Obtain the magnitude of the horizontal part of the FRF for the estimation of the acceleration feedforward parameter:  $K_a = \frac{1}{db2mag(24)} = 0.0631 \text{ [As}^2/\text{m]}$



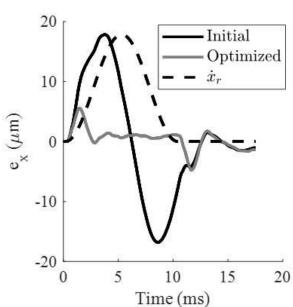


### How to obtain the feedforward parameters? $(K_v)$

lacktriangle Obtaining an initial guess of the velocity feedforward parameter  $K_v$  is much more difficult in practice

Starting from the initial estimate of  $K_a$ , the feedforward parameters  $K_a$  and  $K_v$  can be further finetuned with the machine in the loop until the servo errors are minimized:

■ This can be done manually by trial & error, but more advanced automated methods do exist



### **CONCLUSIONS**



#### **Conclusions**

- Feedback and feedforward control should work together in harmony.
  - Feedforward control: to deal with the machine dynamics that are known prior to the movement
  - Feedback control: to deal with the remaining unknown machine dynamics & external disturbances that always exist in practice
- Loop shaping is one of the easiest methods to tune a feedback controller. General rules of thumb result in a satisfactory controller in many situations
- Feedforward controller parameters can be partially derived based on machine data, but some manual trial & error will be required for fine-tuning in the explained method



#### **Next steps**

- Not satisfied with the obtained performance yet?
- The Center of Competency can help to further improve:
  - Feedback control → by means of the FeedBack Autotuner (FBA)
  - Feedforward control → by means of
    - Surrogate modelling optimization
    - □ Iterative learning control (ILC) with basis functions

■ Feel free to contact us!

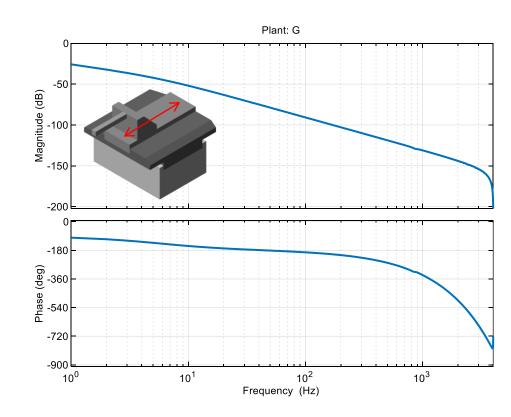


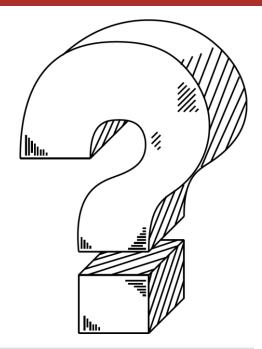
### **SELF-STUDY ASSIGNMENT**



### Self-study assignment: Y-stage of AB383 Simscape model

- In this training, the X-stage of the AB383 Simscape model has been used as an example to design a feedback and feedforward controller.
- Now, try for the Y-stage:
  - Design a feedback controller:
    - using loop-shaping,
    - with a bandwidth as high as possible,
    - with a modulus margin of less than 6 dB.
  - 2. Design a feedforward controller:
    - by obtaining the acceleration parameter using a frequency domain analysis.





# **QUESTIONS**

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