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# Eleven Tools in Feedback Control

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University of Washington

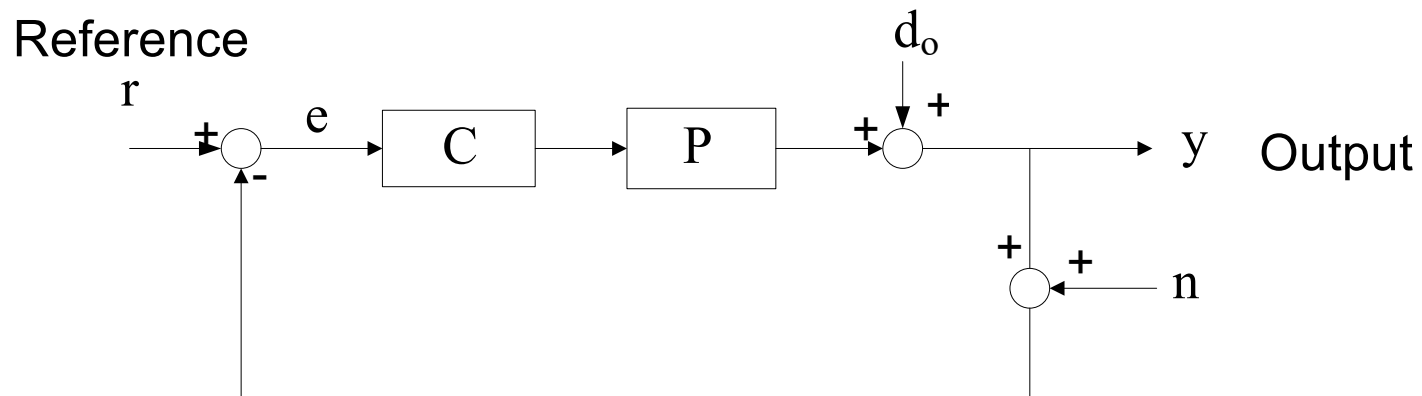
# Contents

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- Basics: Arithmetic of LTI systems, Goals of feedback, Loop shaping, Tradeoffs
- Fundamental limitations
  - Bandwidth
  - Waterbed
  - Unstable zeros
  - Magnitude-phase relationship
- Practical control engineering
  - Sampling time
  - Delays
  - Time-frequency relationship

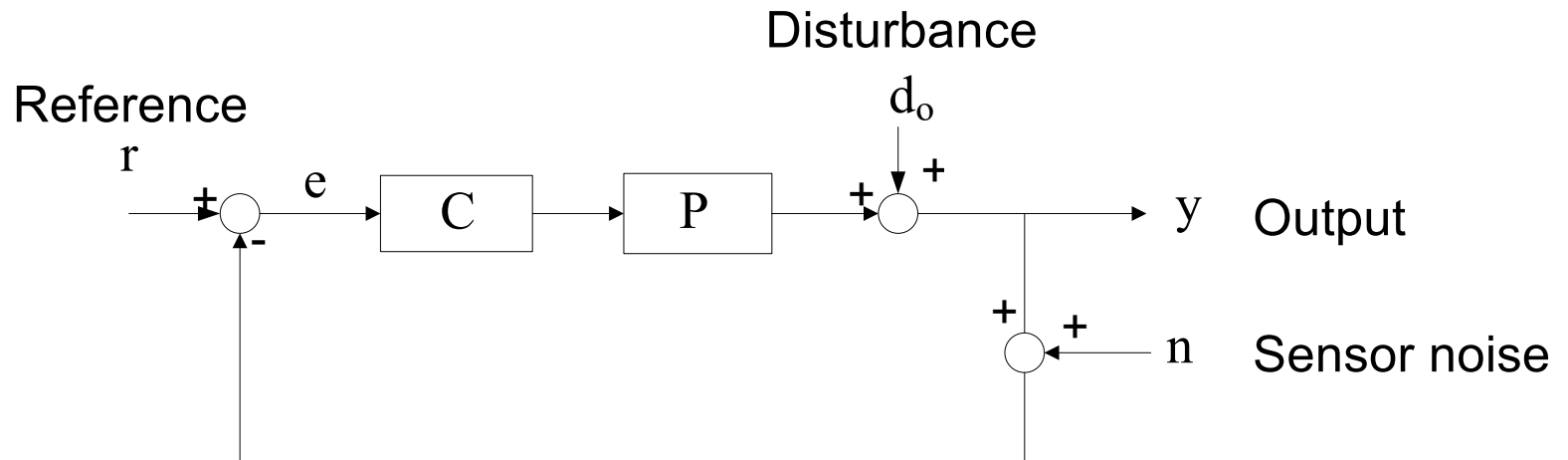
#1

# Arithmetic of feedback loops

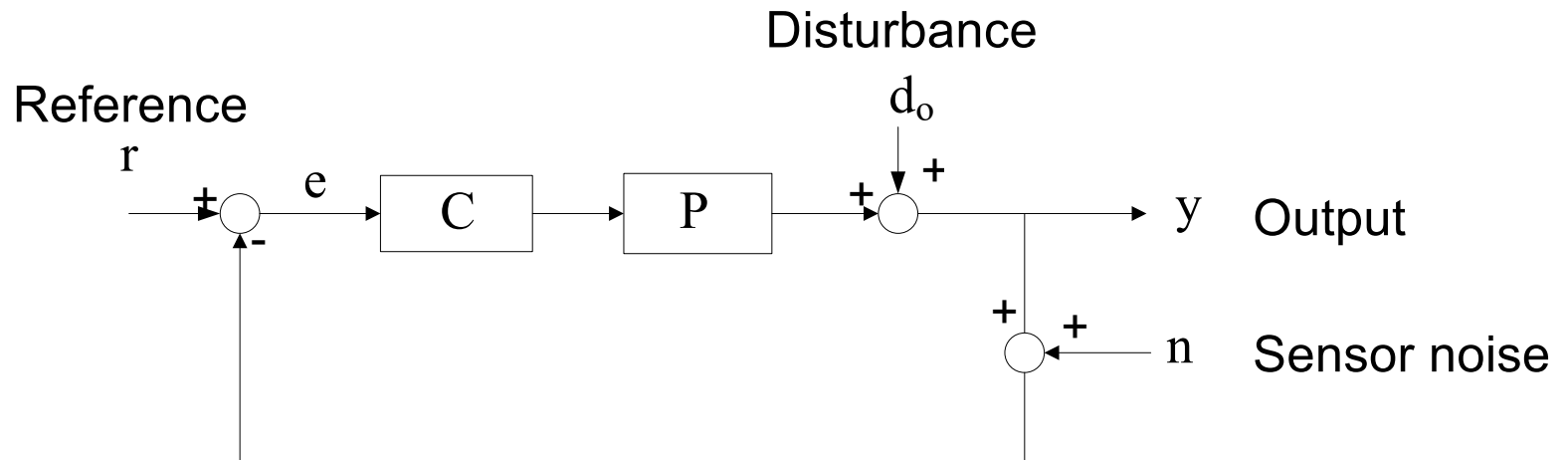


#1

# Arithmetic of feedback loops



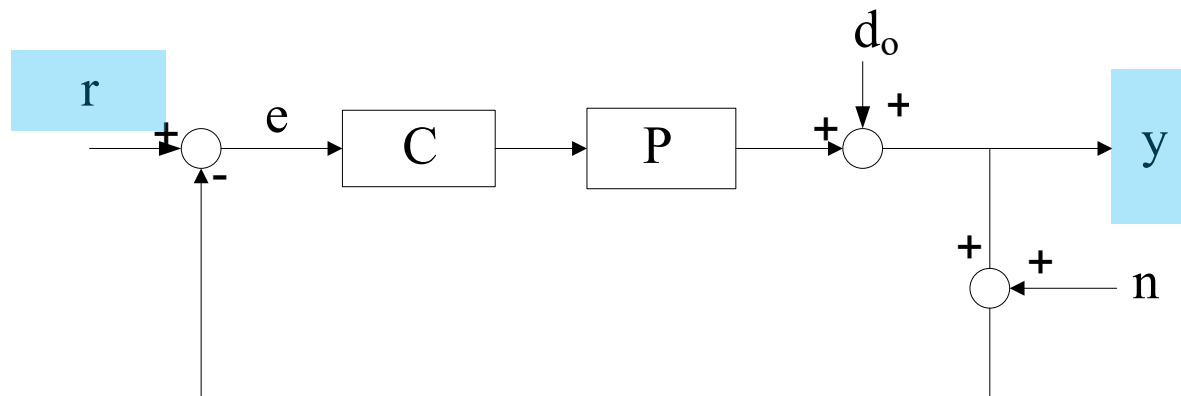
# Arithmetic of feedback loops



$$y = \frac{P C}{1 + P C} r + \frac{1}{1 + P C} d_0 + \frac{P C}{1 + P C} n$$

$\begin{matrix} \text{Reference} \\ \text{Disturbance} \\ \text{Sensor noise} \end{matrix}$

# Goals of feedback

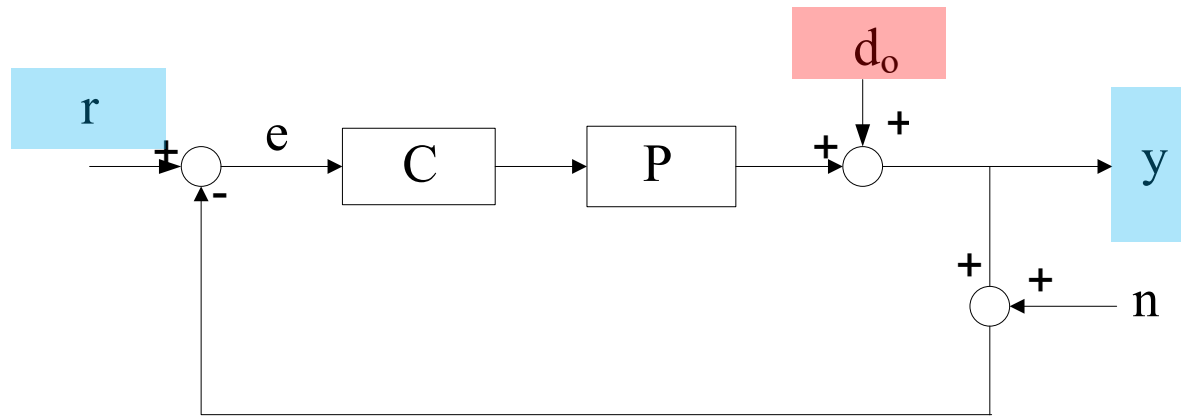


$$y = \underbrace{\frac{P C}{1 + P C}}_{\text{Desired: } \sim 1} \underbrace{\frac{1}{1 + P C}}_{\text{Complementary Sensitivity Function}} \underbrace{\frac{P C}{1 + P C}}_{\text{Reference}} \underbrace{\left[ \begin{matrix} r \\ d_o \\ n \end{matrix} \right]}_{\text{Inputs}}$$

Desired:  $\sim 1$

Complementary Sensitivity Function

# Goals of feedback



Sensitivity Function

$$y = \underbrace{\frac{P C}{1 + P C}}_{\text{Desired: } \sim 1} \underbrace{\frac{1}{1 + P C}}_{\sim 0} \underbrace{\frac{P C}{1 + P C}}_{\text{Disturbance}}$$

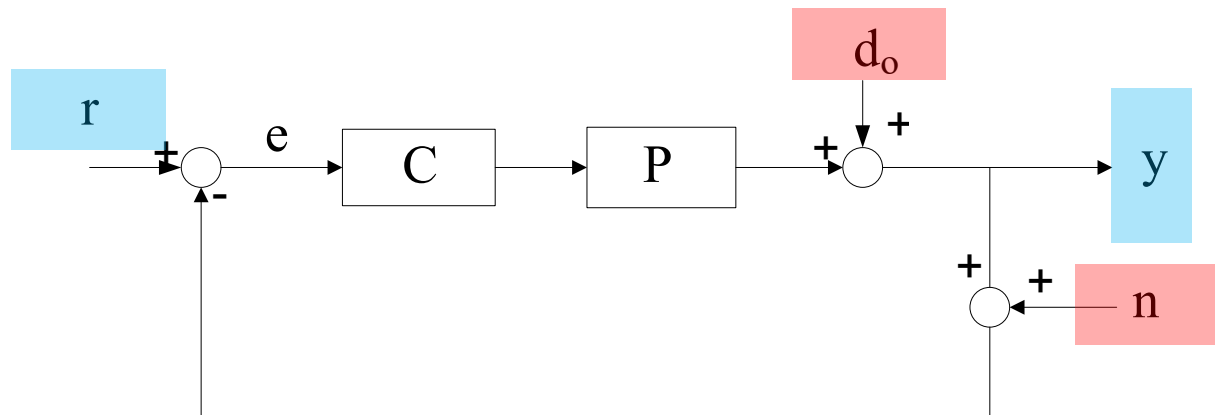
£
§

4
5

r
 $d_o$ 
 $n$

Complementary Sensitivity Function

# Goals of feedback



$$y = \underbrace{\frac{P C}{1 + P C}}_{\text{Desired: } \sim 1} \underbrace{\frac{1}{1 + P C}}_{\sim 0} \underbrace{\frac{d_o}{1 + P C}}_{\sim 0}$$

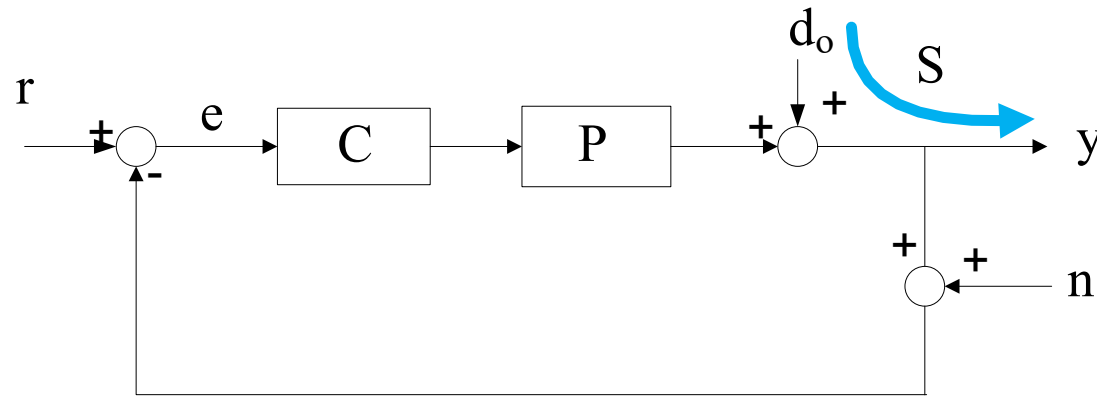
Can't do well on both!

|                |              |
|----------------|--------------|
| r              | Reference    |
| d <sub>o</sub> | Disturbance  |
| n              | Sensor noise |



#3

# Tradeoffs



$$y = \underbrace{\frac{PC}{1+PC}}_{\text{£}} \underbrace{\frac{1}{1+PC}}_{\text{§ 4}} \underbrace{\frac{d_0 PC}{1+PC}}_{\text{§ 5}} + n$$

Sensitivity Function:

$$S = (I + PC)^{-1}$$

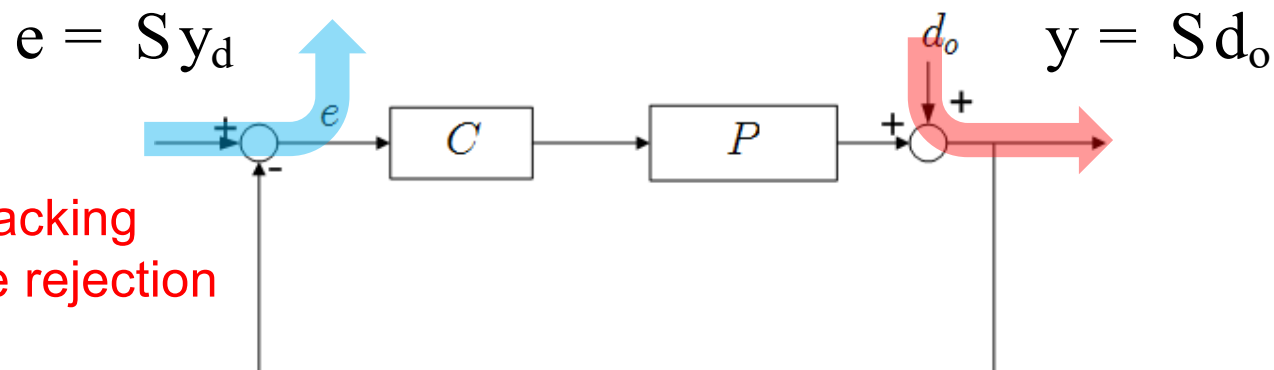
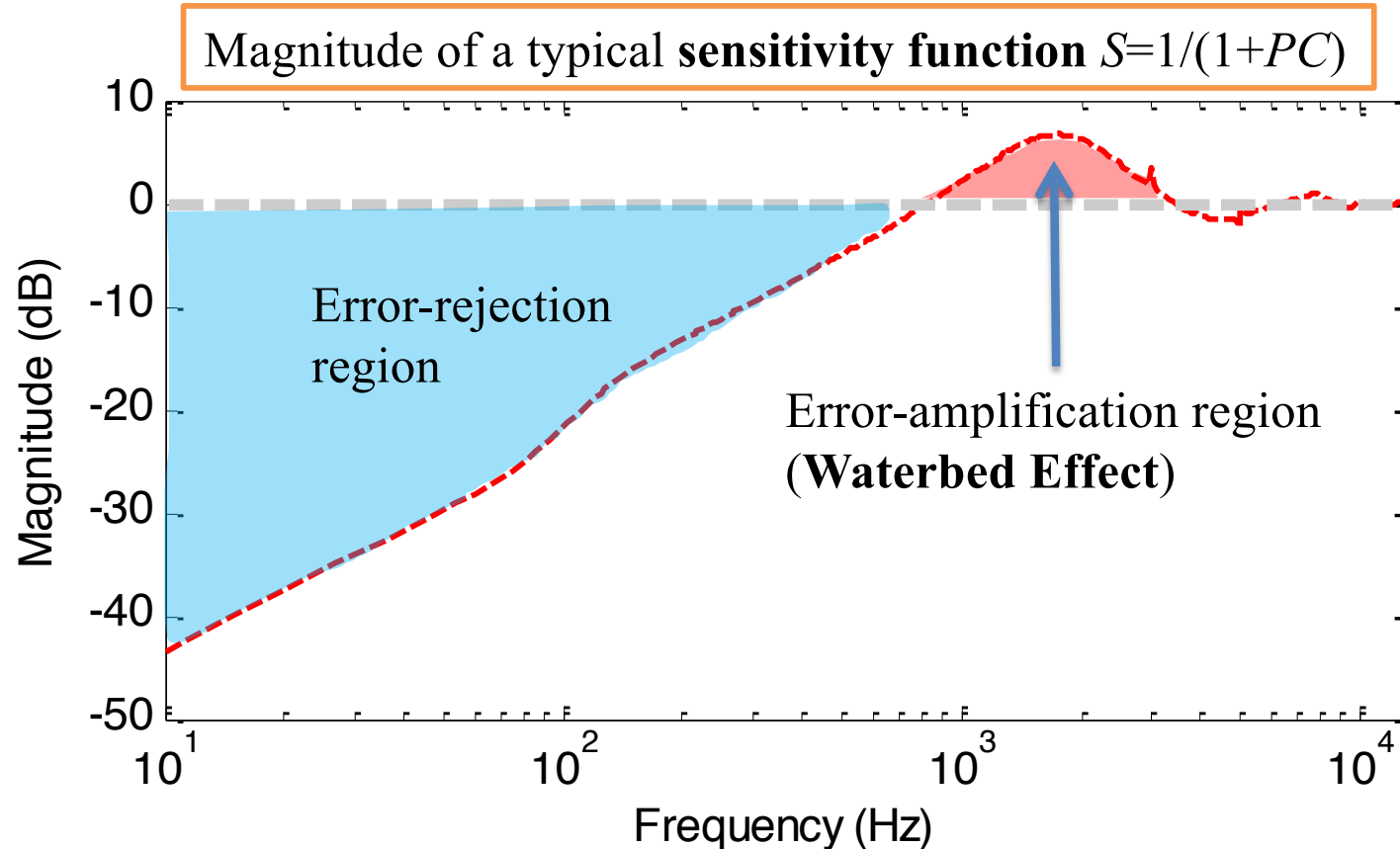
Complementary Sensitivity Function:

$$T = PC(I + PC)^{-1}$$

Fundamental Constraint:

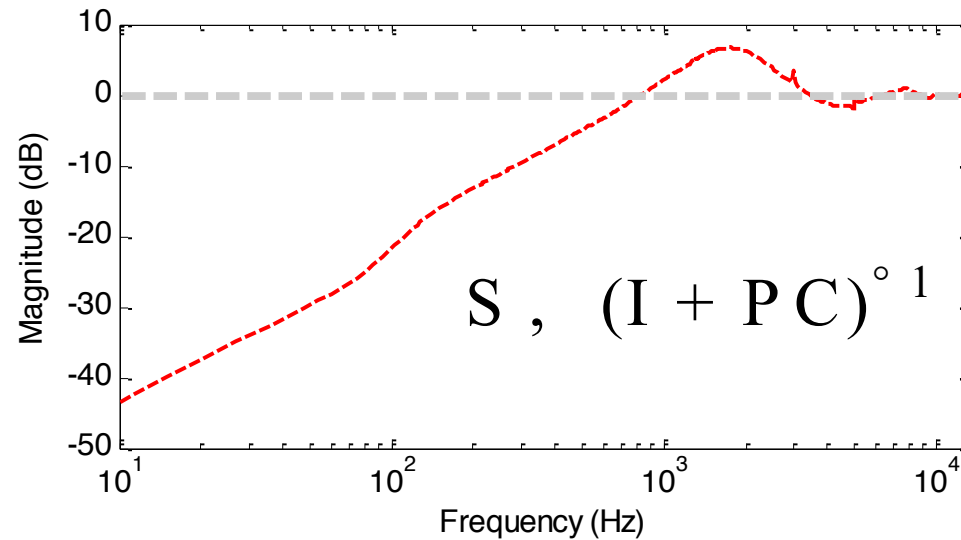
$$S + T = I$$

# Loop shaping

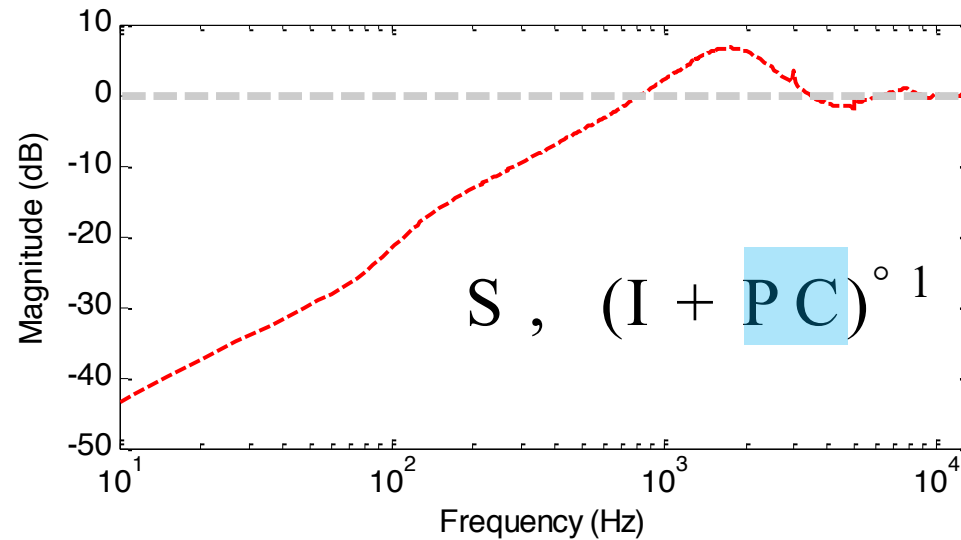


**S** defines the tracking and disturbance rejection performances

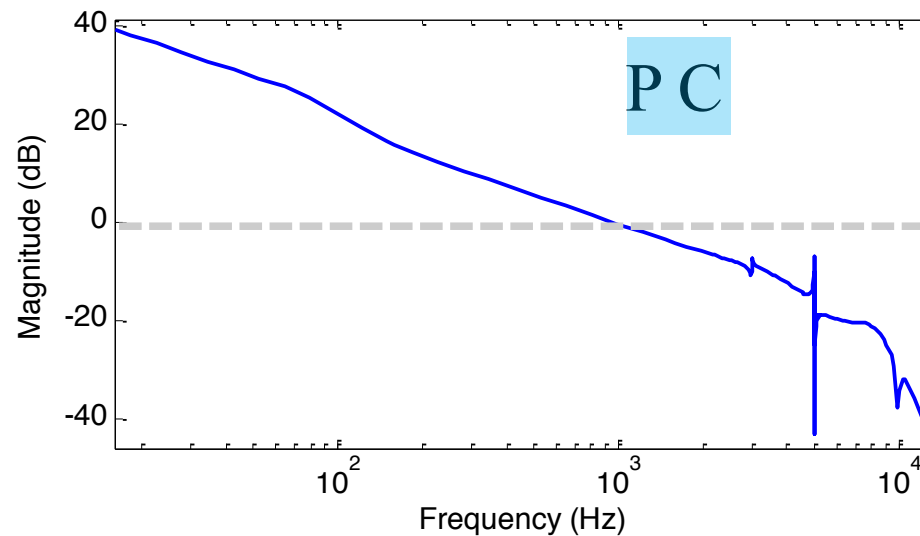
# High-gain feedback



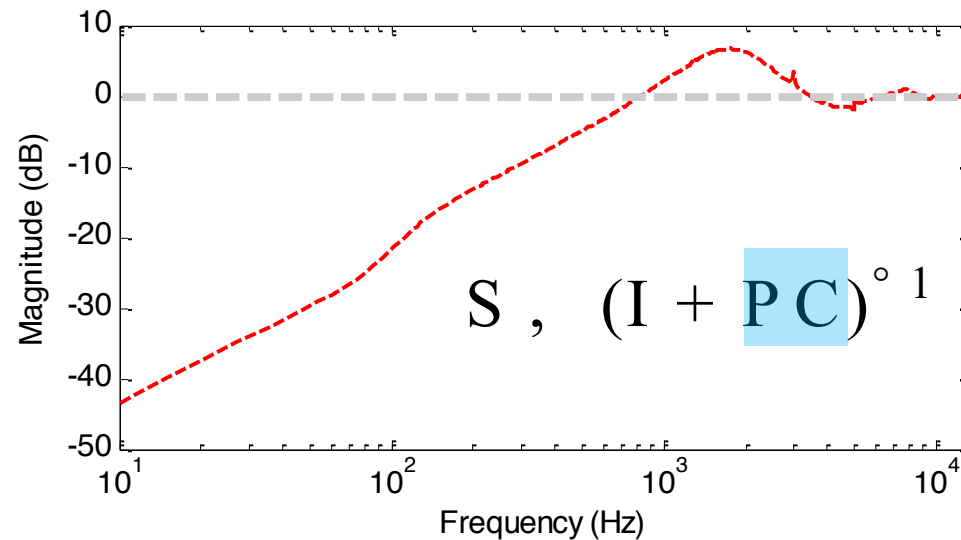
# High-gain feedback



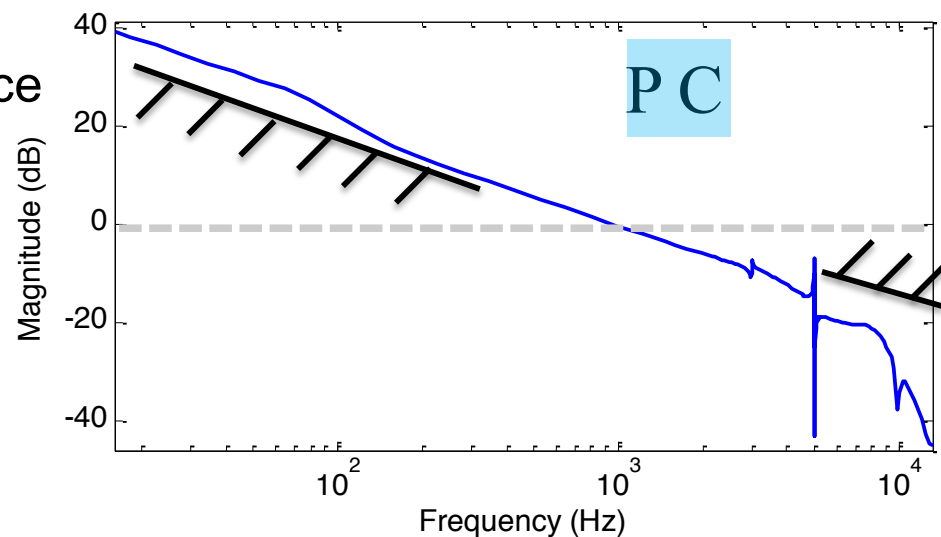
small gain in  $S$   
 $\leftrightarrow$   
 high gain in  $PC$



# High-gain feedback



Typical high-gain control for performance at low frequency

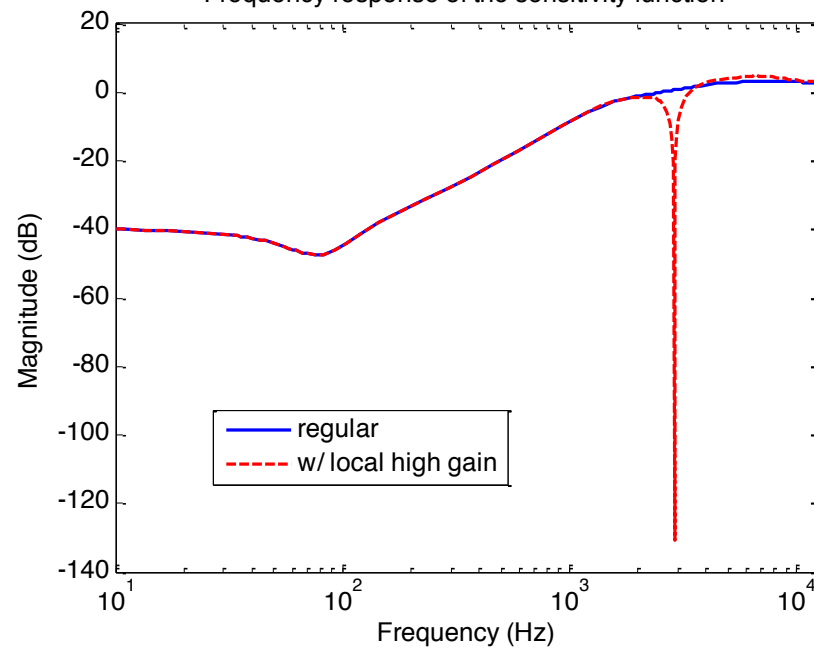


Typical low-gain control for robustness at high frequency

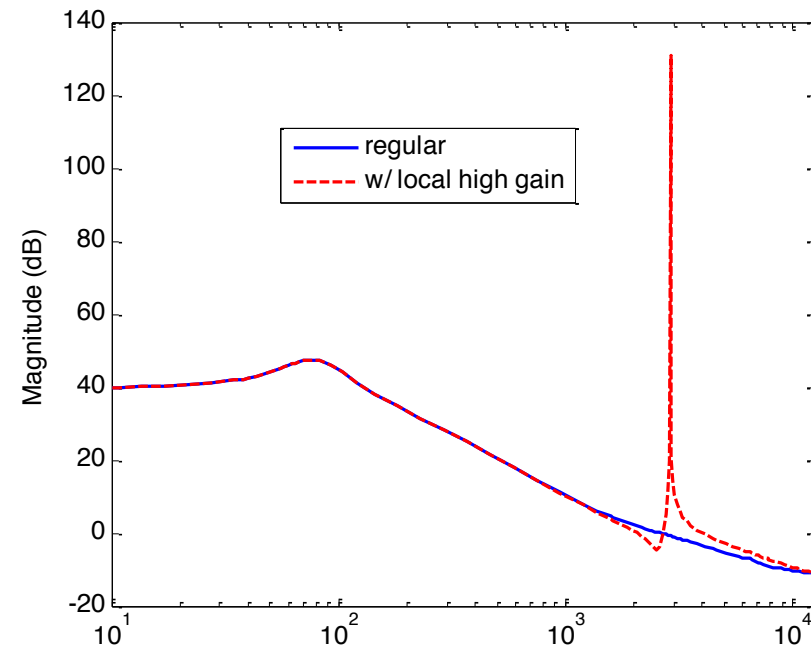
# Local high-gain feedback

$$S, (I + PC)^{-1}$$

Frequency response of the sensitivity function

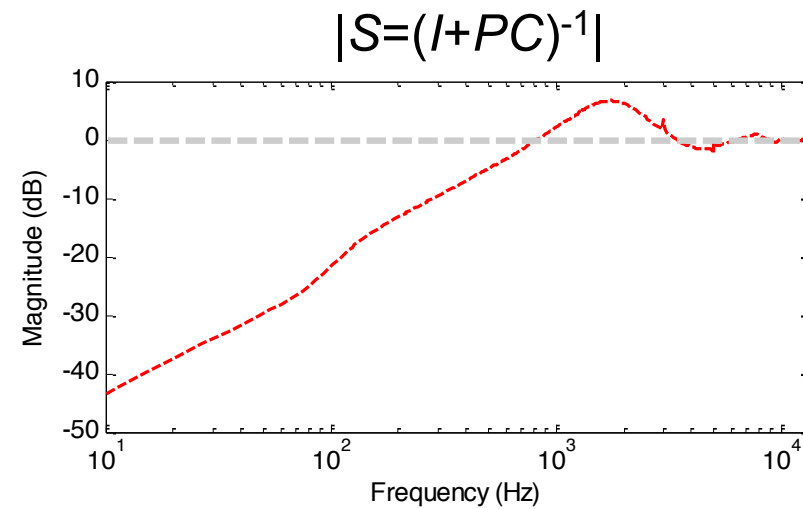


$$PC$$



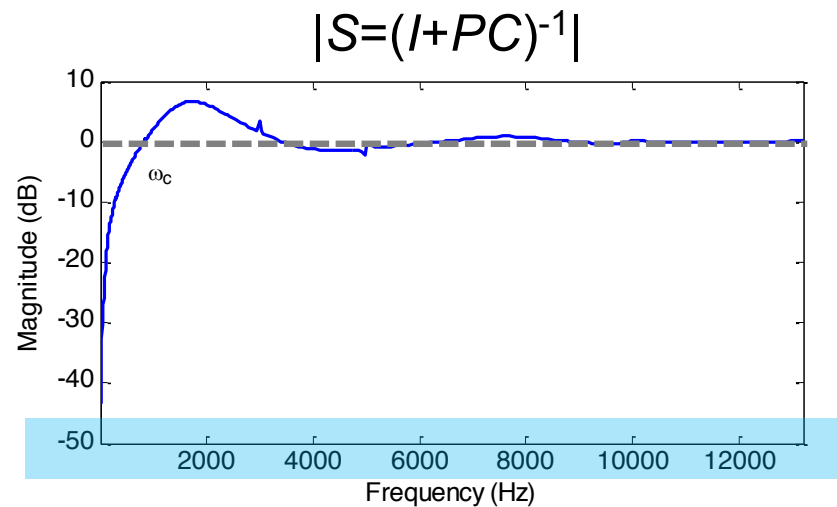
# Bode's Integral

Typical feedback design

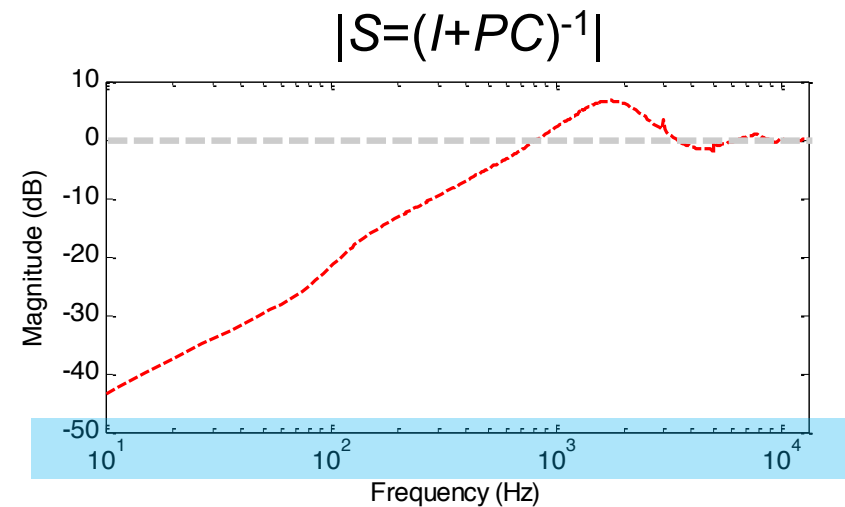


# Bode's Integral

x-axis in linear scale



Typical feedback design



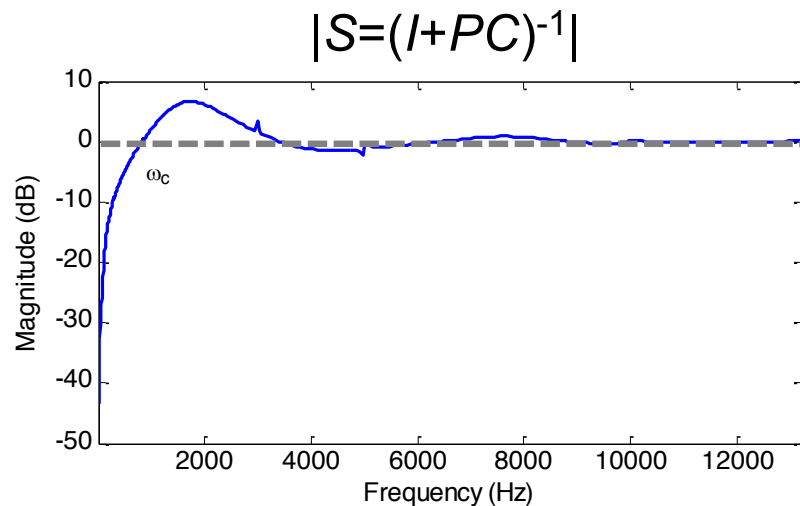


# Bode's Integral

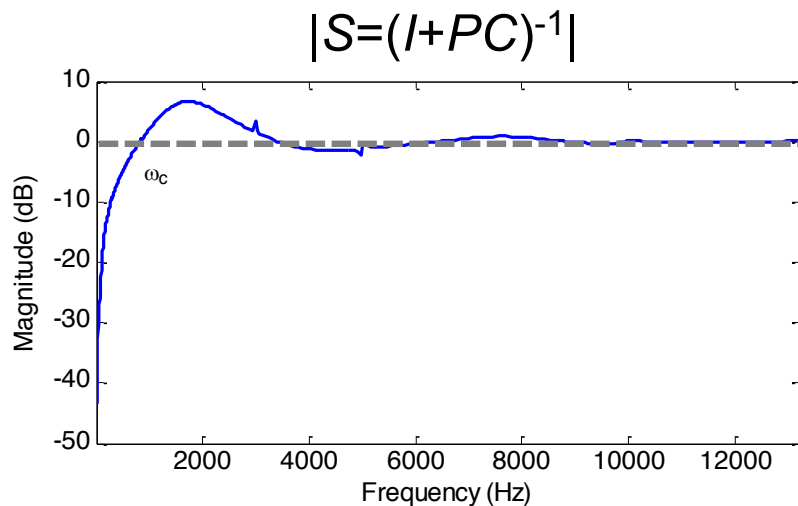
Theorem (basic Bode's Integral):  
 Let  $S(s) = 1/(1 + L(s))$ . If  $L(s)$  and  $S(s)$  are both rational and stable. Then

$$\frac{1}{2\pi} \int_0^\infty \ln |S(j\omega)| d\omega = -\frac{1}{2} k_s$$

$$k_s = \lim_{s \rightarrow \infty} sL(s)$$



# Bode's Integral



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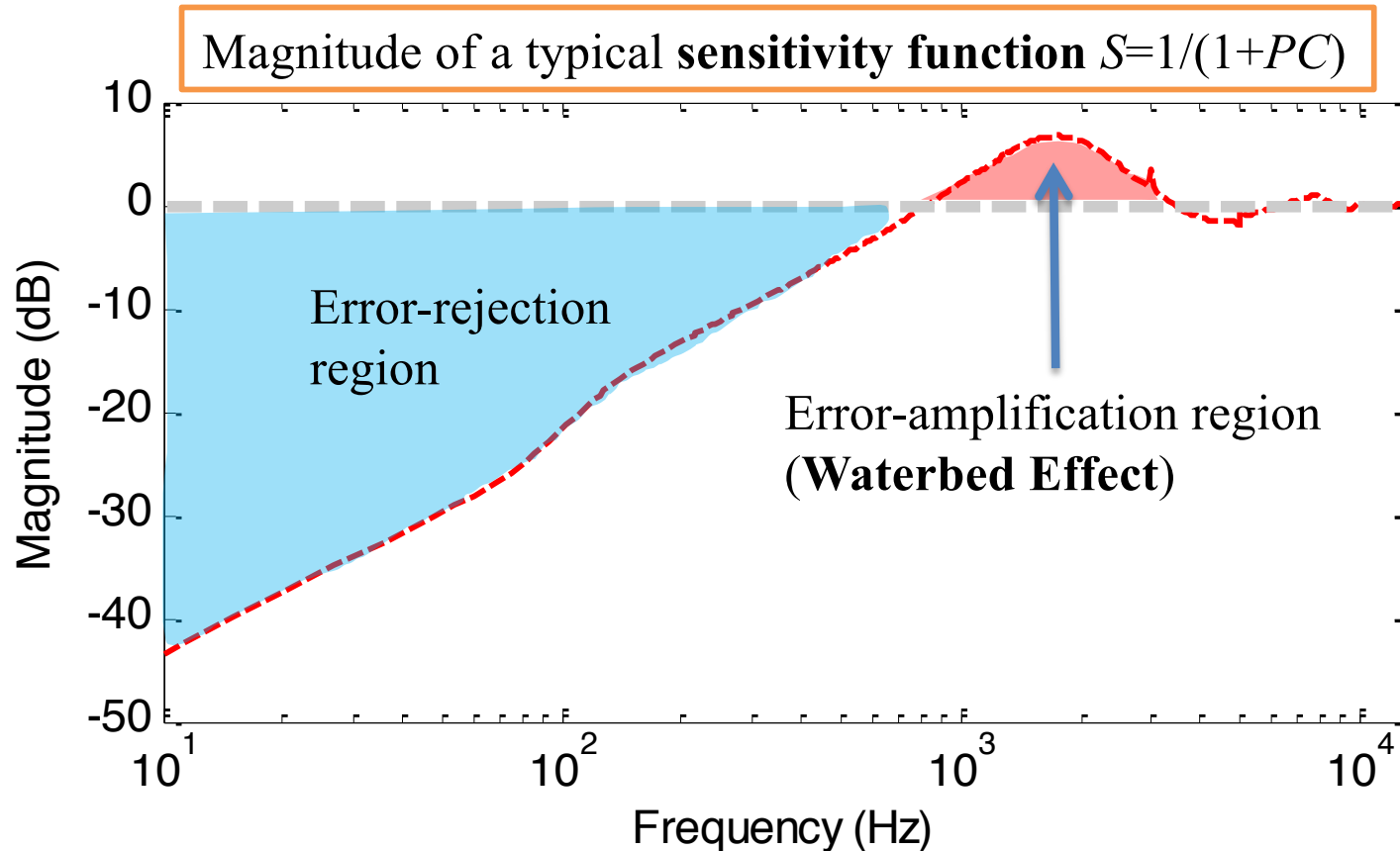
$$k_s = \lim_{s \rightarrow \infty} sL(s)$$

Special case: If the relative degree of  $L(s)$  larger than or equal to 2, then

$$\int_0^{\infty} \ln |S(j\omega)| d\omega = 0$$

# Bandwidth limitation

Recall:



Bode's Integral:

$$\frac{1}{2\pi} \int_0^\infty \ln |S(j\omega)| d\omega = 0$$

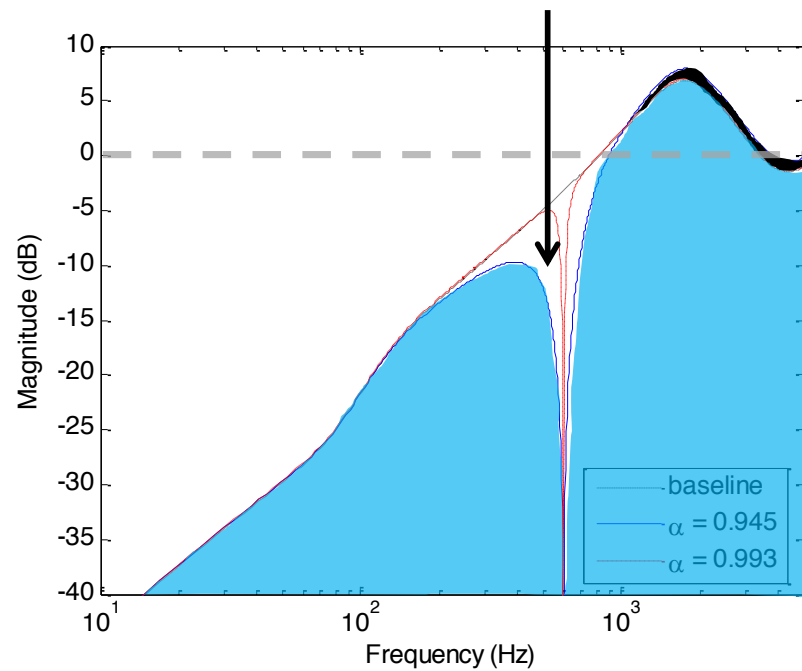
Hence it is inevitable to have the error-amplification region.

**Waterbed** effect: pushing down  $S$  in one region causes amplification in some other region.

#6

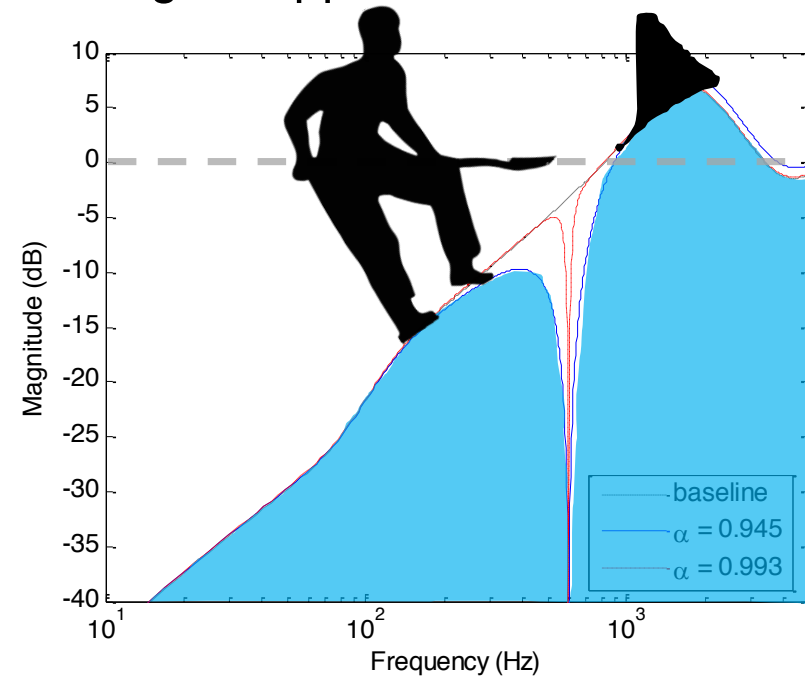
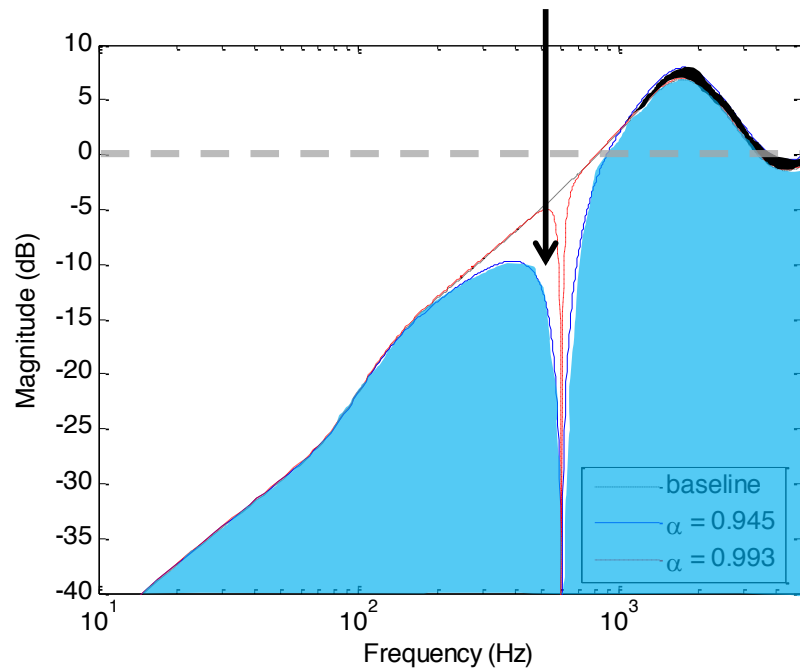
# Waterbed Effect

So to achieve this,

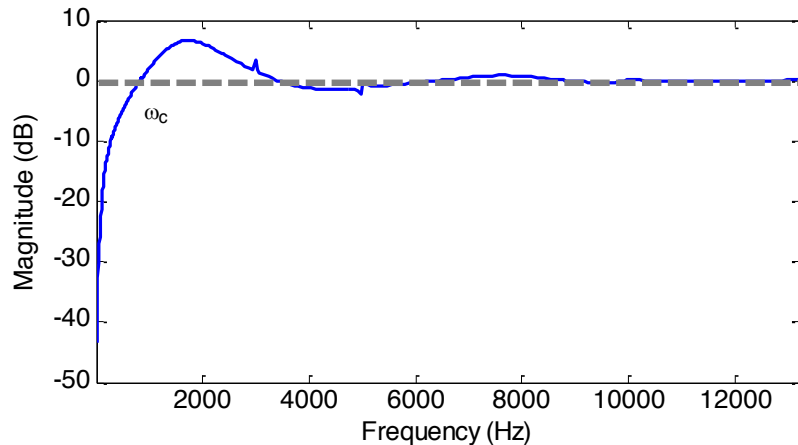


# Waterbed Effect

So to achieve this, this might happen...



# General Bode's Integral



Theorem (general Bode's Integral): Let  $S(s) = 1/(1 + L(s))$ . If  $S(s)$  is stable and  $L(s)$  has unstable poles  $p_k$ ,  $k=1, \dots, q$ . Then

$$\frac{1}{2\pi j} \int_0^\infty \ln |S(j\omega)| \omega d\omega = \sum_{k=1}^q \operatorname{Re} p_k$$

Proof: complex analysis, analytic functions, Cauchy Integral

## #7 Limitations from unstable zeros

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- Example:  $P = sP_{else}$   $\rightarrow$  constant inputs can't impact the output

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- More consequences:
  - $S$  *always* has magnitudes larger than one



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Proof:

$$P(s_0) = 0 \quad S(s_0) = 1 = (1 + 0 \cdot C(s_0)) = 1$$

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Closed-loop stability  $\Rightarrow S(s)$  is analytic on the right-half complex plane

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Closed-loop stability  $\Rightarrow S(s)$  is analytic on the right-half complex plane

Maximum modulus theorem  $\Rightarrow$

$$|S(j\omega)| > 1 \text{ for some } \omega$$

# Limitations from unstable zeros

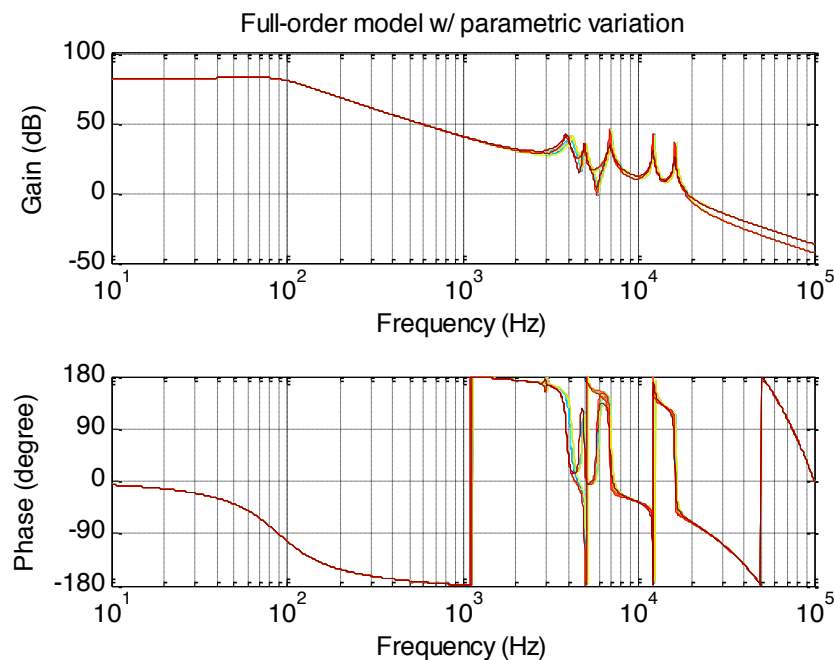
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- Example:  $P = sP_{else}$   $\rightarrow$  constant inputs can't impact the output
- More consequences:
  - $S$  *always* has magnitudes larger than one
  - Not able to perform accurate system ID
  - High-gain instability
  - Step responses can have initial undershoot
  - etc

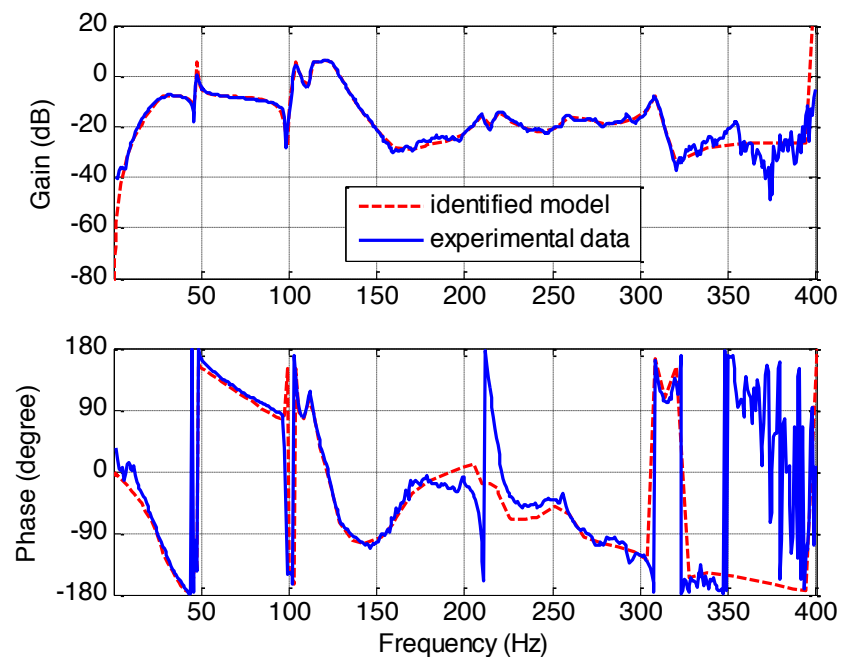
# Resonance and anti-resonance

- Typical in mechanical systems.
- Usually identified experimentally.

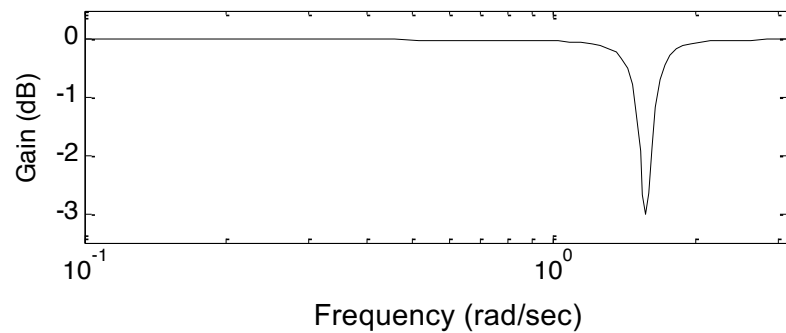
## HDD



## Active suspension



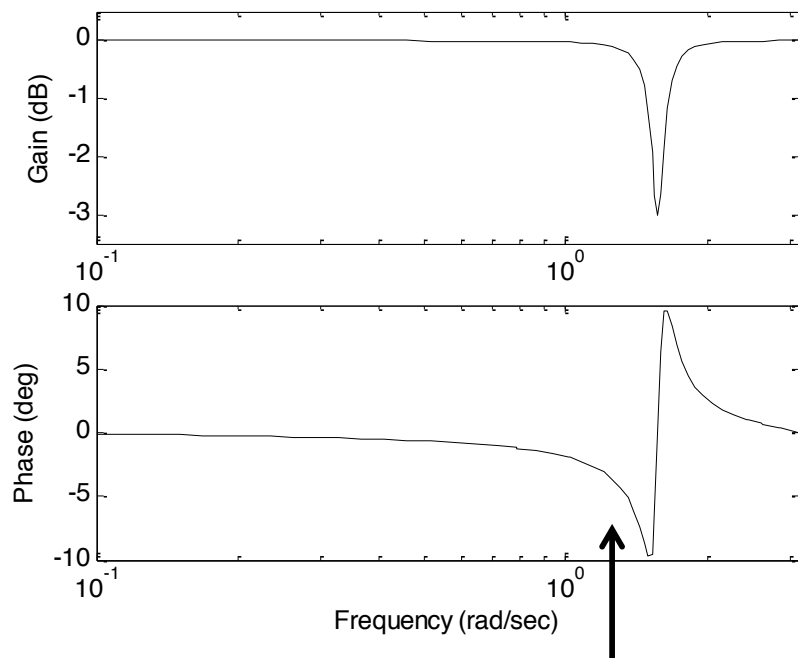
# Notch filters



Notch filtering: one common technique to handle resonances

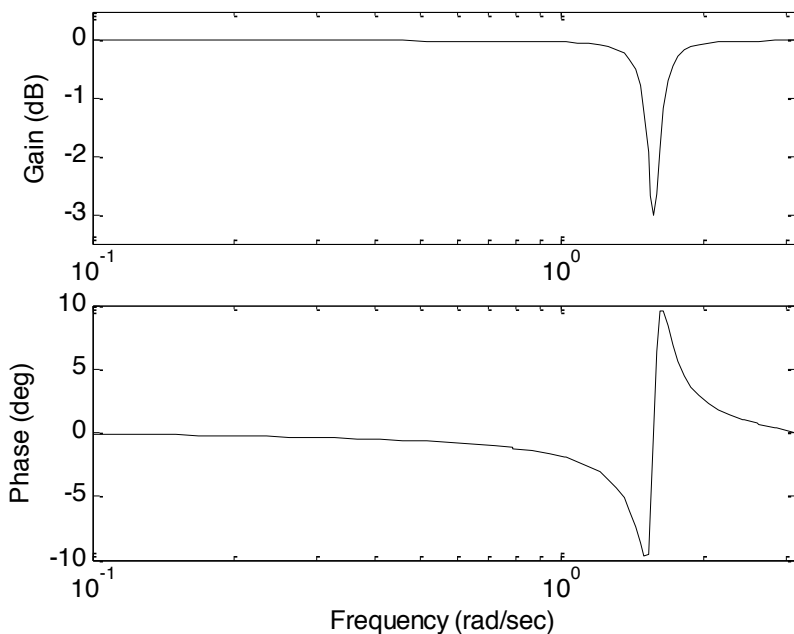
Fundamental constraint in notch filtering: introduces phase delays to the system

# Magnitude-phase relationship



Phase delays

# Magnitude-phase relationship



Theorem (Bode's Phase Formula): If  $L$  is a minimum-phase transfer function, then

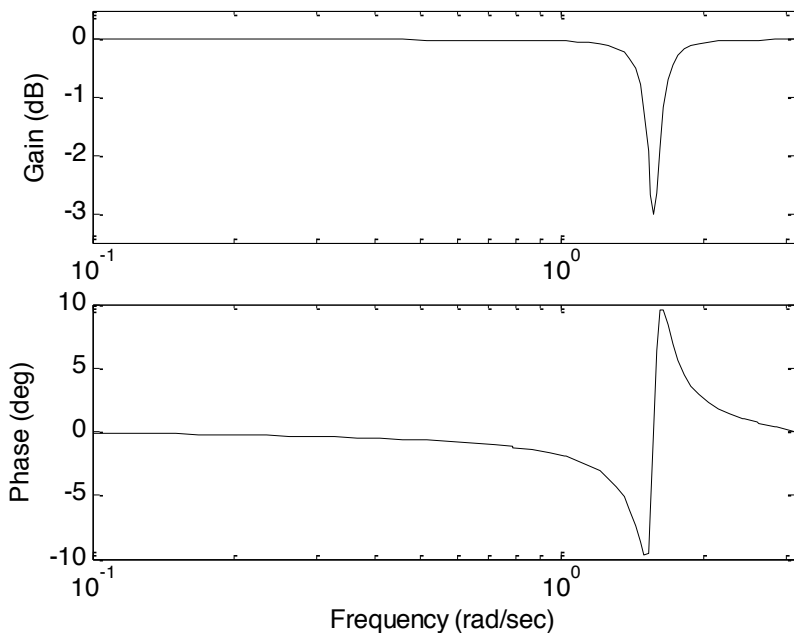
$$\angle L(j\omega) = \frac{1}{\pi} \int_{-\infty}^{\infty} \frac{d \ln |L(j\omega')|}{d \omega'} \omega' d\omega'$$

where

$$\omega' d\omega' = \frac{1}{\pi} \ln \frac{e^{j\omega' d\omega'} + e^{-j\omega' d\omega'}}{e^{j\omega' d\omega'} - e^{-j\omega' d\omega'}}.$$



# Magnitude-phase relationship



Theorem (Bode's Phase Formula): If  $L$  is a minimum-phase transfer function, then

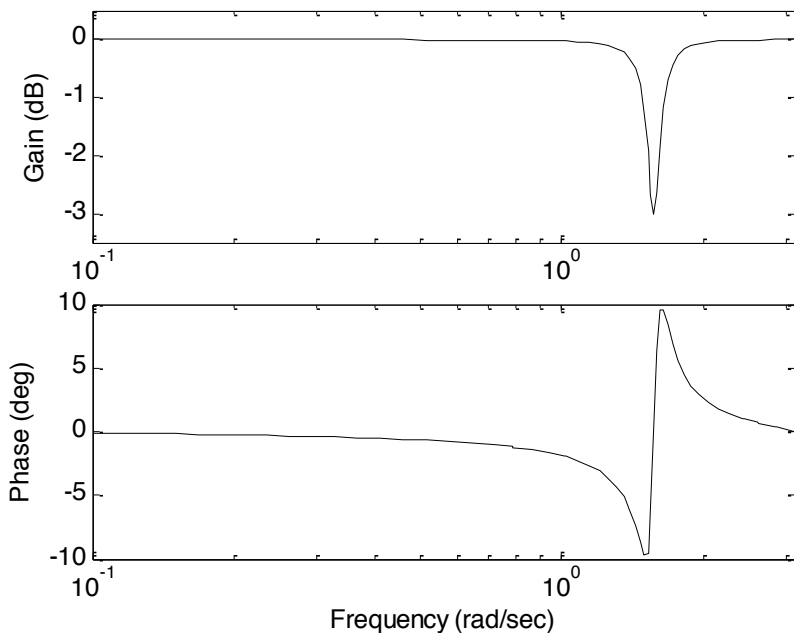
$$\angle L(j\omega) = \frac{1}{\pi} \int_{-\infty}^{\infty} \frac{d \ln |L(j\omega')|}{d \omega'} \omega' d\omega'$$

where

**Slope of magnitude response**

$$\omega' = \frac{1}{\pi} \ln \frac{e^{j\omega' + j2} + e^{-j\omega' + j2}}{e^{j\omega' - j2} - e^{-j\omega' - j2}} :$$

# Magnitude-phase relationship



Theorem (Bode's Phase Formula): If  $L$  is a minimum-phase transfer function, then

$$\angle L(j\omega) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{d \ln |L(j\omega')|}{d \omega'} \angle(\omega') d\omega'$$

where

**Slope of magnitude response**

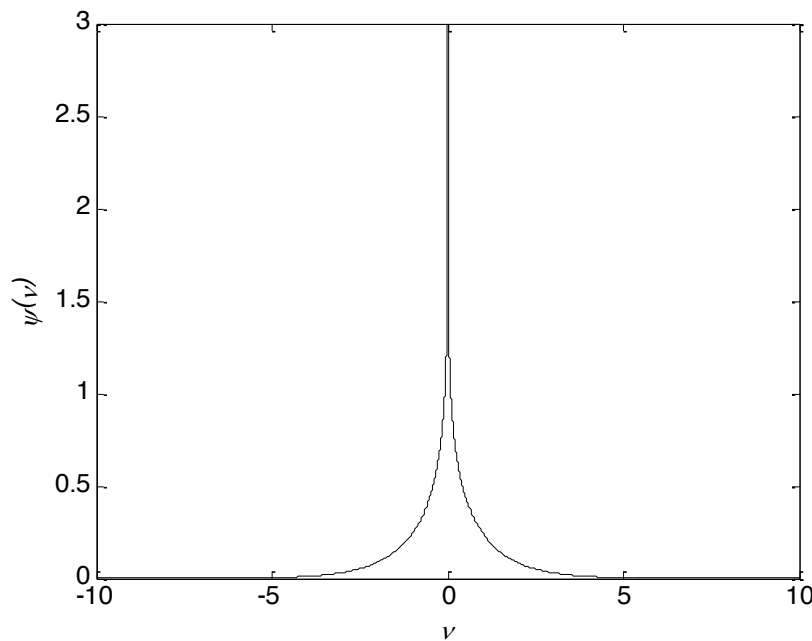
$$\angle(\omega) = \frac{1}{2\pi} \ln \frac{e^{j\omega} + e^{-j\omega}}{e^{j\omega} - e^{-j\omega}}$$

**Approximately an impulse at 0**

# Magnitude-phase relationship

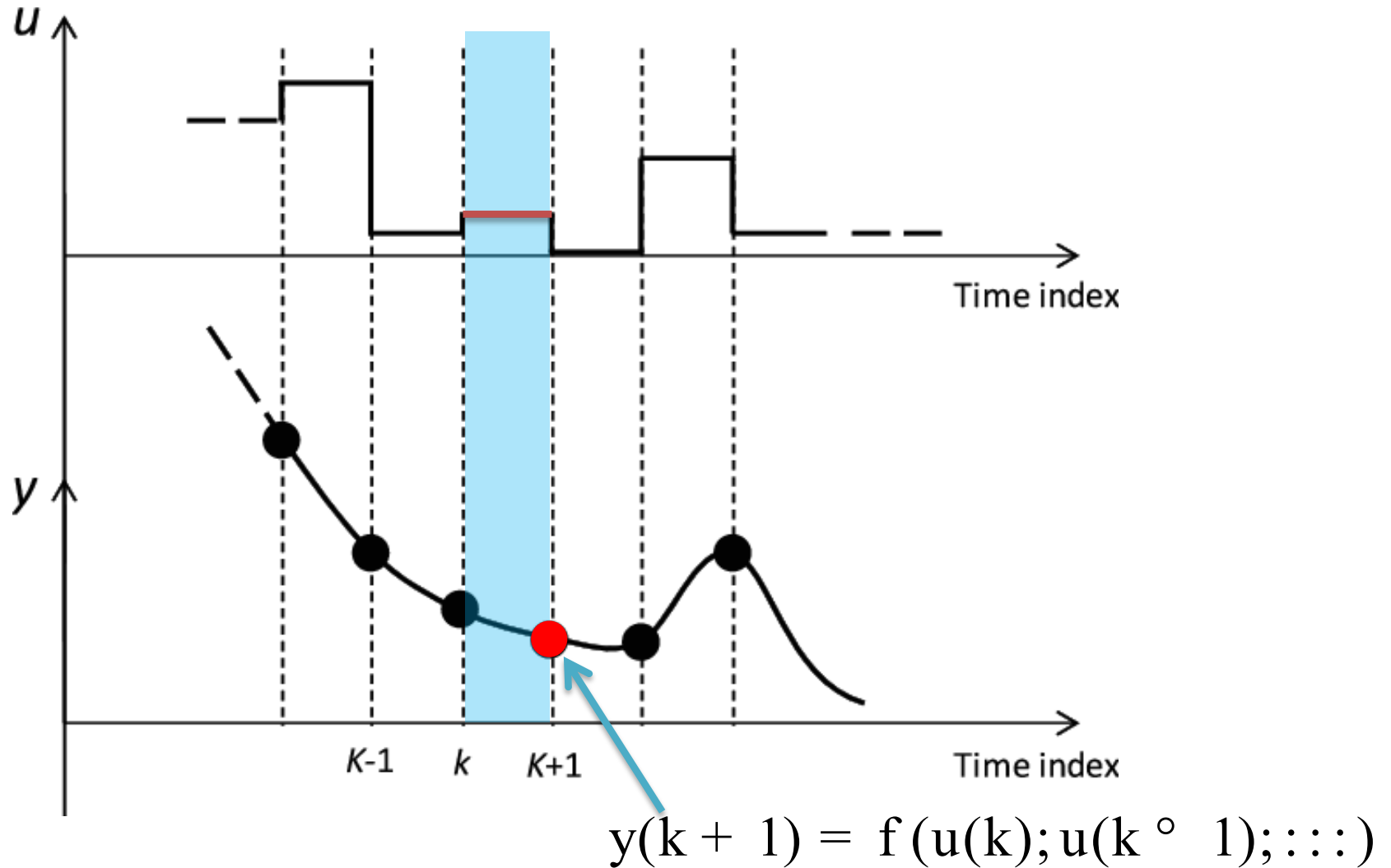
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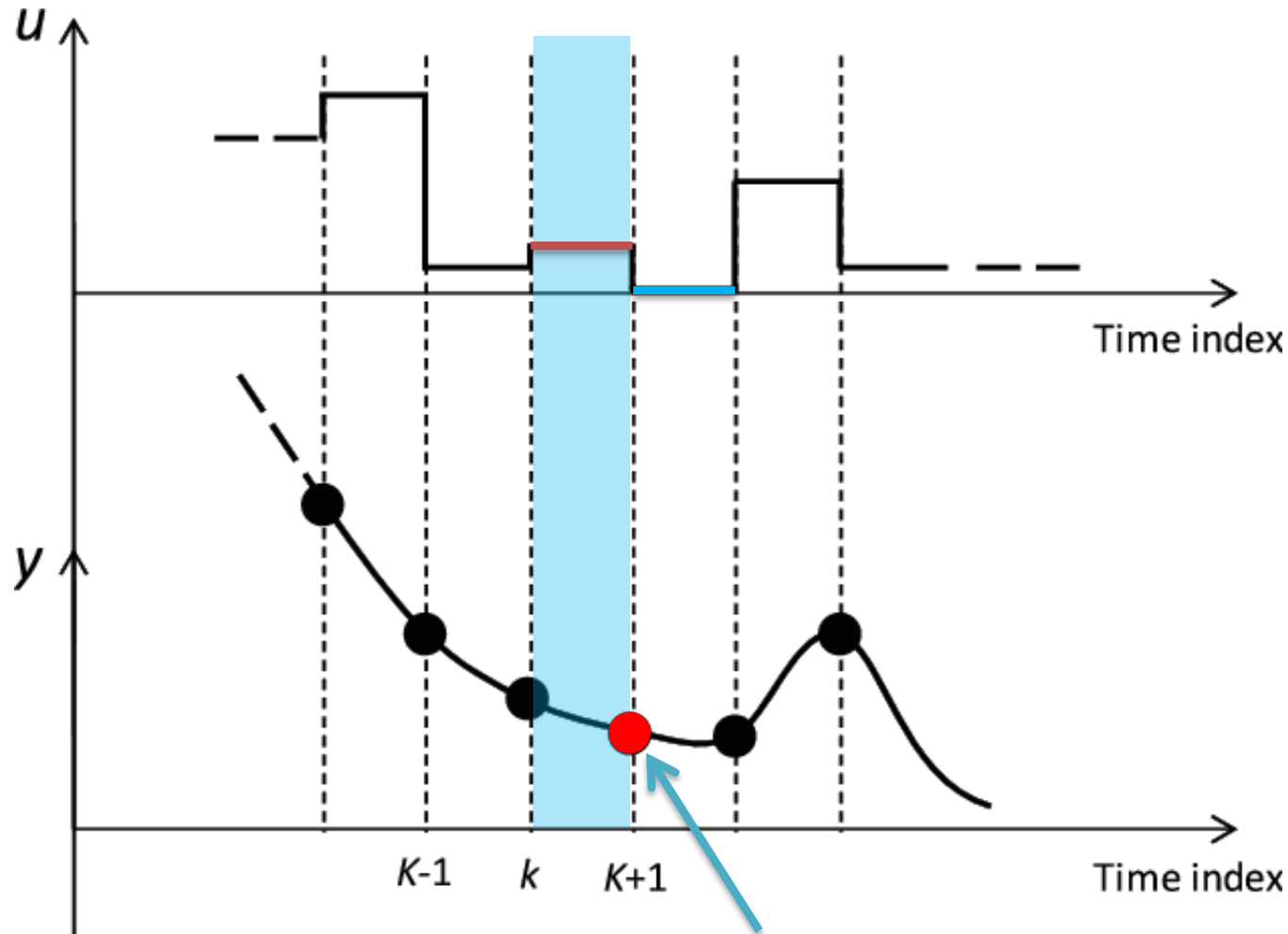


$$\angle L(j\omega) = \frac{1}{\pi} \ln \frac{e^{j\omega} + e^{-j\omega}}{e^{j\omega} - e^{-j\omega}}$$

# Discrete-time plant delay



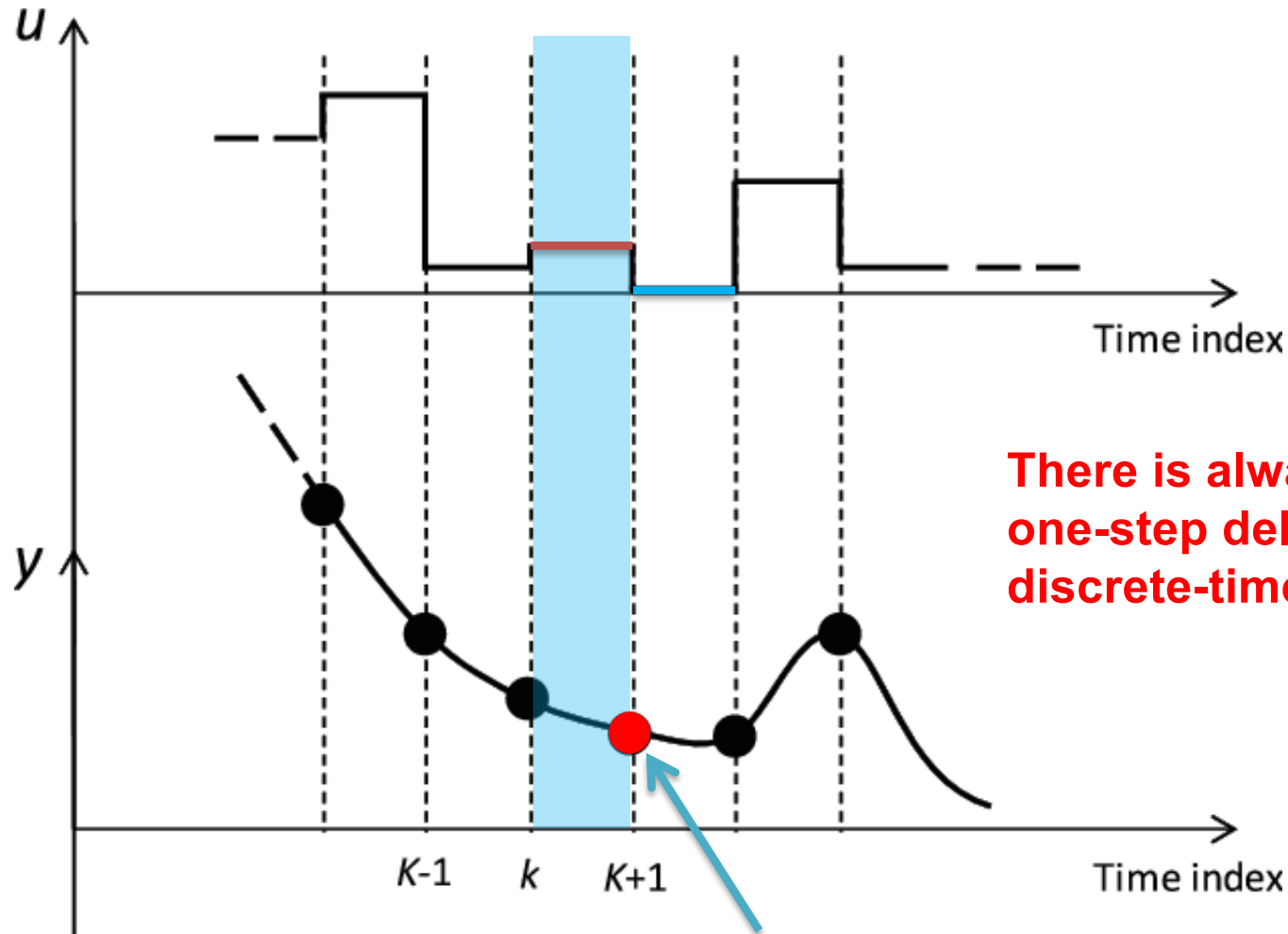
# Discrete-time plant delay



$$y(k+1) = f(u(k); u(k-1); \dots)$$

$$y(k+1) \neq f(u(k+1); \dots)$$

# Discrete-time plant delay

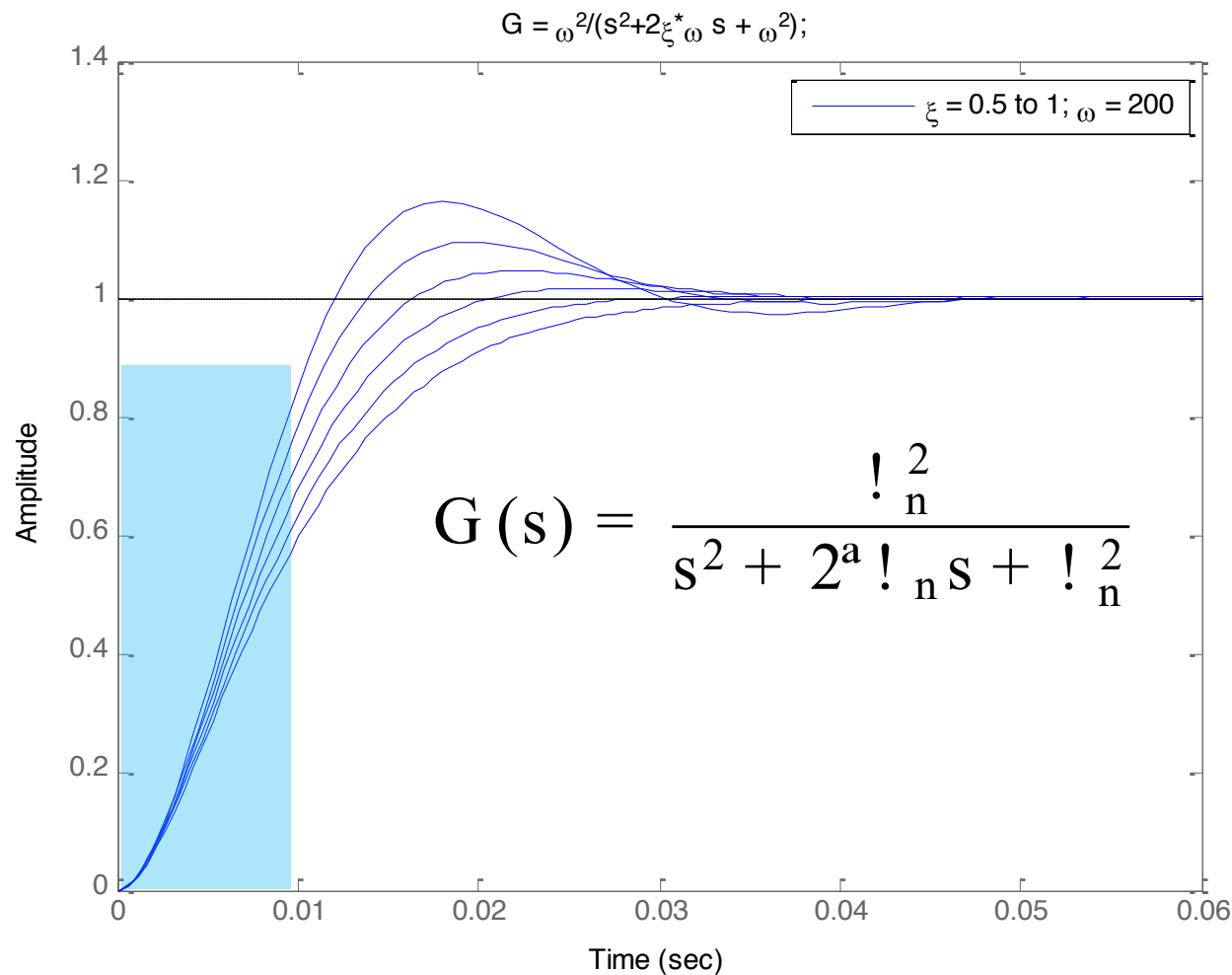


$$y(k+1) = f(u(k); u(k-1); \dots)$$

$$y(k+1) \neq f(u(k+1); \dots)$$

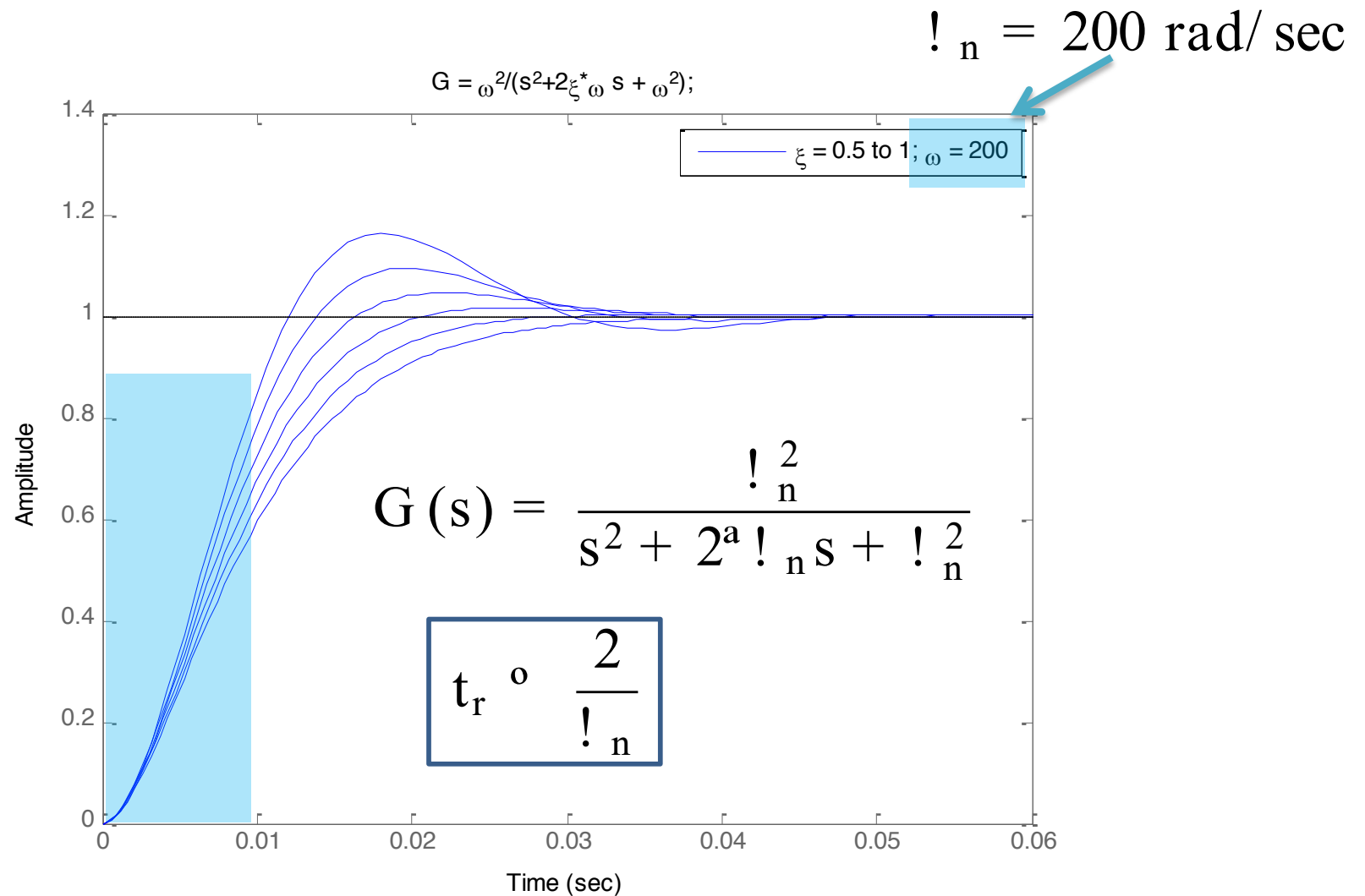
#10

# Estimate rise time from “bandwidth”



#10

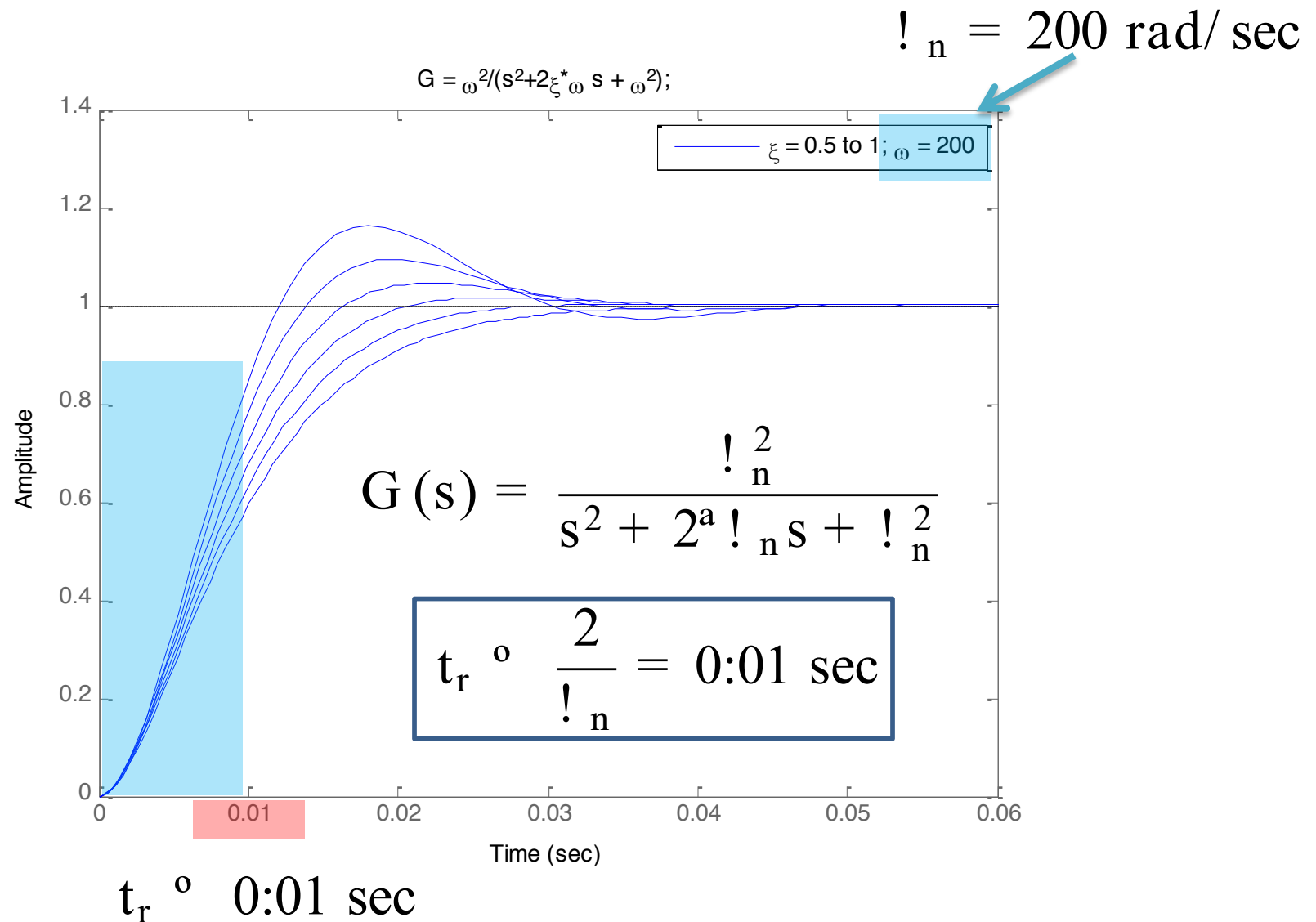
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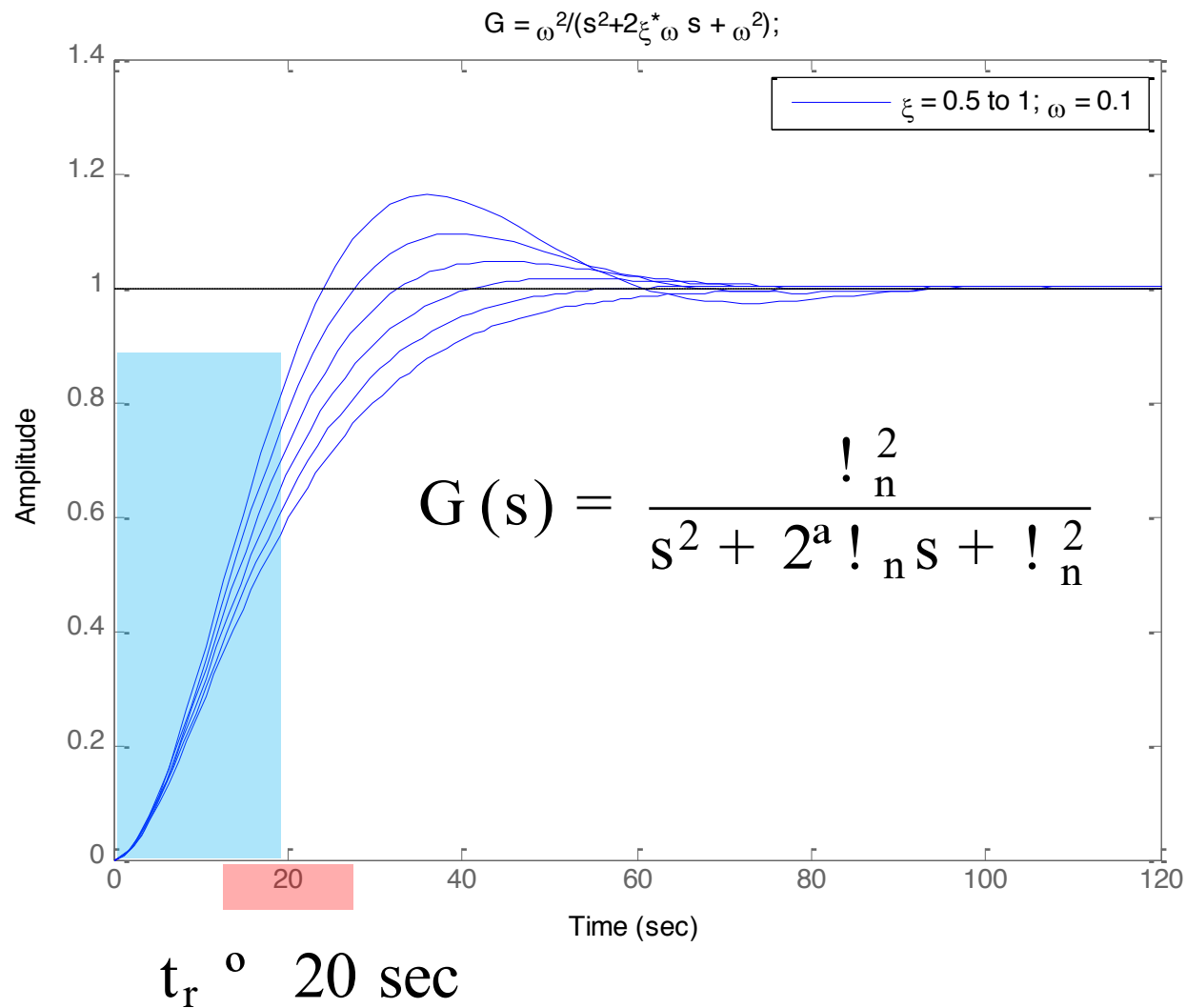
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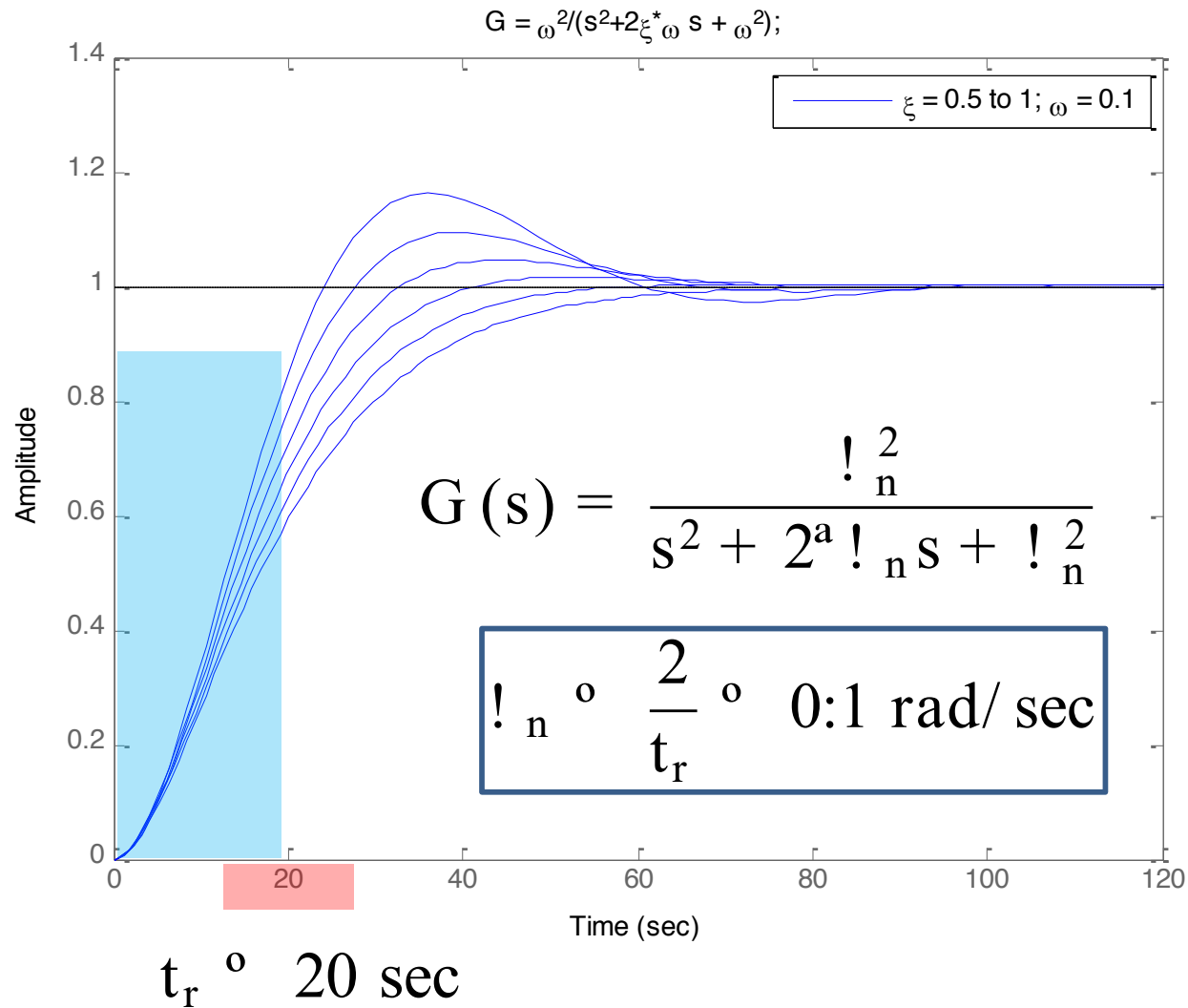
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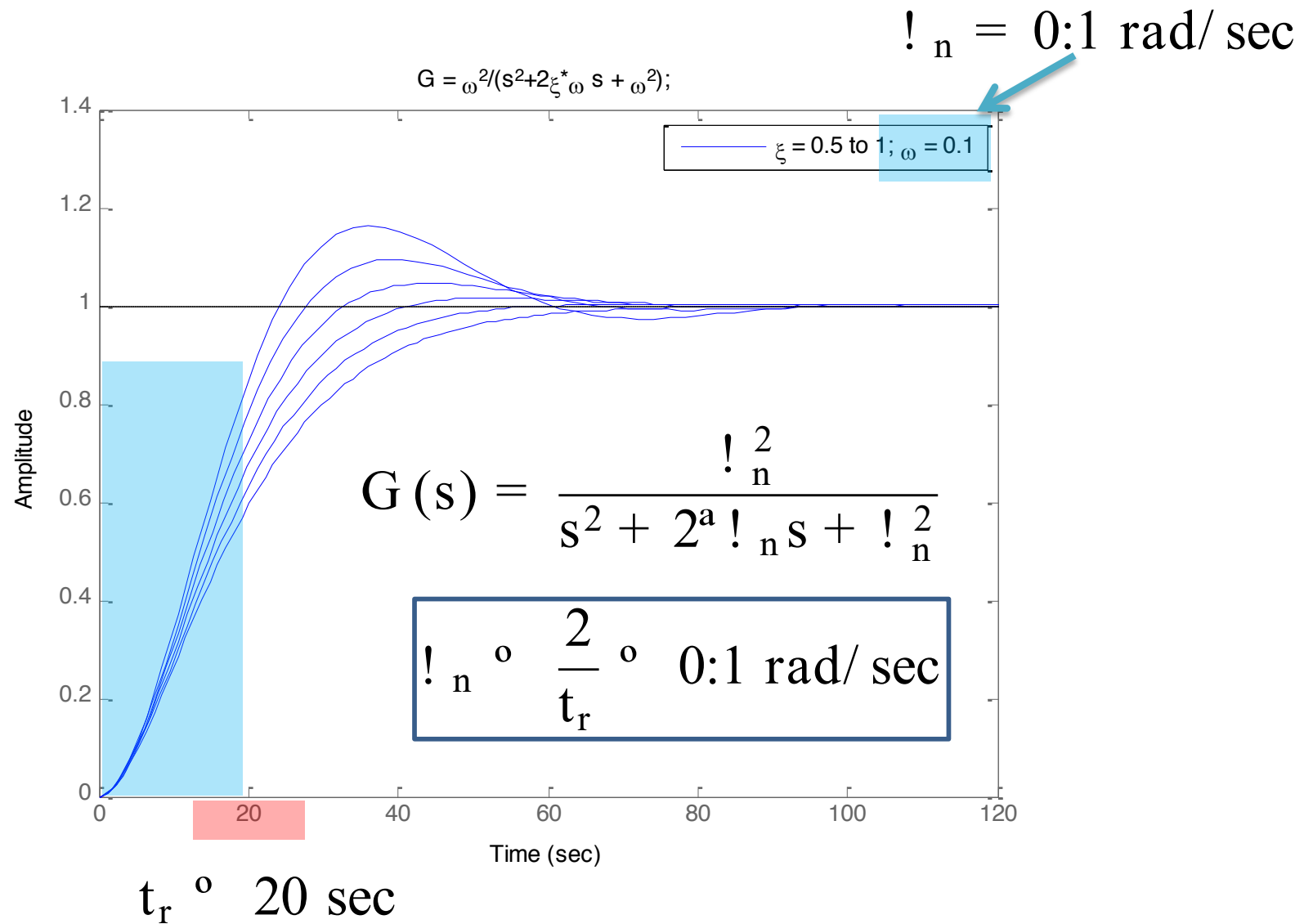
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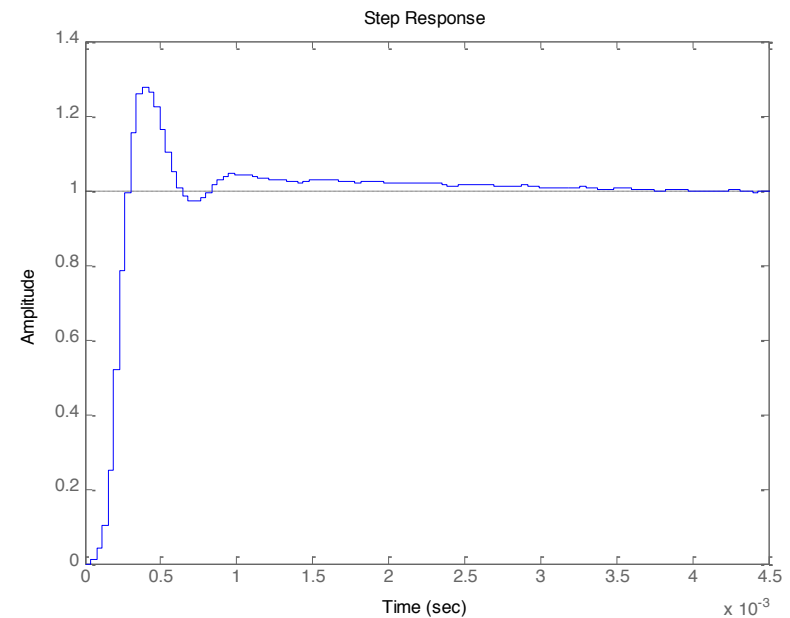
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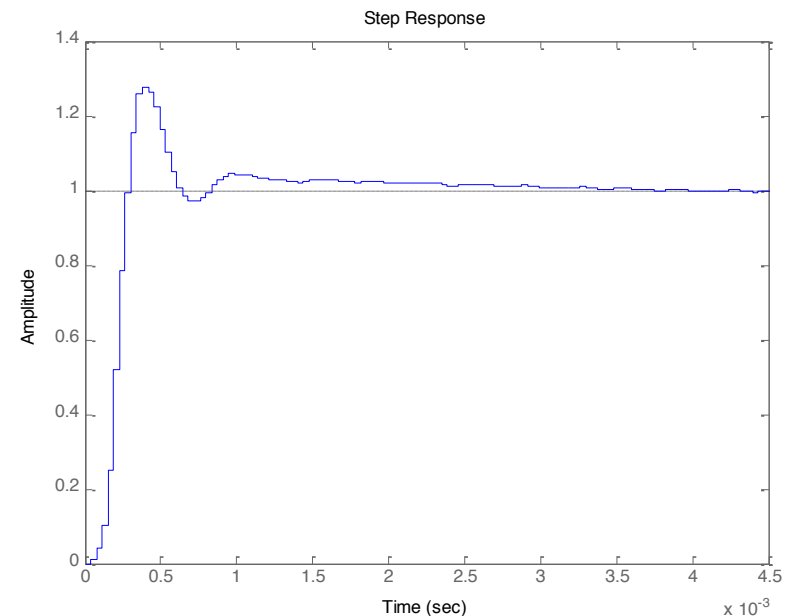
# #10 Bandwidth and rise time: practical application

Step response of a high-order closed-loop system



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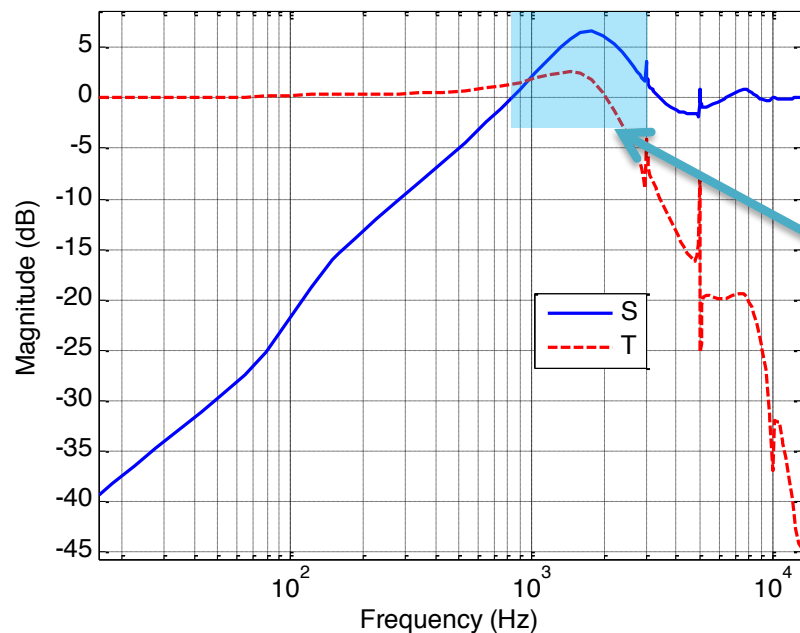
Step response of a high-order closed-loop system



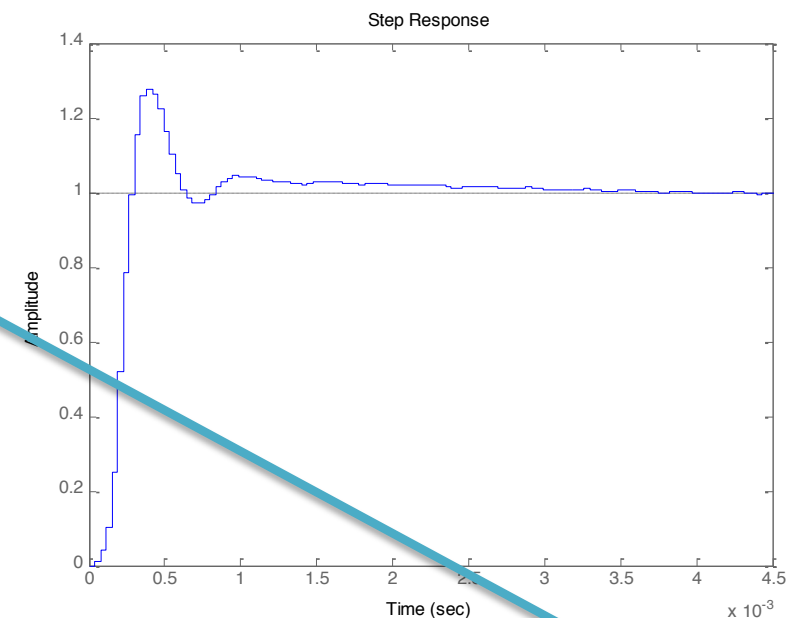
$$\text{Bandwidth} \approx \frac{2}{0.25 \times 10^{-3} \times 2} = 1273 \text{ Hz}$$

# #10 Bandwidth and rise time: practical application

Actual system  
frequency response

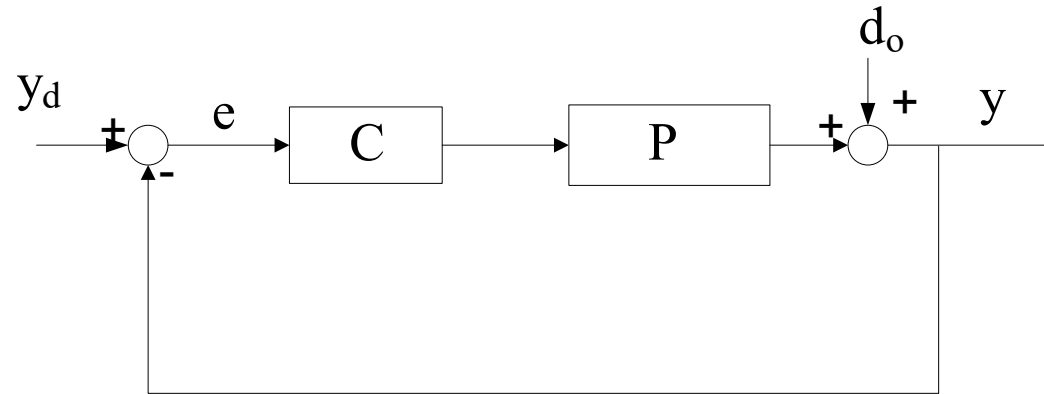


Step response of a high-order  
closed-loop system



$$\text{Bandwidth} \approx \frac{2}{0.25 \times 10^{-3} \times 2} = 1273 \text{ Hz}$$

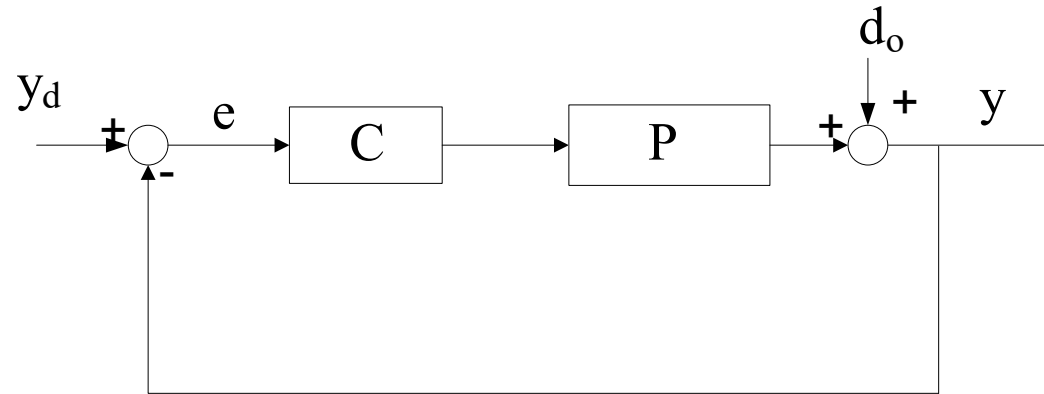
# Sampling-time selection



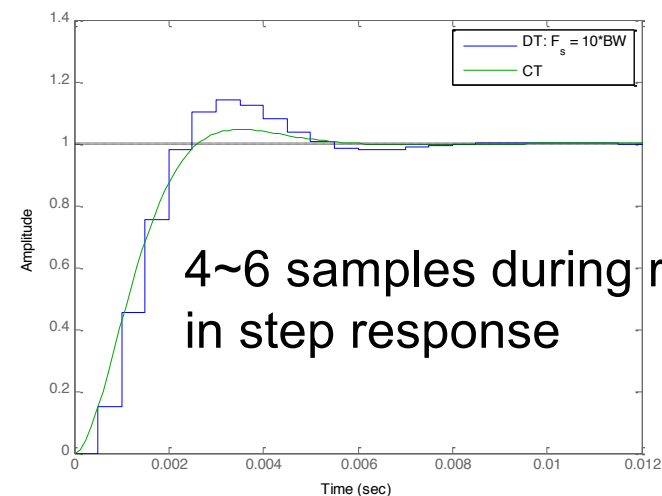
- Rule of thumb:
  - Sampling frequency  $\omega_s$        $10 \sim 20$  bandwidth (in Hz)



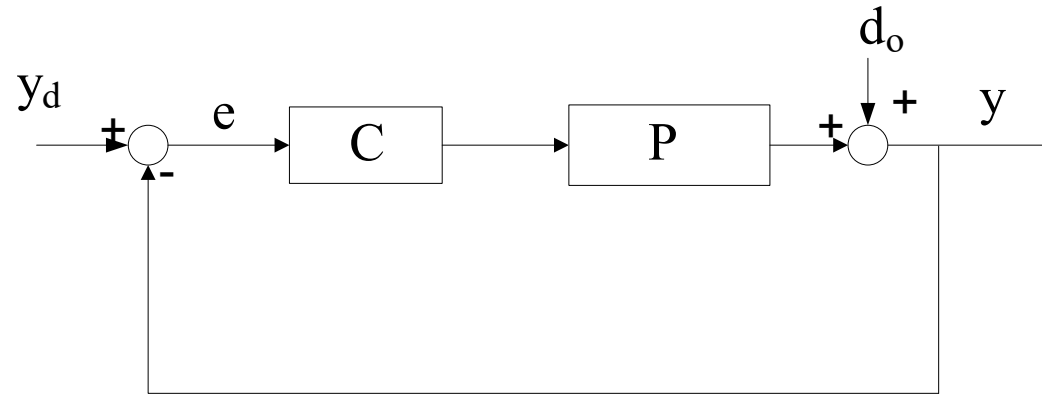
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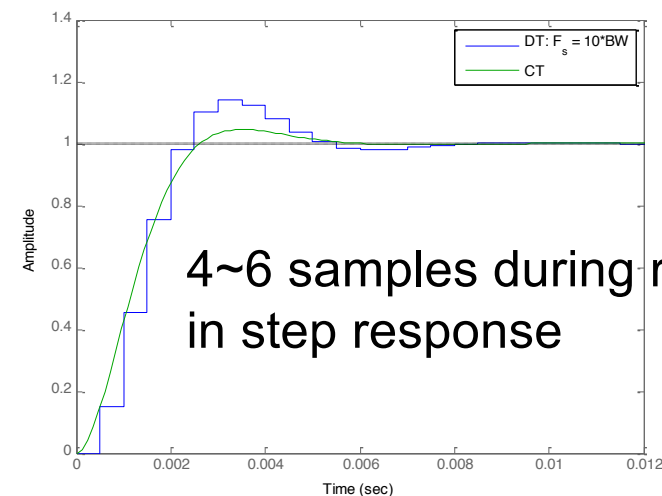
# Sampling-time selection



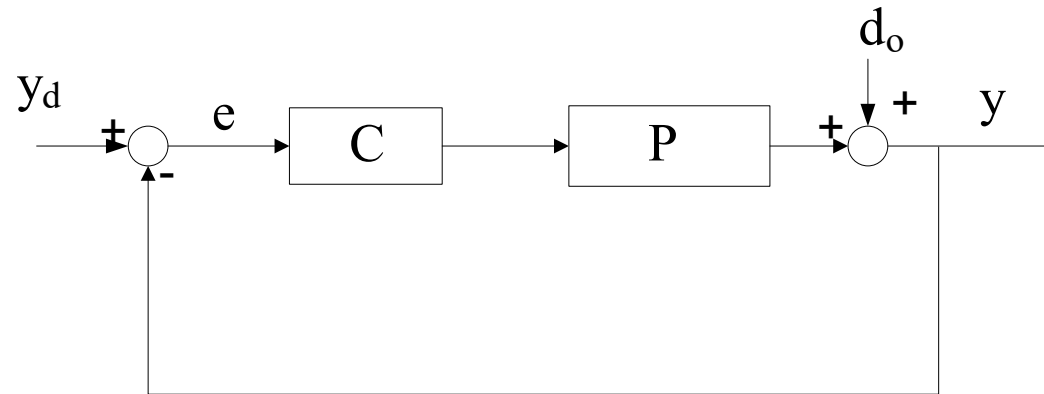
Intuition: 20 = the number of letters in “sampling frequencies”

- Rule of thumb:
  - Sampling frequency

10 ~ 20 bandwidth (in Hz)



# #11 Sampling-time selection: example



Example:

$$P = k$$

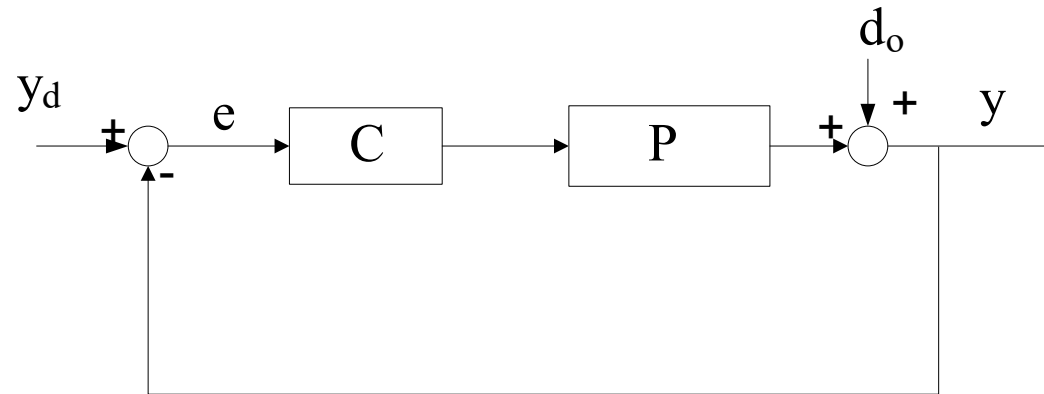
$$C = \frac{s^2 + 2\zeta_n \omega_n s}{s^2 + 2\zeta_n \omega_n s + \omega_n^2} \frac{1}{k}$$



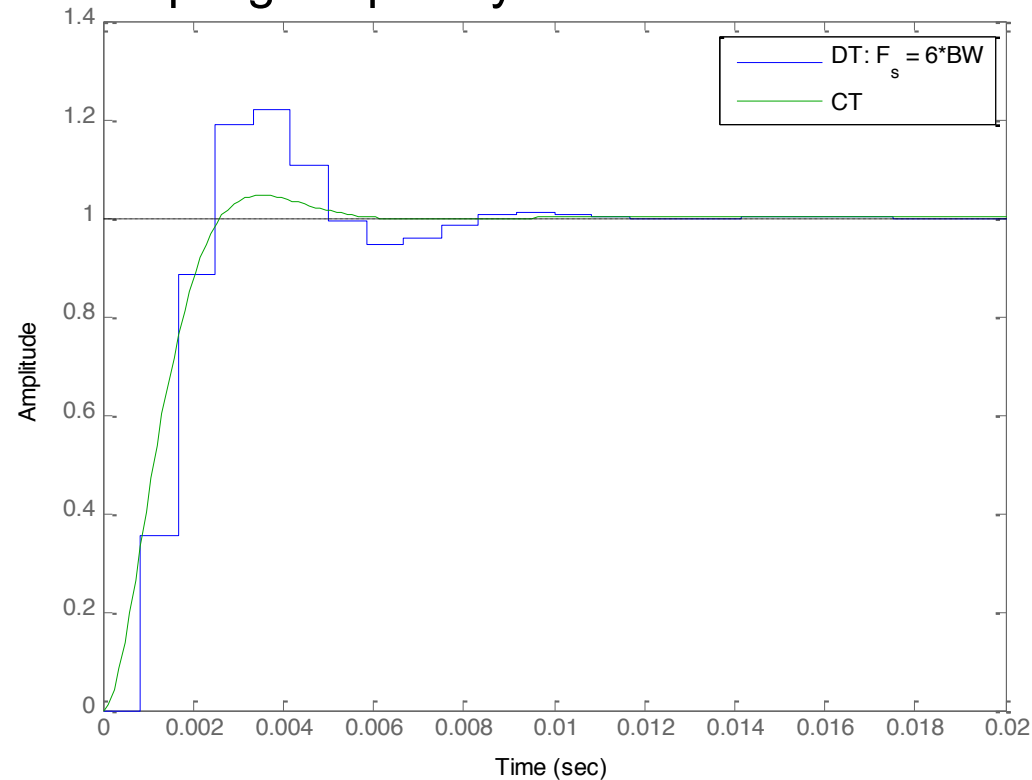
$$S = \frac{1}{1 + PC} = \frac{s^2 + 2\zeta_n \omega_n s}{s^2 + 2\zeta_n \omega_n s + \omega_n^2}$$

$$T = 1 \circ S = \frac{\omega_n^2}{s^2 + 2\zeta_n \omega_n s + \omega_n^2}$$

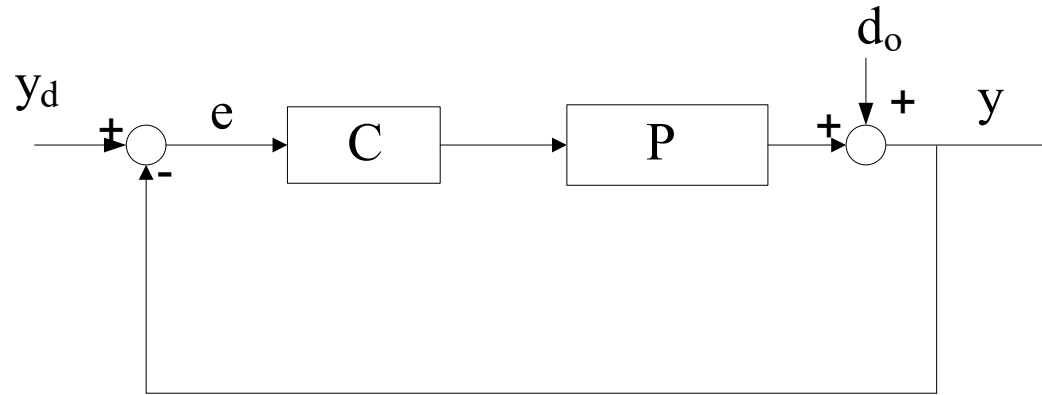
# #11 Sampling-time selection: example



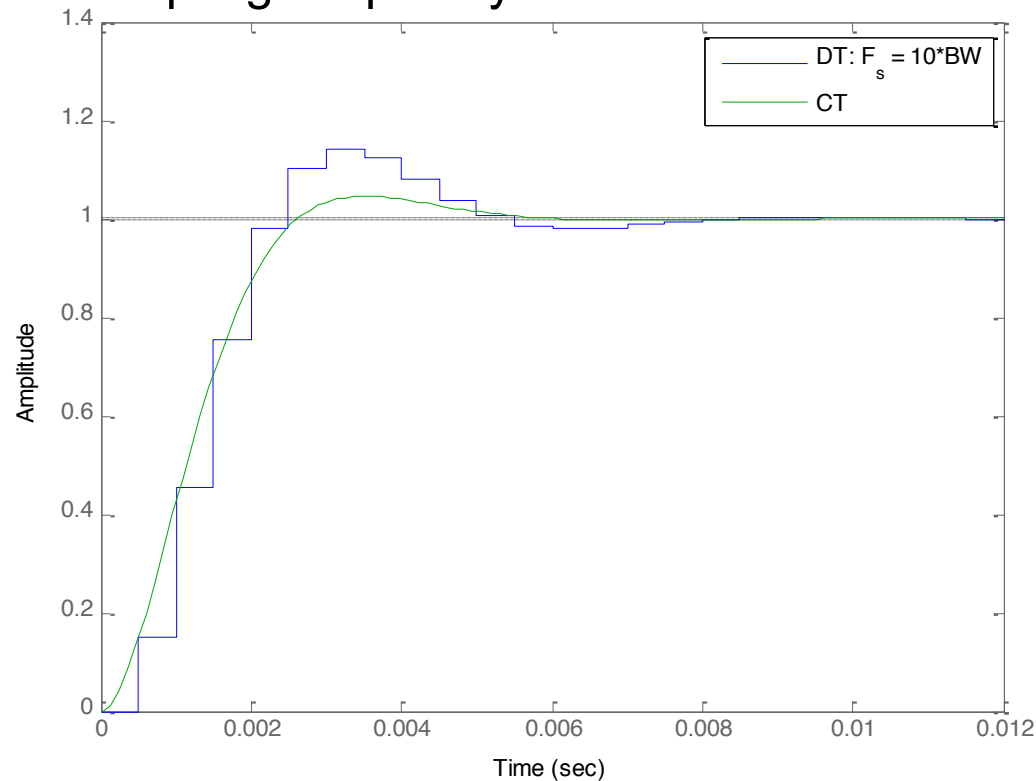
Sampling frequency = 6 x bandwidth



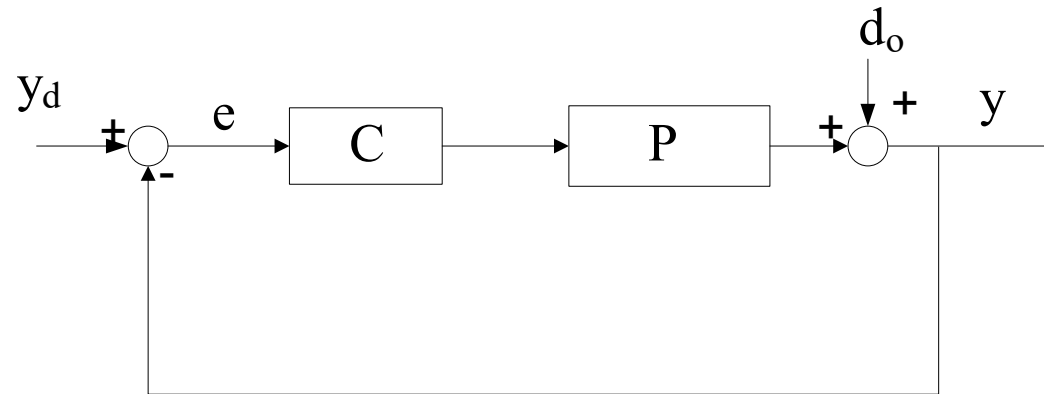
# #11 Sampling-time selection: example



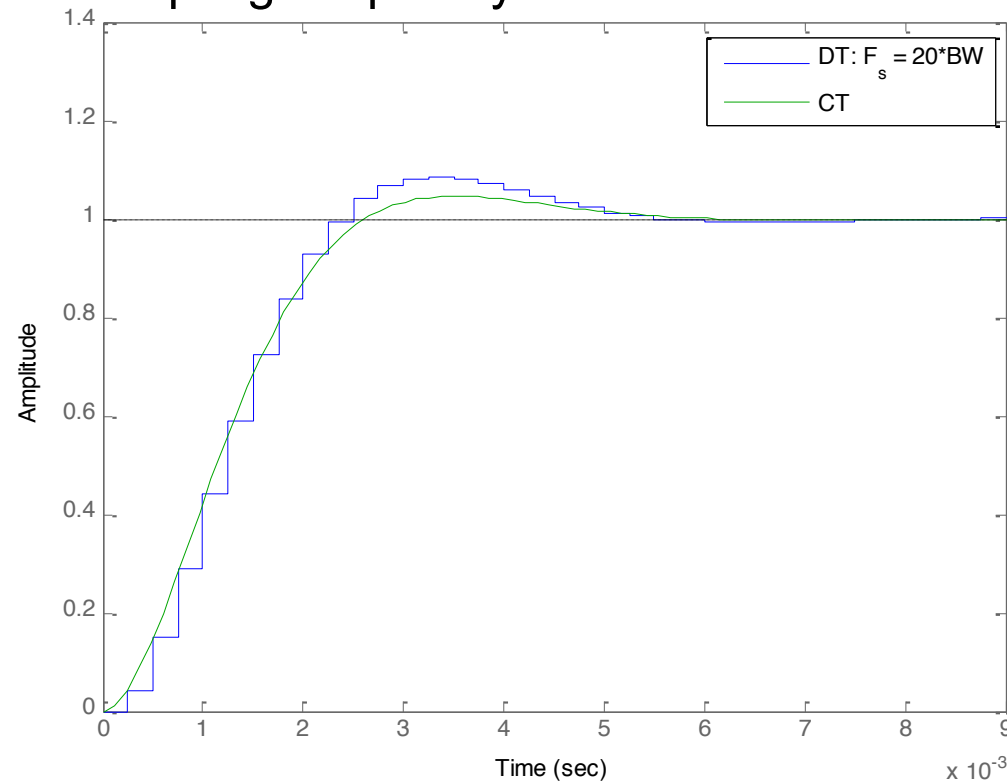
Sampling frequency = 10 x bandwidth



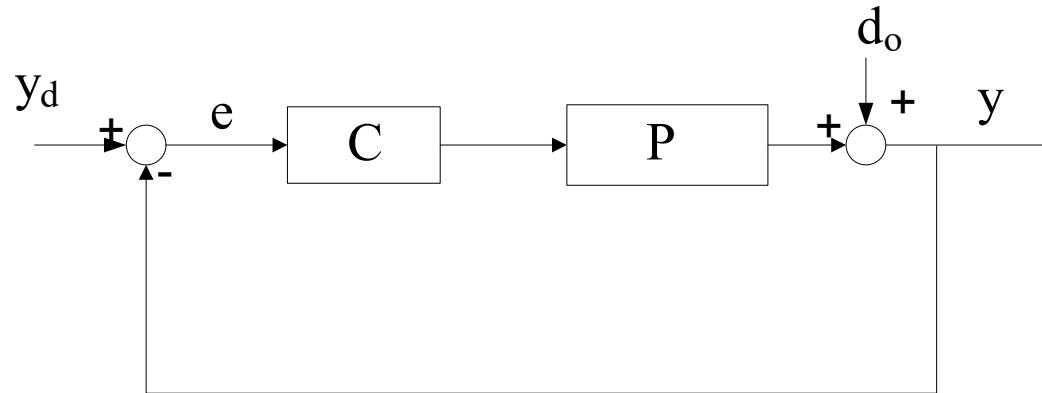
# #11 Sampling-time selection: example



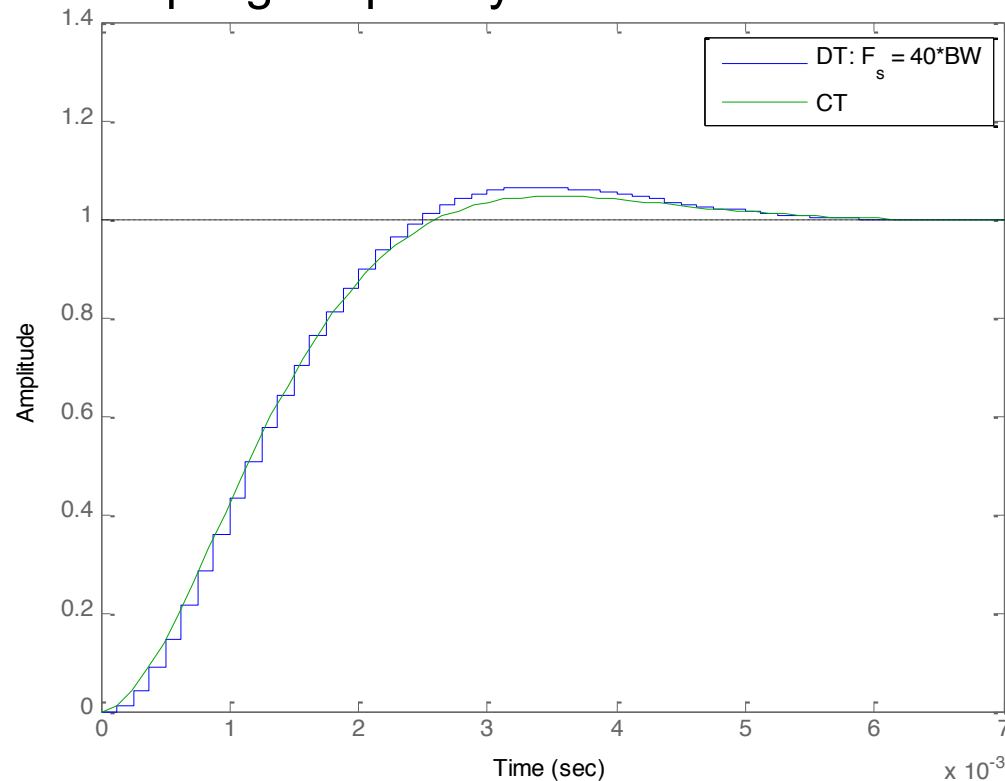
Sampling frequency = 20 x bandwidth



# #11 Sampling-time selection: example



Sampling frequency = 40 x bandwidth



# Related active research field

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- Flexible loop shaping
- Vibration rejection and motion control
- MIMO loop shaping
- Delay compensation
- Adaptive control
- Nonlinear control and breaking the waterbed effect